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#### WASHINGTON UNIVERSITY IN ST. LOUIS

Division of Biology & Biomedical Sciences Computational and Molecular Biophysics

Dissertation Examination Committee: Jay Ponder, Chair Kathleen Hall Alex Holehouse Janice Robertson Andrea Soranno

A Quantum Physics-Based Force Field for Biomolecular Simulation by Roseane dos Reis Silva

> A dissertation presented to Washington University in St. Louis in partial fulfillment of the requirements for the degree of Doctor of Philosophy

> > December 2023 St. Louis, Missouri

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Roseane dos Reis Silva

Washington University in St. Louis

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#### ABSTRACT OF DISSERTATION

#### A Quantum Physics-Based Force Field for Biomolecular Simulation

by

Roseane dos Reis Silva

Doctor of Philosophy in Biology & Biomedical Sciences Computational and Molecular Biophysics Washington University in St. Louis, 2023

Professor Jay Ponder, Chair

This dissertation explores the development of a physics-based force field meticulously tailored to guide molecular dynamics simulations of biomolecules. At its core, the Hydrogen-like Intermolecular Polarizable Potential (HIPPO) force field emerges as an apex of achievement, devised to refine the precision of short-range intermolecular interactions. HIPPO's inception marks a profound stride towards heightened realism in molecular simulations, anchored in Quantum Physics theory and fortified by state-of-the-art Quantum Chemistry calculations. This force field's efficacy is attested by its systematic application in constructing models featuring diverse organic molecules, from water to benzene, and those with motifs resembling proteins and nucleic acids. HIPPO achieves an accuracy of 1 kcal/mol for each of its energy components of electrostatic, induction, repulsion, and dispersion when compared against ab initio Symmetry Adapted Perturbation Theory calculations while exhibiting striking conformity with an array of experimental bulk phase properties. HIPPO performs this without imposing a significant computational burden, thus positioning it comparably to the widely used AMOEBA force field.

### **Chapter 1.** Introduction

Throughout the past three decades, the world has experienced a true revolution in research and using computers and computational tools for many aspects of our lives. Amongst the many promises the advances in computational power have brought, the one where it can aid the cure of many long-standing human diseases is of utmost interest and importance to society.

Many possibilities exist of how such a goal can be achieved. From large-scale studies of human genetics and the application of tools to help understand inner patterns to the prediction of protein structure from sequence to the development of new chemical compounds and beyond. Those are all areas where the computational revolution has had a profound impact. And it continues to allow us to explore science and help us tackle complex problems we have yet to answer, like how to better and faster create new drugs to treat human diseases.

Molecular simulations are at the core of solving this problem and many others. It combines our centuries of Mathematics, Physics, Chemistry, and Biology knowledge into computer code. It allows us to ask questions about the behavior of biological systems at an atomic level. Although its early development started almost a century ago, the research into adequately performing such simulations is still ongoing. And the recent advances in computational power have allowed us to explore more complex models that were almost impossible a few decades ago.

In the pursuit of predicting the dynamic behaviors and interactions of biological molecules, the field of biophysics faces the formidable challenge of applying foundational physical principles to complex, large systems. The Hydrogen-like Intermolecular Polarizable Potential (HIPPO) force field emerges as a pivotal atomistic approach to address this challenge. HIPPO dissects the intermolecular potential energy within biomolecular interactions into discrete and meaningful components—electrostatics, polarization, dispersion, and exchange-repulsion. Each of these components was derived using Quantum Physics principles, bridging the gap there exists in classical force field potentials when it comes to the description of atomic interactions.

The present dissertation unfolds the development of a physics-driven force field tailored for the simulation of biomolecules. The HIPPO force field emerges as an achievement, meticulously designed to enhance the precision of short-range intermolecular interactions in large systems. Anchored in Quantum Physics theory and underpinned by cutting-edge Quantum Chemistry calculations, HIPPO's creation represents a profound step towards realism in molecular modeling. As a testament to its efficacy, I have methodically employed this force field to construct models encompassing diverse organic molecules, including water, benzene, and numerous counterparts adorned with protein and nucleic acid-like motifs. By integrating its functional form into molecular dynamics simulations, I will show that HIPPO achieves an impressive accuracy within 1 kcal/mol for each energy component, benchmarked against quantum calculations. Moreover, it shows close agreement with various experimental bulk phase properties while having comparable computational costs to the widely used AMOEBA force field.

This dissertation chronicles the unveiling of these molecular models, encompassing the intricate dance of intermolecular interactions, the characterization of condensed phase attributes, and the evolution of computational methodologies that empower such pursuits. Within this framework, my work resonates as an emblem of harnessing the capacities of advanced computing to invigorate the fidelity of protein simulations. Among the myriad possibilities, an outcome of profound consequence emerges—the potential to predict drug binding with uncanny precision, thereby edging closer to the expeditious realization of transformative treatments for human diseases.

#### **1.1.** Molecular dynamic simulations and force fields for biomolecules

The field of molecular dynamics simulations in Computational biophysics encompass many areas. It starts with our Quantum Mechanics (QM) knowledge, which has described the atomic inner structure and how atoms interact through the Schrödinger equation. Its results ultimately lead to a thorough description of the forces acting on the system. From there, Newton's second law will tell us how the atoms move, given the forces acting on them, throughout time. The forces and the atomic and electronic structure are dynamic and constantly change with atoms' rearrangement. The result is a time-lapse snapshot showing the trajectory of the atoms in a molecular system. With that information, many questions can be asked, like how tightly small molecules bind to a protein target, what is the most likely protein conformation, how stable a particular crystal is, and so on.

If we could simply use QM for arbitrarily large systems, such as the coronavirus SARS-CoV-2 spike protein bound to the human receptor with over 30 thousand atoms, we would be done and have most of the answers we need. However, *ab initio* calculations (first-principles methods to solve Schrodinger's equation) are extremely expensive and scale poorly with the system's size. That means we can only use high-level *ab initio* methods for very small systems, having at most a few dozen molecules.

The solution to the problem is to approximate QM to the required level of accuracy while being feasible for large-scale simulations. This is achieved in Molecular Mechanics (MM) approaches, where atomic interactions are described by classical empirical potentials often referred to as force fields. Such models will have the same goal to explain how atoms behave and to yield the forces acting on each of them, which can then reveal how molecules move through time. Many different force fields exist at varying approximations, accuracy, and computational cost levels.<sup>1</sup> The most straightforward and least expansive is the Point Charge force field, introduced almost half a century ago and remains the most widely used model for biomolecular simulations.<sup>2</sup>

#### 1.1.1. Point Charge Models

In Quantum Mechanics, atoms are described as having a positively charged nucleus surrounded by orbitals that hold electrons. In Point charge force fields, each atom is approximated as having a fixed-point charge at the atom center, and they interact electrostatically through Coulomb's law. Besides that, a van der Walls empirical term compares QM's equivalent of repulsion and dispersion. Simple harmonic potentials represent the bonded valence interactions.



**Figure 1.1**. The Point Charge Force Field model.<sup>2</sup> A classical, empirical model with intramolecular (shaded blue) and intermolecular (shaded green) energy terms. (Reproduced from Michael Levitt's Nobel lecture)

Point charge models were crucial for the advancement of computational biophysics as they allowed many scientific discoveries in biomolecular systems and have helped establish the field.<sup>3</sup> Numerous protein conformational studies using these models showed how valuable molecular mechanics can be for biology and how much we could gain if the model were expanded. Thanks to the exponential increase in computational resources since the model was first introduced,

simulation accuracy can be significantly improved by switching the atomic description to ones closer to the correct physical representation provided by QM.<sup>4</sup>

One of the main shortcomings of the simple, point charge description is its purely pairwise nature, far from the quantum description. It misses capturing the responses atoms can have to one another, commonly referred to as the many-body effect. Another apparent problem is the poor description of electrostatics. In classical electrostatics, a charge distribution can be expanded in multipole contributions of charge, dipole, quadrupole, etc. Although the charge is usually the most significant contributor to the electrostatics energy, many molecules have important higher-order moments. Although the inclusion of more complex terms can reduce the performance of computer simulations, the inclusion of many-body effects and polarization can significantly improve the calculated potential energy surface of biomolecules.<sup>1, 4, 5</sup> But, with increased computational capabilities, these more complex models can be used in biology to improve accuracy when point charge potentials are incomplete and fail to reproduce some molecular properties.

One practical example of how the incorrect potential can influence the course of a simulation is shown in Figure 1.2. This figure shows the performance of current force fields in predicting the fold of the UUCG RNA tetraloop.<sup>6</sup> The experimental structure of this RNA has been elucidated by NMR (Nuclear Magnetic Resonance). It is known to spend more than 90% of its time in the conformation represented by cluster 5.



*Figure 1.2.* Predicted structures of the UUCG RNA tetraloop. The experimental structure is Cluster 5. No version of the AMBER force field can reproduce the correct conformation. Reproduced from reference<sup>6</sup>.

#### <u>1.1.2.</u> Polarizable models

In molecular mechanics, a polarizable site has the ability to respond to its electrostatic environment. In other words, classical polarization is the effect that other charged atoms have on a given atomic site. This effect can be included in classical models through different routes, and several polarizable force fields exist, either by including fluctuating charges, inducible dipoles, or putting charges on a spring, like the Drude Oscillators.<sup>4</sup>

In this group, the AMOEBA (Atomic Multipole Optimized Energetics for Biomolecular Applications) model provides a straightforward approach to including some of the terms lacking in the simpler model.<sup>7</sup> In AMOEBA, the electrostatic potential was expanded to include permanent

atomic monopole (charge), dipole, and quadrupole moments at each atomic center. Moreover, an explicit polarization term is included via the mutual induction of dipoles at the atomic center. Various models exist for this force field, including water<sup>7</sup>, organic molecules<sup>8</sup>, and nucleic acids<sup>9</sup>.

This force field has been implemented using fast GPUs (Graphics Processing Units), dramatically improving the model's performance, despite its greater complexity compared to point charge models. The advances of GPU and massive parallelization have allowed AMOEBA to be applied to large biological systems, including the SARS-CoV-2 protease.<sup>10</sup>

The present dissertation will present the development of molecular models for a new polarizable potential called HIPPO (Hydrogen-like Intermolecular Polarizable Potential), which was built upon the backbone of the AMOEBA force field. HIPPO, however, abandons the longstanding classical description of atoms as point charges (or points dipoles and quadrupoles.) Instead, it describes the atoms as charge distributions, and almost every term is derived using this notion.

HIPPO falls into the new category of physics-based force fields, where every term has a stronger connection to the rigorous QM equivalent. Moreover, the parametrization procedure involves calibration to high-level *ab initio* calculations before fitting against experimental condensed-phased data. Throughout this dissertation, I will show the advantages of having a force field model that is physically grounded yet capable of reproducing experimental data. This model has a new level of complexity compared to AMOEBA but has suffered no significant reduction in performance, presenting itself as a clear next-generation to the AMOEBA model. Because Quantum Chemistry and *ab initio* methods are at the core of HIPPO's model and inception, the next session will be dedicated to such topics. Then, a review of HIPPO's theoretical development will be provided.

#### **1.2.** Ab initio methods and the parametrization of classical force fields

All classical force fields have parameters to determine for every atom or classes of atoms. In the past, force fields parameters were determined based solely on experimental, condensedphase data. This approach can lead to highly empirical parameters that are not transferable between chemically similar molecules. Another issue there is great reliance in cancellation of errors during fitting, leading to difficult to parametrize models.

Computational hardware advances and ongoing research in Quantum Chemistry have made *ab initio* calculations more accessible<sup>11</sup>, allowing their use for the parametrization of classical models. An example that has been successful in AMOEBA is using QM methods for computing the multipoles on each atom<sup>8</sup>, which HIPPO has inherited. QM intermolecular energies computed between small cluster of molecules are also quantities that can be valuable to parametrization and validation, which can now be used in large scale parametrization of force fields.

However, the fact that classical models must split the total energy of interaction into components, such as electrostatics and van der Waals, is not ideal, since those are not QM observables. A solution to the issue is to assign these quantities theoretically using *ab initio* Energy Decomposition Analysis (EDA) schemes. The most powerful method for determining force field functional form is Symmetry Adapted Perturbation Theory (SAPT), which uses perturbation theory to decompose total intermolecular energy into electrostatics, induction, dispersion, and exchange-repulsion components<sup>12-14</sup>. SAPT was chosen as the basis for developing and parameterizing the HIPPO model<sup>5, 15</sup>, because it provided the ideal blueprint for a first principles physics-based functional form to replace the empirical Point Charge function (Rackers, 2019.)<sup>16</sup>

The largest part of my work in the HIPPO force field was coming up with a way to develop robust, automated, and parallel methods for parametrization. Although the functional form of HIPPO is physically more accurate, it comes with more parameters that needs to be determined. Hence, making this parametrization method and obtaining good parameters are just as essential for the success and usage of the force field in practical applications.

During the parametrization, I have used thousands of SAPT calculations, computing a few of them myself, and they are essential for this dissertation. However, a thorough review of the method is beyond the goal. Important work and reviews of the method are referenced.<sup>12-14</sup>

#### 1.2.1. Symmetry Adapted Perturbation Theory (SAPT)

Intermolecular energies are considered very small when compared to the energy of intramolecular bonds. For this reason, it can be treated as a perturbation to the isolated monomers. To compute and decompose the interaction energy of a dimer, SAPT applies perturbation theory to perform the quantum calculations. As shown in Figure 1.3, the idea is that the Hamiltonian (the quantum operator representing the total energy of a system) of the dimer complex is going to be represented as the sum of the Hamiltonian of the monomers plus a perturbation term representing the intermolecular interaction operator, *V*. The calculation proceeds in orders of perturbation, full derivation in  $^{16}$ .



Figure 1.3. SAPT approach to intermolecular energy decomposition for two monomers A and B.

Internal energy: solving the equation using only the  $H_{AB}$  Hamiltonian yields the internal energy of the monomers, isolated. The zeroth order perturbation is not usually used in SAPT.

Electrostatics: the first order perturbation yields Coulomb's law. It is the electrostatics interaction between the electronic charge densities of monomers A and B, in their original state.

$$E_1 = \iint \rho_A \frac{1}{r} \rho_B \, d\nu^2 \tag{1.1}$$

Induction: the second order and higher perturbations gives the induction, which is the deformation of one monomer charge density in response to the other one.

$$E_2(ind) = E_2(ind, B \to A) + E_2(ind, A \to B)$$
(1.2)

Dispersion: the second order perturbation has a "left-over" part, which is due to the interaction between the mutually perturbed charge density of the monomers. It is the instantaneous response of the charge density to the correlated changes in the other monomer density.

$$E_2(disp) = E_2 + E_2(ind)$$
(1.3)

Repulsion: the last term on the SAPT decomposition is less straightforward than the other ones. It is called exchange-repulsion and it arises from the application of Pauli's exclusion principle requirement that all electronic wavefunctions are antisymmetric. The wavefunctions coming from the perturbations were not antisymmetric, and SAPT applies a method to symmetrize those wave functions and then recalculate each of the previous components. The repulsion term is then the difference between the energies computed using the antisymmetric versus originally symmetric wavefunctions.

$$E_{exch} = \sum_{i=0}^{2} E_{i}^{SAPT} - E_{i}$$
(1.4)

The SAPT calculations can be performed with different numbers of perturbations<sup>17</sup>, starting with the zeroth order, which provides the sum of the internal energy of the monomers; the first order perturbation yields electrostatic, referred to as SAPT0; higher orders will provide dispersion and induction. All the calculations I performed used SAPT2+, with the aug-cc-pVTZ bases set.

#### 1.2.2. Coupled Cluster methods for total intermolecular energy

SAPT was the main *ab initio* method for parametrization of the components of HIPPO force field of electrostatics, induction, dispersion and repulsion. However, the total energy of the interaction was often fitted against the highest-level calculation available. In many occasions, the highest-level calculation was the SAPT total energy (the sum of its components). But, for many cases, a total intermolecular energy computed with the *ab initio* method called CCSD(T) (Coupled Cluster Singles Doubles with perturbative (Triples))<sup>18</sup> excitations is available. In these cases, the energy components were fit to SAPT references, whereas the total energy was fit to the CCSD(T) total, considered one of the gold standard method for non-covalent interactions. These references usually came from the published databases of intermolecular energy of dimer systems.

#### **1.3. Quantum Chemistry databases**

The calibration of parameters within the HIPPO force field involves aligning them with high-level quantum data, a process that demands computationally intensive calculations. Consequently, leveraging published databases to access required data for parameterization is essential. In the construction of the models showcased in this dissertation, three key databases were used: S101x7<sup>19</sup>, the Non-Covalent Interactions Atlas<sup>20-23</sup> (NCIA), and the DES370k<sup>24</sup> databases.

#### <u>1.3.1.</u> <u>The S101x7 database</u>

This database contains 101 dimers involving hydrogen, carbon, nitrogen, oxygen, phosphorus, sulfur, fluorine, chlorine, and bromine. The molecules selected covers common chemical space found in organic and biological systems. It was specifically designed to capture the so-called charge penetration effect missing in force fields modeling atoms as points, including the AMOEBA force field, which uses point multipoles.<sup>19</sup> An illustrative representation of this set is shown in **Figure 1.4**.



*Figure 1.4.* Schematic representation of the dimers in the S101 Database. The arrows connecting the molecules indicates a dimer; the "/2" designation indicates a homodimer; the "/+(-)" notation indicates the presence of both neutral and charged species to the molecule. Reproduced from reference<sup>19</sup>.

This was the initial set used on HIPPO's parametrization and allowed for validation and theoretical calibration of the potential. In this dissertation the molecules included in databases are treated aren't treated separately. They were added to a larger dataset of molecules, and all quantum information available for each molecule across different databases were condensed in one reference set. This is also true for the other QM databases. The notation 'S101x7' shall be used to refer to data coming from this particular set.

#### 1.3.2. Non-Covalent Interactions Atlas (NCIA)

The Non-Covalent Interactions Atlas<sup>20-23</sup> project provides a wide range of non-covalent intermolecular interactions with benchmark energy computed using advanced quantum chemical methods. This is a large dataset encompassing common organic elements, and investigating particular kinds of interactions, like sigma-holes, dispersion-drive systems, hydrogen bonding, etc. This project is even more remarkable considering it provides 10 or 5 points of the dissociation curve for the dimers at the highest level of quantum calculation available. The total intermolecular energies are computed using the coupled-cluster singles and doubles with perturbative triples [CCSD(T)] method

The NCIA data is available at their webpage (*nciatlas.org*) where it is subdivided into different categories of interactions. The sets I have used for my project are listed below.

a. *SH250x10*, sigma-hole interactions. This dataset includes molecules involving bonds of the elements chlorine, bromine, iodine, sulfur, selenium, phosphorus and arsenic. These specific non-covalent interactions result from the existence of a sigma-hole, a region of positive electrostatic potential on an otherwise electronegative atom.<sup>23</sup> For this work, I have excluded the molecules where Selenium and Arsenic were present.

This dataset is being used for validation of the HIPPO parametrization procedures, since it involves various heterodimers not used during fitting of parameters.

- b. *R739x5*, repulsive contacts in an extended chemical space. This data set focuses on repulsive contacts in molecular complexes, covering organic molecules, sulfur, phosphorus, and halogens.<sup>20</sup> This set was crucial for the development of HIPPO, since data on conformations far from the global minima are not usually available.
- c. *HB375x10*, hydrogen-bonding in organic molecules. This dataset offers a collection of dimers with hydrogen bonds of OH, NH and CH groups with oxygen and nitrogen, plus a control group of complexes of the same molecules without H-bonds.<sup>22</sup> Perhaps the most important interaction in biomolecular systems, hydrogen bonds were extensively evaluated in HIPPO using this database, proving its natural ability to capture such interactions in many configurations.
- d. *HB300SPXx10*, hydrogen bonding extended to sulfur, phosphorus and halogens. As the name suggests, this database is an extension of the original hydrogen-bonding *HB375x10* database.<sup>21</sup>

These four databases will be often presented as the target for the intermolecular energies HIPPO. The legend of plots will use the names just provided, *SH250x10*, *R739x5*, *HB375x10*, and *HB300SPXx10*.

#### 1.3.3. DES370k database

The DES370k dataset contains interaction energies for more than 370 thousand of dimer geometries computed using CCSD(T).<sup>24</sup> It contains almost four thousand distinct dimer pairs, covering a wide chemical space and types of non-covalent interactions. Besides providing total

14

interaction energies, this database also provides SAPT0<sup>17</sup> calculations for several of the conformations.

#### **1.4.** A database for organic liquids

The parametrization of HIPPO using organic liquid experimental data drew inspiration from Caleman et al.'s publication<sup>25</sup> that assesses the efficacy of classical models in replicating condensed phase properties. This publication, along with its accompanying database, enables a direct comparison between HIPPO models and prevalent point charge models.

In this study, a comprehensive evaluation of classical force fields with respect to their ability to replicate condensed phase properties of organic liquids is presented. Several key properties are considered, including density, enthalpy of vaporization, heat capacities, surface tension, isothermal compressibility, volumetric expansion coefficient, and dielectric constant. The aim was to provide a benchmark for assessing the performance and accuracy of force fields used in molecular simulations of organic compounds. By doing so, this work provided valuable insights into the strengths and limitations of the evaluated models, which was useful for guiding HIPPO in the direction of addressing shortcomings of current models. All of the 146 molecules included in this database were used.

#### **1.5. HIPPO: Hydrogen-like Intermolecular Polarizable Potential**

The standard biomolecular simulation model for over three decades has been the point charge force field. This model has been successful in folding proteins and reproducing enzymeinhibitor binding interactions. However, it has been found that this standard model is missing some key physics. The HIPPO model, on the other hand, is a new class of force field that includes the most relevant and important physics from the start. It is derived and parameterized to explicitly reproduce the *ab initio* energy components from Symmetry Adapted Perturbation Theory (SAPT). The HIPPO model introduces a model electron density around every atom, departing from the atoms-as-points model of the standard force field. The HIPPO model offers several improvements over conventional models. It is able to reproduce each separate component of the intermolecular energy relative to SAPT within chemical accuracy. The inclusion of a charge density model in the HIPPO model solves the longstanding "charge penetration problem" in molecular modeling. The polarization model in the HIPPO model yields better molecular polarizabilities than leading polarizable force fields. The dispersion functional form produces a damping function with true physical meaning. The exchange-repulsion describes the anisotropy of halogen bonding with drug molecules more accurately than any alternative force field. Overall, our HIPPO model works naturally for simulating water and a variety of other organic molecules, as the results of my work will show.

The HIPPO model is a new class of force field that includes important physics from the start and is derived and parameterized to reproduce *ab initio* energy components. It offers improvements over conventional models in terms of reproducing intermolecular energy components, solving the charge penetration problem, and accurately describing polarization, dispersion, and exchange-repulsion effects.

The first chapter will have a deeper introduction to the model and its parameters.

#### 1.6. Structure of this dissertation

This opening chapter has provided an overview of the critical importance and challenges associated with molecular simulations. Within this context, a brief background on force fields and quantum data was presented. Central to the discussion aws an introduction to the HIPPO model, emphasizing its significance and objectives in addressing current challenges in the field.

Drawing its core content from our inaugural publication on the subject<sup>15</sup>, Chapter 2 offers a detailed introduction to the HIPPO force field. A specific focus is given to the development and validation of the water model nested within the HIPPO framework. The outcomes and implications of these findings are critically discussed in light of existing knowledge in the broader scientific community.

Chapter 3 delves deeply into the benzene model, spotlighting its pivotal role as a foundational organic molecule. It will provide insights into the model's development, its validation process, and potential applications. Additionally, this chapter provides a sneak peek into our soon-to-be-released publication centered on this topic.

In Chapter 4, the challenges associated with parametrizing force fields are introduced. To address these challenges, I detail the software tools I developed, designed to automate the HIPPO parametrization process. Beyond parametrization, the analytical utilities crafted for improved simulation analysis are expounded upon. The chapter concludes with a reflection on potential enhancements and the future trajectory of the software.

Chapter 5 ventures into the diverse range of organic molecules that I have parameterized using the HIPPO model. A meticulous presentation of results is provided, highlighting the challenges faced, the solutions derived, and how these findings compare with pre-existing models and force fields.

Taking a forward-looking stance, the final Chapter 6 embarks on an exploration of the forthcoming projects envisioned for the HIPPO model. Noteworthy discussions encompass the

envisaged expansion of the parametrization tool, especially its symbiosis with machine learning-

driven force fields, and preliminary insights into the creation of a protein force field under the

HIPPO umbrella. The chapter wraps up by pondering the potential challenges ahead and strategies

earmarked to navigate them.

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### **Chapter 2. The HIPPO Force Field and Water Model**

This chapter will provide a complete description of the HIPPO model and how it stands in the realm of current force fields. The work encapsulates my initial two years as a force field developer, a journey filled with challenges and growth. During this period, I honed my skills in graphics card programming to enhance the model's speed and laid the foundational groundwork for the force field's parametrization procedure. While perfecting the model required numerous iterations and patience, the outcome is a testament to the attainability of a swift and precise biomolecular force field.

#### **2.1. Introduction**

Water is perhaps the most studied of all molecules, both experimentally and theoretically. In addition to its obvious importance for life on Earth, water is of interest due to: (1) its unique physical properties, including a density maximum near 4°C with normal ice being less dense than the liquid, (2) its ability to solvate a wide range of disparate chemical species, (3) the great variety of its solid-phase crystal forms and richness of its phase diagram, and (4) its paradigmatic hydrogen bonding interaction and the related hydrophobic effect. The first atom-based water potential available as a quantitative model dates back nearly a century to the work of Bernal and Fowler.<sup>1</sup> The ST2 model of Rahman and Stillinger,<sup>2</sup> among other models from that period, was suitable for use in some of the initial molecular dynamics (MD) simulations. During the early 1980s, the TIPS<sup>3</sup> and SPC<sup>4</sup> families of water potentials were developed, and they are still used in present day modeling projects. Since that time, a large number of additional water models have been proposed for use in simulation, ranging from coarse-grained empirical functions that represent several molecules by a single-site particle,<sup>5, 6</sup> to detailed density functional theory-based (DFT) MD calculations,<sup>7</sup> to massive simulations using machine-learned potentials.<sup>8</sup>

Here we propose a new water model near the intersection of empirical models fit to reproduce macroscopic properties, and *ab initio* models derived entirely from first-principles physics. This new model, referred to as HIPPO for Hydrogen-like Intermolecular Polarizable POtential, is derived directly from a model electron density obtained from *ab initio* results and electronic structure theory, but then parameterized to improve agreement with target experimental data. As such, the HIPPO water model provides a computationally efficient form for use in large-scale simulations, while allowing for analysis and decomposition in terms of physically validated energetic components.

In one sense, this new model is a natural extension of previous polarizable force fields. In particular, it extends the logic that has made the AMOEBA force field successful.<sup>9, 10</sup> The main advance of AMOEBA was to show that intermolecular interactions at medium range cannot always be handled through cancellation of errors, as they are in point charge force fields.<sup>11</sup> This insight motivated the inclusion of dipole polarization and atom-centered multipoles into the model. Much recent work, however, shows that despite AMOEBA's more elaborate functional form, it still relies on significant error cancellation at short range. The archetypal example of this behavior is the p-stacking interaction, exemplified by the benzene dimer.<sup>12, 13</sup> Studies of this system have shown that despite its atomic multipole and polarization terms, AMOEBA exhibits some of the same short-range problems as simpler force fields. A principal aim of the HIPPO model is to reduce this kind of reliance on error compensation at short range.

The way in which HIPPO achieves this aim, however, makes it more than a simple extension of AMOEBA. Much of the short-range error in force fields is due to their reliance on point approximations and the lack of an explicit charge density. In the p-stacking case, for example, the error in the electrostatic interaction is given a widely adopted name: charge penetration.

Analogous errors occur in other force field components, but they all arise from the same inappropriate density treatment.

HIPPO addresses this problem directly by including a description of the electron density explicitly in the model. It is far from the first empirical potential to include a model for the density; other models, most notably the Gaussian Electrostatic Model (GEM),<sup>14-17</sup> have made use of explicit charge densities. However, HIPPO is the first force field to use an electron density model in constructing each component of the total potential. As we will detail in the Theory section, every non-valence term derives its form from charge densities and the interactions between them. This distinction makes HIPPO a new class of density-based model.

The choice of density-based form is not arbitrary, as HIPPO follows from Symmetry Adapted Perturbation Theory (SAPT) quantum energy decomposition analysis.<sup>18, 19</sup> SAPT divides the total interaction energy of a system into four physically meaningful components: electrostatics, polarization, Pauli repulsion and dispersion. Importantly and as its name implies, SAPT does this through the use of perturbation theory. The base, or unperturbed state, is represented by isolated molecules, and the energy components are computed as perturbations from that state as two molecules are allowed to interact. This perturbation theory logic lends itself well to classical approximation. As is detailed in previous work, each HIPPO term uses the atomic electron density model to construct a classical equivalent of the corresponding SAPT term.<sup>20-22</sup> In this way, HIPPO is not just parameterized against SAPT components; it can itself be considered a classical approximation of SAPT.

Conceptually, one might be tempted to assume the elaborate functional form of HIPPO would lead to a large increase in computational cost over similar polarizable models. This, however, misjudges the nature of the complexity in the underlying model. Atomic charge densities

only overlap at short range, and the highest cost additions to HIPPO are restricted to the relatively few interactions in that regime. In this way, HIPPO is able to employ a more complex functional form while maintaining a computational cost roughly equal to that of other polarizable force fields.

The following sections provide: (1) a unified summary of the theoretical underpinnings of the portions the HIPPO force field needed for a water model, (2) a description of the computational and simulation methodologies used, (3) HIPPO results compared against quantum mechanical and experimental data for gas phase clusters, liquid water and ice, and (4) discussion of strengths and limitations of the HIPPO model and the suitability of SAPT as a framework for force field development.

#### 2.2. Theory

In the HIPPO force field, every atom is represented by two components: a model valence electron density and a core point charge. The atomic electron density, illustrated in Figure 2.1, emulates that of a hydrogen-like atom,

$$\rho_{HIPPO} = \frac{Q\zeta^3}{8\pi} e^{-\zeta r} + Z \,\delta(r) \tag{1}$$

where Q is the valence charge of the atom, Z is the core charge,  $\zeta$  controls the width of the electron density, and d is the Kronecker delta function. The HIPPO density also includes consistent higherorder atomic dipole and quadrupole terms for describing anisotropy. This model density is used to derive all four intermolecular energy terms that compose the HIPPO force field,

$$U_{HIPPO} = U_{electrostatic} + U_{induction} + U_{dispersion} + U_{Pauli\ repulsion} \ . \tag{2}$$
The general forms and derivations of these terms have been detailed in several references <sup>20, 21, 22</sup> describing the piecewise development of the model. To provide a unified picture, we present here a comprehensive definition of each term.



*Figure 2.1.* Schematic of a HIPPO atom. The blue shaded area represents the valence electron density, and the red point represents the point core charge.

*Electrostatic Energy.* Like its progenitor, the AMOEBA force field, the HIPPO electrostatic term is anisotropic, utilizing atomic multipole moments through the quadrupole. Since each atom in the model is represented by a core charge and a smeared density, the pairwise Coulomb interaction has four components. The HIPPO electrostatic energy is defined as,

$$U_{electrostatic}^{HIPPO} = \sum_{i>j} Z_i T_{ij} Z_j + Z_i \boldsymbol{T}_{ij}^* \vec{M}_j + Z_j \boldsymbol{T}_{ji}^* \vec{M}_i + \vec{M}_i \boldsymbol{T}_{ij}^{overlap} \vec{M}_j$$
(3a)

$$\vec{M} = \left( Q, \begin{bmatrix} \mu_x, \mu_y, \mu_z \end{bmatrix}, \begin{bmatrix} \Theta_{xx} & \Theta_{xy} & \Theta_{xz} \\ \Theta_{yx} & \Theta_{yy} & \Theta_{yz} \\ \Theta_{zx} & \Theta_{zy} & \Theta_{zz} \end{bmatrix} \right)$$
(3b)

$$T_{ij} = \frac{1}{r_{ij}} \tag{3c}$$

$$\boldsymbol{T}_{ij}^* = \begin{bmatrix} 1 \quad \nabla \quad \nabla^2 \end{bmatrix} \left( \frac{1}{r_{ij}} f_{ij}^{damp} (r_{ij}) \right)$$
(3d)

$$\boldsymbol{T_{ij}^{overlap}} = \begin{bmatrix} 1 & \nabla & \nabla^2 \\ \nabla & \nabla^2 & \nabla^3 \\ \nabla^2 & \nabla^3 & \nabla^4 \end{bmatrix} \left( \frac{1}{r_{ij}} f_{ij}^{overlap}(r_{ij}) \right)$$
(3e)

where the first term represents the core-core repulsion, the second and third terms represent the core-density attractions and the fourth term represents the density-density repulsion. The M vector contains the multipole moments (charge, dipole and traceless quadrupole) and Q and Z represent the core and density charges constrained to satisfy the relation for the total atomic partial charge  $q_i = Z_i + Q_i$ . The *f* <sup>damp</sup> and *f* <sup>overlap</sup> terms in equations 3d and 3e are of critical importance. They result directly from the electrostatic potential generated by the model density,

$$V(r) = \frac{Q}{r} \left[ 1 - \left( 1 + \frac{1}{2} \zeta r \right) e^{-\zeta r} \right]$$
(4)

This gives the core-density attractions,

$$U_{core-density} = Z_i V_j(r_{ij}) = Z_i \left(\frac{1}{r_{ij}} f_{ij}^{damp}(r_{ij})\right) q_j$$
(5a)

$$f_{ij}^{damp}(r_{ij}) = 1 - \left(1 + \frac{1}{2}\zeta_j r_{ij}\right)e^{-\zeta_j r_{ij}}$$
(5b)

yielding the "one-center" damping factor that goes into T <sup>\*</sup>. The density–density repulsion is given by

$$U_{density-density} = \frac{1}{2} \left[ \int \rho_i(\mathbf{r}) V_j(\mathbf{r}) dv + \int \rho_j(\mathbf{r}) V_i(\mathbf{r}) dv \right] = q_i \left( \frac{1}{r_{ij}} f_{ij}^{overlap}(r_{ij}) \right) q_j \quad (6a)$$

$$f_{ij}^{overlap}(r_{ij}) = \begin{cases} 1 - \left(1 + \frac{11}{16}\zeta r_{ij} + \frac{3}{16}(\zeta r_{ij})^2 + \frac{1}{48}(\zeta r_{ij})^3\right)e^{-\zeta r_{ij}}, & \zeta_i = \zeta_j \\ 1 - A^2\left(1 + 2B + \frac{\zeta_i}{2}r_{ij}\right)e^{-\zeta_i r_{ij}} - B^2\left(1 + 2A + \frac{\zeta_j}{2}r_{ij}\right)e^{-\zeta_j r_{ij}}, & \zeta_i \neq \zeta_j \end{cases}$$
(6b)

with 
$$B = \frac{\zeta_i^2}{\zeta_i^2 - \zeta_j^2}$$
 and  $A = \frac{\zeta_j^2}{\zeta_j^2 - \zeta_i^2}$ , (6c)

where the integrals are evaluated according to the method of Coulson.<sup>23</sup> The  $f^{overlap}$  term is the "two-center" damping factor necessary to compute the fourth term of the HIPPO electrostatic potential energy. The terms necessary for higher-order multipole interactions are obtained by successive gradient operations applied to each of the damping factors as specified in equations 3d and 3e. In the interest of clarity, the explicit equations for all orders of the multipole interaction energy are enumerated in Appendix A. In the limit of large a, both damping factors tend to unity and the undamped point multipole interaction energy is recovered. In practice, the use of finite densities remedies the well-documented charge penetration problem of electrostatics.<sup>13, 24-29</sup> In total, the HIPPO electrostatic model has five parameters per atom: a core charge Z, a valence charge Q, a dipole moment *m*, a quadrupole moment Q, and a "charge penetration" damping parameter  $\zeta$ .

*Induction Energy.* In addition to the permanent core charge and density-based multipoles, HIPPO includes a point inducible dipole at every atomic site. The induction energy of the model is defined as,

$$U_{induction}^{HIPPO} = \sum_{i} \frac{1}{2} \vec{\mu}_{i}^{ind} \vec{F}_{i}^{perm} - \sum_{i>j} \varepsilon_{i} e^{-\eta_{j} r_{ij}} + \varepsilon_{j} e^{-\eta_{i} r_{ij}}$$
(7)

where the first term represents the polarization energy of the induced dipoles interacting with the permanent electric field and the second term represents a small pairwise exponential charge transfer function. The polarization term is the source of many-body energy in the force field. The induced dipoles are determined by solving the system of linear equations,

$$\mu = \alpha (F^{perm} + F^{ind}) \tag{8}$$

where the vectors are defined as  $m = [m_1, m_2, m_3, ..., m_n]$  and similarly for  $F^{perm}$  (the field due to the permanent multipoles),  $F^{ind}$  (the field due to the induced dipoles) and a (the atomic polarizabilities). The permanent and induced electric fields are calculated in the same manner, with the same parameters, as described in the previous section. In this way, the electric fields for the polarization model are completely consistent with the permanent electrostatics portion of the model. For completeness, the full equations describing polarization are detailed in Appendix B. The only additional parameter necessary for the polarization model is the atomic polarizability of each atom, denoted by a. Finally, the charge transfer function requires two parameters per atom: a prefactor e and an atom-based damping factor h.<sup>30</sup>

*Dispersion.* The dispersion interaction between atoms arises from the interaction energy of correlated, instantaneous induced dipole moments. In the point approximation, this gives the canonical  $1/r^6$  dependence associated with London dispersion.<sup>31</sup> Because the HIPPO model represents valence electrons as densities, the functional dependence is somewhat modified. The dispersion energy between two atoms with instantaneous induced dipoles, *m<sub>i</sub>* and *m<sub>j</sub>*, is found by solving Schrödinger's equation,

$$\frac{1}{M}\frac{\delta^2\Psi}{\delta z_i^2} + \frac{1}{M}\frac{\delta^2\Psi}{\delta z_j^2} + \frac{2}{\hbar}\left(E - \frac{1}{2}kz_i^2 - \frac{1}{2}kz_j^2 - U_{dipole-dipole}\right)\Psi = 0$$
(9)

where, for the case of correlated, parallel dipoles,

$$U_{dipole-dipole} = \mu_i \left( \nabla^2 \left( \frac{1}{r_{ij}} f_{ij}^{overlap}(r_{ij}) \right) \right) \mu_j = \frac{\mu_i \mu_j}{r^3} \lambda_3^{overlap} - \frac{3(\mu_i r)(\mu_j r)}{r^5} \lambda_5^{overlap}$$
$$= \frac{\mu_i \mu_j}{r^3} \left( 3\lambda_5^{overlap} - \lambda_3^{overlap} \right) = \frac{\mu_i \mu_j}{r^3} f_{damp}^{dispersion} .$$
(10)

The damping factors,  $l_3$  and  $l_5$ , that define  $f_{damp}$  for dispersion are derived from the action of the gradient operator and are identical to those for the dipole-dipole interaction energy as defined in Appendix A. Solving the Schrödinger equation from equation 9 yields,

$$E = \frac{1}{2}\hbar(\omega_1 + \omega_2) \tag{11}$$

$$\omega_1 = \omega_0 \sqrt{1 - \frac{2Q^2}{r^3 k} f_{damp}^{dispersion}} , \quad \omega_2 = \omega_0 \sqrt{1 + \frac{2Q^2}{r^3 k} f_{damp}^{dispersion}} .$$
(12)

This energy expression can be effectively approximated with a binomial expansion,

$$\sqrt{1+x} = 1 + \frac{1}{2}x - \frac{1}{8}x^2 + \dots$$
(13)

and the total energy thus becomes,

$$E = \hbar\omega_0 - \frac{Q^4 \hbar\omega_0}{2r^6 k^2} + \cdots$$
 (14)

Subtracting the energy of two infinitely separated dipoles ( $\hbar\omega_0$ ) and substituting the parameter  $C_6$ 

for  $\frac{Q^2 \sqrt{\hbar \omega_0}}{\sqrt{2}k}$  gives the pairwise dispersion energy,

$$U_{dispersion}^{HIPPO} = -\sum_{i < j} \frac{C_6^i C_6^j}{r^6} \left( f_{damp}^{dispersion} \right)_{ij}^2 .$$
(15)

It is well known that accurate modeling of the dispersion energy at short range requires the use of a damping function.<sup>32-41</sup> HIPPO provides a non-empirical damping function derived from the

dipole density-dipole density interaction. The model requires only one  $C_6$  parameter per atom since the parameters for the damping function are fixed at their electrostatic model values.

*Pauli Repulsion.* The final element of the HIPPO model is a density-based, multipolar model for Pauli Repulsion. Pauli repulsion is a consequence of the rearrangement of electron density that occurs when the Pauli exclusion principle is applied to electron densities of two unperturbed interacting molecules.<sup>42-49</sup> In previous work, we show that the primary change in electron density, relative to the unperturbed reference state, is an evacuation of electron density from the internuclear region.<sup>22</sup> The energy associated with this accumulation of charge in the internuclear region is proportional to

$$U_{Pauli\ repulsion} \propto \frac{S^2}{R}$$
 (16a)

$$S = \int \phi_i \phi_j d\nu \tag{16b}$$

where *S* is the overlap integral between the atomic orbitals on i and j, and R is the internuclear distance. To obtain suitable quantities to implement this model, we use the ansatz

$$\rho = \phi^* \phi \tag{17}$$

to define real, atomic pseudo-orbitals as:

$$\phi = \sqrt{\rho} = \sqrt{\frac{Q\zeta^3}{8\pi}} e^{\frac{-\zeta r}{2}} . \tag{18}$$

These pseudo-orbitals define the charge-charge portion of the overlap integral,

$$S = \int \phi_i \phi_j dv = \sqrt{Q_i Q_j \zeta_i^3 \zeta_j^3} \left[ \frac{1}{2X^3 R} \left( \zeta_i (RX - 2\zeta_j) e^{\frac{-\zeta_j R}{2}} + \zeta_j (RX + 2\zeta_i) e^{\frac{-\zeta_i R}{2}} \right) \right]$$
(19)

with

$$X = \left(\frac{\zeta_i}{2}\right)^2 - \left(\frac{\zeta_j}{2}\right)^2 \; .$$

From the bracket term, we can define

$$f_{exp}^{repulsion}(R) = \begin{cases} \frac{1}{\zeta^{3}} \left( 1 + \frac{\zeta R}{2} + \frac{1}{3} \left( \frac{\zeta R}{2} \right)^{2} \right) e^{\frac{-\zeta R}{2}}, & \zeta_{i} = \zeta_{j} \\ \frac{1}{2X^{3}R} \left[ \zeta_{i} \left( RX - 2\zeta_{j} \right) e^{\frac{-\zeta_{j}R}{2}} + \zeta_{j} \left( RX + 2\zeta_{i} \right) e^{\frac{-\zeta_{i}R}{2}} \right], & \zeta_{i} \neq \zeta_{j} \end{cases}$$
(20)

This allows writing  $S^2$  in the familiar Coulombic form,

$$\frac{S_{charge-charge}^2}{R} = Q_i T_{pauli} Q_j \tag{21}$$

with

$$T_{pauli} = \frac{\zeta_i^3 \zeta_j^3}{R} \left( f_{exp}^{repulsion} \right)^2 \tag{22}$$

where  $T_{pauli}$  (and, in turn,  $S^2$ ) is dominated at short range by the exponential  $f^{repulsion}$  term.

The anisotropy of the HIPPO repulsion model is obtained through its use of atomic multipole moments. Because  $S^2$  has a clearly Coulombic form, we can include higher-order terms in the same manner as for electrostatics,

$$\frac{S_{total}^2}{R} = \sum_{i>j} \vec{M}_i \boldsymbol{T}_{ij}^{repulsion} \vec{M}_j$$
(23a)

where

$$\vec{M} = \left( Q, [\mu_x, \mu_y, \mu_z], \begin{bmatrix} \Theta_{xx} & \Theta_{xy} & \Theta_{xz} \\ \Theta_{yx} & \Theta_{yy} & \Theta_{yz} \\ \Theta_{zx} & \Theta_{zy} & \Theta_{zz} \end{bmatrix} \right)$$
(23b)

$$\boldsymbol{T_{ij}^{repulsion}} = \begin{bmatrix} 1 & \nabla & \nabla^2 \\ \nabla & \nabla^2 & \nabla^3 \\ \nabla^2 & \nabla^3 & \nabla^4 \end{bmatrix} (T_{pauli}) .$$
(23c)

The multipole moments used are identical to those from the electrostatics calculation and  $T^{repulsion}$  is a natural generalization of  $T_{pauli}$ . The interpretation here is that just as the charge component of the multipole expansion has a density, so too do the dipole and quadrupole moments. The various multipolar terms described in equation 23 represent the overlaps between the pseudo-orbitals associated with each individual density component. This definition of  $S^2$  allows us to establish an anisotropic repulsion model we call the Multipolar Pauli Repulsion model,

$$U_{Pauli\ repulsion}^{HIPPO} = \sum_{i < j} \frac{K_i K_j}{r_{ij}} S_{total}^2 \quad . \tag{24}$$

A complete derivation of this model is detailed in our previous work.<sup>22</sup> Full equations defining the model as presented here, with higher-order terms included, are presented in Appendix C. The HIPPO repulsion model introduces three parameters per atom: a proportionality constant K, an exponential parameter a, and a valence charge Q. Note that although analogous to their counterparts in the electrostatics derivation, the parameters  $\zeta$  and Q are allowed to differ from their adopted values in the electrostatic energy term.

*Valence Terms.* The HIPPO water model is fully flexible. It includes a bond stretching term and angle bending term, whose functional forms are the same modified harmonic potentials used in AMOEBA<sup>9</sup> and originally taken from work by Allinger on the MM3 force field.<sup>50</sup> Stretchbend and Urey-Bradley coupling terms are not used. HIPPO does include a charge flux term which

couples the atomic partial charges with the H-O stretching motions and the H-O-H angle,<sup>51</sup> and serves to provide a dipole moment derivative surface in better agreement with quantum mechanical calculations.<sup>52</sup> Previous work with the AMOEBA+ force field has shown that this charge flux term correctly reproduces the average increase in the H-O-H angle, from 104.5° to roughly 106°, that occurs when transferring water from gas to liquid phase.<sup>53</sup> The inclusion of this term, with parameters optimized for the HIPPO water model, yields the same correct behavior for the average angle value.

# **2.3. Methods**

*Code Implementation.* HIPPO calculations in this paper were performed with the Tinker Version 8, Tinker-OpenMM, and Tinker9 packages.<sup>54-56</sup> Implementation of HIPPO was undertaken by Josh Rackers and Jay Ponder in Tinker, Joshua Rackers, Zhi Wang and Roseane Silva in Tinker-OpenMM, and Zhi Wang and Roseane Silva in Tinker9. Molecular dynamics simulations data in the paper were performed with Tinker9 on our in-house GPU cluster. All subsequent analysis was performed using Tinker on workstation CPU hardware and Tinker9 on the GPU cluster.

The Tinker9 code is optimized for standard simple partial charge force fields and for the AMOEBA potential, while the HIPPO code is unoptimized. Molecular dynamics benchmarks for three 24051 atoms, 62.23 Å cubic water boxes using current Tinker9 code and an NVIDIA 3070 Ti GPU are as follows: TIP3P, 325.5 ns/day (2.0 fs steps, rigid water via SETTLE); AMOEBA, 29.1 ns/day, and HIPPO 24.6 ns/day (both run with 2.0 fs steps, RESPA multiple time step integrator, SCF induced dipole convergence to 0.00001 Debye RMS). A looser induce dipole convergence of 0.01 D is sufficient for many production calculations, and its use increases the speed of AMOEBA and HIPPO to 43.4 ns/day and 33.6 ns/day, respectively. Based on

comparative timings with CPU code, we estimate that fully optimized Tinker9 HIPPO code will be at least as fast as AMOEBA, and likely about 25% faster.

In order to facilitate model development, our current HIPPO implementation is written for ease of modification instead of for computational speed. First, multipole, polarization and repulsion terms are computed in independent, modular code sections, requiring redundant evaluation of the geometric and interaction terms for dipoles and quadrupoles. Second, the multipole and polarization are directly computed in the global Cartesian coordinate frame, without use of spherical harmonics or prior rotation of pair interactions into quasi-internal frames.<sup>57</sup> Speed advantages for HIPPO compared to AMOEBA include the use of particle mesh Ewald summation (PME) for dispersion interactions,<sup>21</sup> and HIPPO's simpler gradient computation due to its use of unified exclusion and scaling rules for induced dipole and energy calculations.

#### Parameterization Procedure.

### Stage One: Fit to SAPT data

The initial multipole and valence parameters were fit to monomer data. The multipole parameters were obtained using a protocol analogous to that for AMOEBA parameterization<sup>10</sup> and initial bond and angle parameters were taken from AMOEBA. The rest of the initial parameters pertaining to the intermolecular potential were fit exclusively to SAPT data. SAPT2+ reference calculations with an aug-cc-pVDZ basis set were performed on 27 water dimer structures. These structures included seven points on the dissociation curve, ten points on the canonical dimer angular surface, and the ten stationary point dimer structures of Smith, *et al.*<sup>58</sup> Each term of the force field was fit to its corresponding component from the SAPT decomposition. Observations on the quality of the resulting parameters can be found in the discussion section.

#### Stage Two: Constrained Genetic Algorithm Search

The initial parameter set obtained through fitting to SAPT energy components needed further adjustment to better match condensed phase properties. To improve the liquid water properties while keeping the features of the SAPT fitting, we continued optimizing the model by performing a global search in parameter space centered at the initial values. A differential evolution optimizer from the Scipy 1.8 package was used. The objective function of this optimizer has two main components: the energy decomposition of the Smith dimers and the heat of vaporization of water at room temperature.

While this optimizer was generating liquid data, a second function was simultaneously evaluating the liquid properties from each simulation. This function was merely a tool to select simulations with desired properties. The goal was to find simulations with liquid density, heat of vaporization and self-diffusion coefficient within 1% of their experimental values. The search was ended upon generation of five parameter sets satisfying all requirements. One of these sets was chosen as the best to continue the parametrization.

#### Stage Three: Parameter Refinement with ForceBalance

Following the global search in parameter space, we used a least square optimizer to fit a wider range of properties and to guarantee we were at a local minimum in parameter space. For this step, we used the ForceBalance (FB) program.<sup>59</sup> The goal of this final parameterization step was to obtain a model with desired condensed phase properties across a wide range of temperature and pressure.

The distinctive feature of FB is its ability to compute parametric derivatives of condensed phase properties from MD simulations using thermodynamic fluctuation equations. To refine parameters, we set a minimal objective function including experimental densities, enthalpies of vaporization, and dielectric constants over a range of temperatures from 261 K to 373 K. No other condensed phase properties were considered in the fitting procedure.

*Computational Details.* All properties and simulations were obtained using the HIPPO force field as implemented in the Tinker and Tinker9 packages. To compute condensed phase properties, MD simulations of liquid water were performed. Unless otherwise noticed, properties were computed based on simulation of a cubic box of dimension ~50 Å and containing 4,200 water molecules. The thermodynamics properties listed in Table 2.4 were calculated from simulations at constant pressure and temperature. All simulations were performed using the RESPA (Reversible Reference System Propagator Algorithm) integrator coupled with a Monte Carlo barostat<sup>60</sup> and the Bussi thermostat.<sup>61</sup> For FB fitting, each MD simulation ran for 2 ns using a 2.0 fs time step, with a 0.5 ns equilibration phase and 1.5 ns production phase. The energy components of water dimers and clusters were calculated using the ANALYZE program in Tinker.

The temperature dependence of water properties was computed from a total of 40 simulations carried out at atmospheric pressure (1 atm), for temperatures ranging from 248 K to 373 K. Each simulation was started at the experimental density for the respective temperature and ran for at least 20 ns using a 2.0 fs time step; the first 2 ns of the simulations were discarded as equilibration. For temperatures less than 300 K, the production MD was extended by 10 ns to guarantee convergence of properties.

The self-diffusion coefficient was computed following the steps described for the MB-Pol model.<sup>62</sup> We chose to run simulations in ~100 Å cubic boxes with 33,500 water molecules. The larger box size was used to reduce known finite size effects in the calculation of self-diffusion coefficients.<sup>63</sup> We simulated 26 temperatures in total, ranging from 248 K to 373 K. For each

simulation temperature, a box was built such that its density matched the experimental density for that temperature. Then, each simulation box was equilibrated for 0.5 ns in an NPT ensemble at atmospheric pressure. Following equilibration, we ran an additional 1.5 ns trajectory. From this trajectory, thirty different structures were selected, at 50 ns intervals. From those structures, thirty independent NVT trajectories of 100 ps were obtained. Then, we ran 100 ps simulations in an NVE ensemble. The self-diffusion coefficient was computed from each NVE trajectory and averaged over the 30 independent calculations for each temperature.

In order to evaluate finite size effects in computation of the self-diffusion coefficient, we ran additional simulations with different box sizes at room temperature (298 K). Each simulation was run for 4 ns in NVT ensemble, and the self-diffusion coefficient was computed using the final 3.5 ns of data. Five cubic box simulations were performed: 300 water molecules in ~20 Å box, 900 molecules in ~30 Å box, 4,200 molecules in a ~50 Å box, 17,100 molecules in a ~80 Å box, and finally 33,500 molecules in a ~100 Å box.

To calculate the surface tension of liquid water, we first selected four starting structures, at least 100 ps apart, from the production phase of our NPT simulations at different temperatures. Each structure was then simulated for 500 ps in an NVT ensemble. Then the Z-axis of each cubic box was expanded to three times the X-axis and Y-axis dimensions.<sup>64</sup> The final system geometries were slabs with X = Y = -50 Å, and Z = -150 Å, with a vacuum layer along the Z-axis over each side of the slab. Each system was then simulated in the NVT ensemble for 10 ns. The surface tension was calculated from the last 9.5 ns of data using the pressure tensor,<sup>65</sup> which was computed every picosecond. The final surface tension value reported for each temperature is the average of the four independent calculations.

The pressure dependence of the liquid water density was computed from a total of 10 simulations at room temperature (298 K), and with target pressure ranging from 1 atm to 9000 atm. Each simulation was started at the experimental density for the respective pressure and run for 10 ns using a 2.0 fs time step, with the first 2 ns as equilibration. The cubic box size for this set of simulations was ~30 Å with 900 water molecules.

We selected eight ice crystal structures to compute lattice energy and density. Ice energies were computed after energy minimization of the initial structure using a steepest descent algorithm. Each minimized structure was then simulated for 10 ns in the NPT ensemble. The average density of each ice crystal was computed using the last 8 ns of trajectory data. The target temperature and pressure for each simulation were set to the respective values reported for each polymorph crystal structure.

## 2.4. Results

Because both the functional form and parameterization of the HIPPO water model are rooted in quantum mechanics, we set out to test the accuracy of the model against both experimental condensed phase data and *ab initio* calculations. In this section we will move from small to large clusters, starting from the properties of the water monomer and dimers, through successively larger clusters and up to condensed phase. By showing this behavior across scales we hope to demonstrate the power of a first-principles derived potential energy function.

*Parameters.* Full specification of the HIPPO force field water model includes 37 refined parameter values. Explicit values for these parameters with their associated units are provided in the Supporting Information as Table S1. Several of the parameters are highly correlated, such that the effective number of parameter degrees of freedom required for the HIPPO model is lower than

the number of raw parameters. While many of the parameter classes also used in previous AMOEBA-like water models, such as the atomic multipole values on oxygen and hydrogen, adopt similar values in HIPPO, the differences observed are important to the accurate reproduction of many water properties. Finally, where earlier work on individual components of the HIPPO model considered additional molecules,<sup>20-22</sup> the HIPPO water values reported here are in line with periodic trends across these other molecules and atom types.

*Monomer.* The foundation of the HIPPO model is the monomer electron density. The fidelity of the rest of the model relies on an accurate representation of the true electron density of the molecule. Table 2.1 shows that HIPPO reproduces the monomer multipole moments and polarizability of an isolated water molecule with a satisfactory level of agreement.

**Table 2.1**. HIPPO Water Monomer Properties. All calculations performed on experimental, gas phase geometry where the Z-axis is the  $C_2$  axis, the molecule lies in the XZ-plane, and the O atom is along the negative Z-axis.

	Dipole (D)	Quadrupole (B)			Polarizability (Å <sup>-3</sup> )		
	dz	Q <sub>xx</sub>	Qyy	Q <sub>zz</sub>	a <sub>xx</sub>	a <sub>yy</sub>	a <sub>zz</sub>
НІРРО	1.843	2.48	-2.38	-0.10	1.613	1.289	1.362
Experiment	1.855	2.63	-2.50	-0.13	1.528	1.415	1.468

Additionally, HIPPO accurately reproduces the electrostatic potential around the water monomer as illustrated in Figure 2.2. The "Multipole Only" panel shows the signature of the "charge penetration" effect with a large negative error near the molecular surface. The point multipole model systematically underestimates the electrostatic potential at short range. Previous work has shown that including a simple density model can largely eliminate this charge penetration error, and this is clearly true for the HIPPO model. The "HIPPO" panel in Figure 2.2 shows that error in the electrostatic potential at short range is greatly reduced relative to the undamped point multipole model.



*Figure 2.2.* Error in the electrostatic potential: HIPPO vs. point multipoles neglecting charge penetration. The plot on the right shows the error in the electrostatic potential at the van der Waals surface for the undamped point multipole model. The plot on the right shows the same for HIPPO. Both use the same set of multipoles through quadrupole. Values are given in kcal/mol/electron.

*Dimers.* The water dimer potential energy surface is foundational to the overall model because it is the first place where the entire intermolecular energy function comes into play. For HIPPO in particular, this surface is of tremendous importance as the density-based terms of the intermolecular potential energy function are constructed specifically to reproduce dimer intermolecular interactions. Because it has been extensively studied, we have selected three separate "slices" of the dimer potential energy surface on which to evaluate the HIPPO model: the canonical water dimer dissociation curve, the angular dependence of the water dimer hydrogen bond angle, and the ten well-studied stationary points of Smith *et al.*<sup>58</sup> For each of these slices we evaluate the HIPPO model relative to two references. First, we compare the total energies of HIPPO to the total energies from *ab initio* calculations. Second, we compare the components of the HIPPO intermolecular potential energy function to their corresponding components from a SAPT decomposition.

The dissociation curve of the canonical water dimer is an important piece of the dimer potential energy surface because it contains information about the balance between short-range effects like repulsion and charge penetration, and long-range effects such as dispersion and multipole electrostatics. To generate this curve, we took the water-water interaction structures from the S101x7 database.<sup>29</sup> These structures represent the water dimer at points from 0.7 to 1.1 times the equilibrium distance. The results for HIPPO *vs.* the *ab initio* reference data are plotted in Figure 2.3A.



**Figure 2.3.** Energy components for water dimer dissociation curve (A) and "flap angle" degree of freedom (B). HIPPO components are shown in dashed lines and SAPT reference energies are shown in solid. The extent of dissociation is represented by the O-O distance. The "flap angle" is defined as the angle between the O-O vector and the plane of the acceptor water molecule.

The HIPPO total energy matches the SAPT total energy closely throughout the distance range. Even for the closest points, O-O distances that are rarely sampled in ambient water, the agreement is good. This agreement across the range can be attributed to the fidelity with which HIPPO matches the components of the SAPT energy. In particular, the repulsion and electrostatic curves, which point force fields fail to reproduce at short and long range simultaneously, are in excellent agreement throughout the curve. Importantly, HIPPO is able to capture the short-range physics without compromising the long-range behavior.

Another critical aspect of the water dimer potential energy surface is the hydrogen bond angle. To generate structures for this part of the surface we varied the so-called "flap angle" of the canonical water dimer as illustrated in the inset of Figure 3B. The behavior with respect to this angle is important because it contains information about the anisotropy of the water molecule. Work on the AMOEBA force field has shown that anisotropy in the electrostatics vis-a-vis point multipoles helps reproduce the directionality of hydrogen bonding in water as well as other systems. Here we examine the anisotropy of not just the electrostatics, but the other energy components as well. Plotted in Figure 2.3B is the change in total energy, as well as the change in each of the components, as the flap angle of the water dimer is changed from 0° to 90°. The SAPT curves illustrate an interesting phenomenon. While the dispersion and induction components of the intermolecular energy are largely unchanged across the scan, the electrostatics and repulsion components vary dramatically and in opposite directions. In fact, the trends in these two components counterbalance each other. The minimum of the electrostatic curve lies near 70°. However, the optimal hydrogen angle for the water dimer is known to be slightly smaller, around  $60^{\circ}$ .

Figure 2.3B shows that this is nearly entirely due to the countervailing angular dependence of the repulsion curve. It also shows that HIPPO matches the angular dependence of both the electrostatics and repulsion curves well. The anisotropy in the repulsion curve is noteworthy since this is the first force field to include multipolar anisotropic repulsion. This gives a flap angle for the minimized HIPPO water dimer of 63°, near the experimental value of 57°. This underscores the importance of including anisotropy, not just in the electrostatics portion of the force field, but the repulsion as well. Without the angular dependence of the multipolar repulsion model, as is the case in the vast majority of isotropic Lennard-Jones van der Waals functions, the flap angle of the water dimer would be incorrect. Curiously, the original multipole-based AMOEBA model corrected this issue empirically by scaling down the quadrupole moments of each atom by a factor of 0.73, but misdiagnosed the problem. The key to capturing the anisotropy of the potential energy surface of the water dimer seems to be in including anisotropy in the repulsion as well.

The final piece of the dimer potential energy surface we examined is the ten Smith water dimers. These dimers are all stationary points on the water dimer potential energy surface and as such, they form a representative sample of the various dominant dimer configurations in the condensed phase. There are a variety of both hydrogen bonded and non-hydrogen bonded structures in the set, making it a good test of the accuracy of the model with relevant contact geometries beyond the canonical configuration.<sup>66</sup> Fully optimized *ab initio* structures at the MP2/aug-cc-pV5Z level were computed as part of the present study, and are depicted in Figure 2.4. From the geometry of each dimer at the MP2/aug-cc-pV5Z level, we then determined a "gold standard" counterpoise-corrected CCSD(T) total stabilization energy for each dimer compared to the energy of two optimized, separated monomers at the same level of theory.<sup>67</sup> Note that these energies contain the deformation energy of the water monomers upon dimer formation. The

coordinates of the optimized Smith dimers are provided in Supporting Information. Only dimer 1 is a true minimum on the potential energy surface, while the other dimers have one to three negative Hessian eigenvalues.



**Figure 2.4.** Structures of the ten Smith water dimers obtained from full geometry optimization at the MP2/aug-cc-pV5Z level. The dashed lines represent hydrogen-oxygen interactions that are roughly within the distance corresponding to the hydrogen bonding. Dimers 1-3 each contain a single hydrogen bond, and are variations of the global minimum structure 1. Dimers 4-6 contain two hydrogen bonds between a pair of antiparallel O-H bonds. Dimer 7, 9 and 10 have two weaker hydrogen bonds of approximately equal distance provided by a single donor water. Dimer 8 has stacked, displaced molecules with H-H interactions as the closest contacts. Atomic coordinates are provided in Supporting Information.

In Table 2.2, the structures and energetics of the Smith dimers optimized with the HIPPO model are compared against *ab initio* reference data.<sup>66, 68</sup> In addition to previously reported reference energy values, the MP2/aug-cc-pV5Z structures computed here were used to generate CCSD(T)/CBS energies for all ten dimers. The root mean square energy difference between the CCSD(T)/CBS and HIPPO values is 0.129 kcal/mol, and the average structural RMS with all atoms weighted equally is 0.075 Å. Overall, the structural and energetic agreement is excellent. Dimers 4 and 5 exhibit the largest deviation between QM and HIPPO results. In both cases, the

HIPPO optima have lower energies and smaller intermolecular contact distances, perhaps due to a small error in the interaction between antiparallel O–H bonds. The energies of dimers 7 to 10 differ the most between the earlier rigid monomer interaction energies of Tschumper, *et al.*, <sup>66</sup> and the fully flexible values reported by Wang and Bowman<sup>68</sup> or the flexible CCSD(T) values reported here. Unsurprisingly, three of those dimers exhibit the largest deformation energies upon dimer formation. Comparison of HIPPO energies with a limited set of other empirical water models is detailed in Table S2 of the Supporting Information.

**Table 2.2**. Water dimer binding energies for HIPPO compared to ab Initio reference calculations. Dimer geometries were taken from the Supporting Information of reference  $^{69}$ ; Ref 1 energies are from reference  $^{66}$ , and Ref 2 values are from reference  $^{68}$ . Dimer stabilization energies $^{67}$  and total deformation energies at the CCSD(T)/pV5Z level are shown, as are complete basis set (CBS) extrapolated values.<sup>70, 71</sup> HIPPO dimer energies are provided for single point calculations at the CCSD(T)/pV5Z geometry, and for fully optimized HIPPO structures. Also shown are the QM and HIPPO  $R_{0-0}$  dimer distances, the HIPPO structure RMS vs. MP2/aug-cc-pV5Z optima, and the number of negative frequencies ( $\mathbf{n}$ ) for CCSD(T)/pV5Z and HIPPO optima. All energies are in kcal/mol, and the  $R_{0-0}$  distance and HIPPO RMS values are in Angstroms.

Dimer	r Ref 1 Ref 2	CCSD(T)	Doform	CCSD(T)	CCSD(T)	НІРРО	НІРРО	#neg	HIPPO	HIPPO	
Dinici			/pV5Z	Delorm	/CBS	<b>R</b> 0-0	(sngl)	(opt)	n	RMS	Ro-o
1	-4.968	-4.98	-4.956	0.041	-4.967	2.895	-4.917	-4.957	0	0.054	2.884
2	-4.453	-4.45	-4.447	0.038	-4.459	2.905	-4.330	-4.339	1	0.104	2.913
3	-4.418	-4.38	-4.398	0.037	-4.410	2.911	-4.232	-4.238	2	0.017	2.916
4	-4.250	-4.23	-4.262	0.029	-4.281	2.800	-4.378	-4.574	1	0.103	2.756
5	-3.998	-3.97	-4.014	0.032	-4.034	2.771	-3.994	-4.193	1	0.161	2.754
6	-3.957	-3.91	-3.969	0.036	-3.991	2.748	-3.823	-3.913	3	0.044	2.729
7	-3.256	-3.15	-3.157	0.092	-3.168	2.952	-3.090	-3.121	2	0.028	2.917
8	-1.300	-1.46	-1.417	0.035	-1.425	3.325	-1.354	-1.377	3	0.046	3.271
9	-3.047	-3.18	-3.197	0.114	-3.208	3.018	-3.169	-3.184	1	0.031	2.971
10	-2.182	-2.28	-2.275	0.096	-2.286	3.168	-2.278	-2.295	2	0.025	3.118

Further structural and energetic results, comparing HIPPO with *ab initio* results on the ten dimers, are plotted in Figure 2.5. The figure shows two levels of comparison. First, it compares the total interaction energy for each dimer. Along with the HIPPO values, two *ab initio* results are shown. The first is the SAPT total energy at the SAPT2+ level. The second *ab initio* values are the CCSD(T)/CBS results obtained in this work. It is interesting to note there is some disagreement between the SAPT and CCSD(T) results. For some dimers, the SAPT value differs by ~0.5 kcal/mol. This shows that although SAPT2+ is useful for determining individual components of the energy function, it is not a replacement for high-level coupled cluster total energy calculations. Optimized HIPPO dimer structures and energies are in good agreement with the CCSD(T) results for all ten dimers. This indicates an accurate balance between the hydrogen bonded and nonhydrogen bonded configurations. The origin of this balance is illustrated by the second level of comparison in Figure 2.5, the components of the interaction energy. The electrostatics, repulsion, dispersion and induction components of the HIPPO model match the SAPT decomposition in a consistent fashion across the dimer configurations. This demonstrates the agreement in total energies is not coming from cancellation of errors, indicating that a similar agreement should hold for other water dimer configurations outside this set of ten structures.



**Figure 2.5.** Total energies and components for ten water dimer stationary points. HIPPO and SAPT components are shown as colored bars. Although all errors are under 0.5 kcal/mol, these show some compensation on the part of HIPPO between the induction and dispersion components. The black, tan, and grey bars represent the HIPPO, CCSD(T), and SAPT values, respectively. Notably, HIPPO is in better agreement with the CCSD(T) data than SAPT, suggesting that the HIPPO component errors relative to SAPT are within the intrinsic error of the SAPT methodology.

*Larger Clusters.* We next tested the HIPPO model on larger clusters of water ranging from three to twenty molecules. The goal here is to span as much of the gap as possible between gas phase and condensed phase. For these larger clusters, SAPT data becomes difficult to interpret, but there are two types of data relevant to evaluating the HIPPO model. First, we compare total cluster binding energies. This provides a measure of how well the potential energy function performs as water becomes more liquid-like. Second, we compare the many-body energies. The average dipole moment of a water molecule increases steadily upon moving from monomer to dimer to clusters to condensed phase. This implies that in order for any model to achieve agreement with QM data for both clusters and condensed phase, it must include many-body effects. Thus, we compare the many-body energies from *ab initio* calculations with the many-body energies from the classical HIPPO polarization function.

HIPPO compares very well with gold standard CCSD(T) benchmark total energy calculations moving from gas phase dimers toward bulk-like clusters. As shown in Table 2.2 and Table **2.3**, the agreement for structures through the hexamer is within 0.57 kcal/mol on average. Moreover, the relative ranking of unique structures is also quite accurate. For example, HIPPO ranks the eight reference water hexamer structures in the same order as CCSD(T) calculations. Lastly, the HIPPO minima are structurally very similar to the reference QM-optimized structures, indicating the accuracy of the local potential energy landscape.

Unlike pairwise force fields, where the total energy of a system is simply the sum of the energies of every pair of interactions, HIPPO is polarizable. This means that it is designed to reproduce the non-additive portion of intermolecular interactions. To quantify the amount of non-additivity, we compute the three-body energy of a range of different water clusters. The three-body energy is defined as

$$E_{3B} = E_{total} - \sum_{i} \sum_{j} E_{ij} + \sum_{i} E_{i}$$
(25)

where second and third terms represent the sums of the two-body and one-body energies, respectively. The four-body and higher terms are negligible in the case of water.<sup>72</sup> The first test set for three-body energies is the water trimer at a range of intermolecular contact distances. Starting from the structure depicted in the inset of Figure 2.6, the distances  $d_1$  and  $d_2$  were varied systematically. The three-body energy was computed at the MP2 level of theory and compared to the HIPPO three-body energy. Figure 2.6 shows that across the range of distances HIPPO agrees well with the *ab initio* result. Particularly at distances near equilibrium the agreement is very good.



**Figure 2.6.** Three-body energies for water trimer as a function of intermolecular distance. HIPPO is within 1 kcal/mol for near-equilibrium structures. The X-axis values represent  $d_1$  and  $d_2$ , respectively as shown in the inset as percentages of the equilibrium distances. QM data is generated at the MP2/aug-cc-pVTZ level.

**Table 2.3.** Water cluster binding energies (kcal/mol) with HIPPO compared to ab initio calculations. <sup>a</sup> Structures and reference values from reference <sup>73</sup>. <sup>b</sup> Hexamer structures and reference energies from reference <sup>74</sup>.

Cluster	Structure	Reference	HIPPO	HIPPO Minimum	Difference
Trimer <sup>a</sup>		-15.77	-15.417	-15.767	0.00
Tetramer <sup>a</sup>		-27.39	-25.695	-26.685	0.71
Pentamer <sup>a</sup>		-35.90	-32.994	-34.582	1.32
Hexamer <sup>b</sup>	Prism	-45.92	-44.169	-46.145	-0.23
	Cage	-45.67	-43.635	-45.387	0.28
	Bag	-44.30	-41.106	-43.364	0.94
	Chair	-44.12	-40.484	-42.543	1.58
	Book A	-45.20	-42.359	-44.245	0.96
	Book B	-44.90	-42.103	-43.958	0.94
	Boat A	-43.13	-39.576	-41.548	1.58
	Boat B	-43.07	-39.612	-41.555	1.52
Octamer <sup>a</sup>	D <sub>2d</sub>	-73.0	-68.309	-71.547	1.5
	$S_4$	-72.9	-68.253	-71.559	1.3

11-mer <sup>a</sup>	43'4	-104.6	-94.775	-100.232	4.4
	515a	-1040	-93.635	-99.377	4.6
16-mer <sup>a</sup>	AABB	164.1	-155.457	-161.556	2.5
	ABAB	164.2	-155.875	-161.836	2.4
	Antiboat	164.6	-152.799	-159.634	5.0
	Boat A		-152.457	-159.357	5.0
	Boat B	164.2	-152.400	-159.425	4.8
17-mer <sup>a</sup>	552'5	-175.7	-161.740	-169.938	5.8
	Sphere	-175.0	-162.549	-170.681	4.3
				MAD:	
Summary:	Dimer – Hexar	mer		0.57	
	Octamer – 17-	mer		3.8	

This level of agreement illustrates two important points. First, it shows that the HIPPO model is effective in capturing the many-body effect, and thus may perform well across the spectrum from gas to condensed phase. Second, it suggests that the majority of the *ab initio* many-body energy can be classified as polarization. It is well known that other categories of intermolecular interaction such as dispersion, charge transfer and repulsion have many-body components. The data in Figure 2.6 shows that for water, however, these appear to be small. The HIPPO three-body energy is systematically smaller than the *ab initio* result, but only by a small amount. It is only at the closest points, where water rarely accesses in the condensed phase, that it appears that higher-order many-body effects start to be significant.

To assess if the agreement with small-scale *ab initio* many-body results translates to liquid water, we also computed the three-body energy of progressively larger clusters. For water clusters of four to eight molecules, we computed the three-body energy at the MP2 level of theory and compared it against HIPPO results. Figure 2.7 shows the trends seen in the trimer test case hold for larger clusters.



*Figure 2.7.* Three-body energies for water clusters tetramer through octamer. *QM* data is generated at the MP2 level of theory and aug-cc-pVTZ basis set.

Just as in the trimer case, the HIPPO result always slightly underestimates the magnitude of the total *ab initio* three-body energy. This validates the observation from the trimers that manybody effects in higher-order terms appear to stay small as cluster size grows. Additionally, the behavior of the three-body energy with geometry appears to be in good agreement with the reference data. HIPPO correctly predicts the ordering of the amount of three-body energy in the eight water hexamer structures. These structures are picked to be representative of fully hydrated water. It is difficult to estimate what the many-body energy of a full, condensed phase system of water is, but this result for the hexamers suggests that HIPPO may give an adequate representation.

*Liquid Properties.* In addition to accurately modeling *ab initio* data, it is important for a water model to accurately reproduce experimental liquid phase properties as well. We have tested the HIPPO water model on a wide variety of experimental observables at room temperature and ambient pressure and present the results in this section.

Property	HIPPO	Experimental	Abs. Deviation
Density (kg/m <sup>3</sup> )	996.492	997.045 <sup>a</sup>	0.553 (0.06%)
Enthalpy of Vaporization (kJ/mol)	43.806	43.989 <sup>b</sup>	0.183 (0.42%)
Static Dielectric Constant	76.878	78.409 <sup>c</sup>	1.531 (1.95%)
Self-Diffusion Coefficient (10 <sup>-5</sup> cm <sup>2</sup> /s)	2.557	$2.299^{d}$	0.258 (11.22%)
Surface Tension (mJ/m <sup>2</sup> )	74.918	71.99 <sup>e</sup>	2.928 (4.07%)
Second Virial Coefficient (L/mol)	-1.2612	-1.158 <sup>f</sup>	0.103 (8.91%)

*Table 2.4.* Water properties at room temperature (298 K and 1 atm). <sup>*a*</sup> Reference <sup>75</sup>. <sup>*b*</sup> Reference <sup>76</sup>. <sup>*c*</sup> Reference <sup>77</sup>. <sup>*d*</sup> Reference <sup>78</sup>. <sup>*e*</sup> Reference <sup>79</sup>. <sup>*f*</sup> Reference <sup>80</sup>.

The primary thermodynamic and dynamic properties of the HIPPO model are collected in Table 2.4 along with the known experimental values. The density is in excellent agreement with experiment, with an error of less than 0.1%. The heat of vaporization, or the amount of energy required to transfer a water molecule from the liquid phase to the gas phase, is also in excellent agreement with an error relative to experiment of 0.4%. Both of these values were included in the objective function of the parameter refinement step, so good agreement is expected.

Likewise, the dynamic properties of HIPPO water are in close agreement with experiment. The self-diffusion coefficient of water measures how quickly or freely water molecules move in the liquid phase. The predicted diffusion coefficient of HIPPO differs from the experimental value by 11%. This is a reasonable agreement for a quantity that is known to be quite sensitive to details of molecular dynamics simulations. The HIPPO model is also in excellent agreement with the experimental dielectric constant of water. This is also a highly sensitive quantity for molecular dynamics simulations, and the HIPPO prediction is within 2% of the experimental result. The agreement with the experimental dielectric constant indicates that the HIPPO water electrostatic environment is accurate. This is important not just for the properties of water, but for the future use of the HIPPO model solvating small molecules, ions and ultimately biological macromolecules. Lastly, the surface tension, a stress test for how well a water model handles the balance between bulk solution and interfaces, of the HIPPO model is in excellent agreement with experiment. The accuracy in the surface tension suggests that HIPPO will model solvation of both polar and hydrophobic species equally well.

The structural properties of liquid water are also of great interest for both the study of pure water and water as a solvent. As the canonical example of the hydrogen bond and because of its bent shape, liquid water represents a balance between many orientations of water-water interactions. To probe these structural properties, we compared the experimental radial distribution functions and second virial coefficient of water to those predicted by HIPPO.

Plotted in Figure 2.8 are the O-O, O-H, H-H radial distribution functions of water. Panel A in Figure 2.8 shows that the O-O radial distribution function of HIPPO water is in good agreement with experiment. The position of the first peak at 2.785 Å and height at 3.0 is within the experimental uncertainty of the experimental curve. The entire curve lies within the "family" of O-O g(r) curves described by Brookes and Head-Gordon.<sup>81</sup> The O-O g(r) represents the coarse molecular level of structure in liquid water. The close agreement of HIPPO shows that the force field has the correct number of molecules in each solvation shell. At a finer level of detail, the O-H and H-H curves are also in close agreement with experiment. Panels B and C of Figure 2.8 show that the positions of the peaks in these curves agree with experiment. Moreover, the relative heights of the first and second peaks in the O-H and H-H curves correspond closely to the relative heights from the experimental model. This suggests that not only are the correct number of molecules in each solvation shell, but the average orientations of those molecules are in line with reality as well.



*Figure 2.8.* Water radial distribution at 298 K and 1 atm. HIPPO results are shown in green and experimental in black. First peaks of the HIPPO distribution are indicated with dotted green vertical lines. Experimental curves from references <sup>81-83</sup>.

*Temperature and Pressure Dependence.* To stress the water model, we also tested the HIPPO model at a range of temperatures and pressures. This data is included to evaluate how well the HIPPO model performs in a variety of conditions away from room temperature and ambient pressure. We calculated the density, enthalpy of vaporization, heat capacity, dielectric constant, self-diffusion coefficient, thermal expansion coefficient, and isothermal compressibility at temperatures ranging from super-cool up to the boiling point. The same was done for the second virial coefficient. We also calculated density at a range of pressures, up to 10,000 atm. Of these, only the density, enthalpy of vaporization and dielectric constant were included in the fitting procedure. The results are presented in Figure 2.9 to Figure 2.14, and are discussed in detail below.

The temperature dependence of the density of liquid water is unique. At high temperatures, the dependence is intuitive and straightforward: the higher the temperature, the lower the density. At lower temperatures, near the freezing point, however, the correlation is less intuitive. The curve "turns over" and the density starts to decrease as the temperature decreases. This dual dependence leads to the characteristic "temperature of maximum density" of water. Panel A of Figure 2.9 shows that HIPPO reproduces the entirety of this curve with exceptional accuracy. The error relative to experiment is less than 1% for all points on the curve. The HIPPO temperature of maximum density is  $277 \pm 2$  K, which is in near-perfect agreement with the experimental value of 277 K.

The enthalpy of vaporization temperature dependence is simple. As temperature increases, the  $DH_{vap}$  decreases. This matches our intuitive understanding of how much energy it takes to remove a water model from the liquid phase. Panel B of Figure 2.9 shows that HIPPO exhibits this same behavior, but the slope of the curve is slightly steeper than experiment. The result is a near-

perfect enthalpy of vaporization at room temperature with errors of  $\pm$  3% at the respective ends of the tested temperature spectrum.

The heat capacity of the HIPPO water model is plotted in panel D of Figure 2.9. Heat capacity is closely related to the derivative with respect to temperature of the enthalpy of vaporization. Since the slope of the enthalpy of vaporization shown in panel B is largely unchanged over the temperature range, the heat capacity is nearly a constant with respect to temperature. However, since the slope of the HIPPO model for the enthalpy of vaporization in panel B is too steep, the calculated heat of vaporization is noticeably higher than experiment. This difference is the result of a known shortcoming in all classical models of water: the neglect of nuclear quantum effects (NQEs). Rough corrections of 6 cal/mol/K and 2 cal/mol/K have been suggested.<sup>84, 85</sup> The ForceBalance program also implements an NQE correction for the enthalpy of vaporization,<sup>86, 87</sup> and these corrected values are plotted in panel B of Figure 2.9. Analysis of the NQE correction and its ramifications are discussed in greater detail in the Discussion section below.

As a model whose intended future use is the solvation of biological macromolecules, the dielectric constant is of great importance. One of the main practical implications of using a polarizable water model in biomolecular simulations is accurately modeling both water in bulk solvent and isolated water molecules in, for instance, a protein binding pocket. We calculated the dielectric constant of the HIPPO model and the results are plotted in panel A of Figure 2.10. The dielectric constant is notoriously sensitive and difficult to converge. However, the HIPPO model shows good agreement across the range of temperatures. This stands in contrast to most fixed charge water models whose dielectric constants change very little with temperature.<sup>88</sup>

Another typically sensitive property of water models is the self-diffusion coefficient. This property is also important to future biomolecular simulations because it is a contributing factor to

producing accurate timescales for macromolecular dynamics. Plotted in panel B of Figure 2.10 is the self-diffusion coefficient of HIPPO water vs. temperature. It is clear that the overall shape of the temperature dependence curve is correct, with the HIPPO diffusion slightly higher than experiment. The self-diffusion coefficient is a rough measure of the balance of hydrogen bonding vs. other types of intermolecular interactions in water. The agreement of HIPPO with experiment indicates this balance is accurate. Due to the steep rise in diffusion coefficient with temperature, the 11% overestimation by HIPPO at room temperature corresponds to only a small error along the temperature dimension. For example, the computed HIPPO coefficient of  $2.557 \pm 0.026 \times 10^{-5}$ cm<sup>2</sup>/s at 298 K is equivalent to the experimental value at roughly 304 K. Figure 11 shows the dependence of the diffusion coefficient on the reciprocal dimension of the cubic simulation box, 1/L. The variation with box size is in agreement with the well-known correction suggested by Yeh and Hummer.<sup>63</sup> Since the Yeh-Hummer correction depends on the shear viscosity of each model, we feel a diffusion vs. 1/L plot provides the best diffusion estimate at infinite box size for any specific water model. The HIPPO value obtained from Figure 11 is 2.568×10<sup>-5</sup> cm<sup>2</sup>/s at 298 K. which is very close to the average of  $2.557 \times 10^{-5}$  cm<sup>2</sup>/s from multiple 100 Å cubic box simulations.

Finally, we show how the HIPPO water model performs under extreme conditions. Panels C and E show the temperature dependence of the thermal expansion coefficient and isothermal compressibility, respectively. The HIPPO compressibility is higher than the experimental value. This agrees with the pressure dependence of the density shown in Figure 2.13, where the density is greater than predicted for high pressure simulations. Note, however, the units of compressibility are small. Water is very difficult to compress and the HIPPO model of water is only slightly less so. The agreement of the thermal expansion coefficient with experiment is better. Cold water

expands rapidly as it is heated up, but the rate of expansion slows as the temperature increases. HIPPO reproduces this trend, mirroring the behavior seen in the density *vs*. temperature curve.

*Ice Properties.* In addition to liquid properties, we tested the properties of ice crystals. Due to its variety of structures, ice is a stringent test of the intermolecular potential. The intermolecular distances are generally shorter than in liquid water and thus stress the repulsive wall of the model. We computed lattice energies and densities for ten different ice polymorphs across a range of conditions. The HIPPO results are shown against curated experimental data in Table 2.5. Predicted densities are in error by no more than 2.5% and the lattice energies are all within 3% of the experimental values.

**Table 2.5.** Ice properties from HIPPO model compared with experimental density (kg/m<sup>3</sup>) and lattice energy (kcal/mol). <sup>a</sup> Experimental values from reference <sup>89</sup>. <sup>b</sup> Values from the ICE10 data set.<sup>90</sup>

	Density				Lattice Energy			
	HIPPO	Expt <sup>a</sup>	Diff	% Error	HIPPO	Ref <sup>b</sup>	Diff	% Error
Ice XI	949.9	934	15.9	1.7	-13.804	-14.10	0.3	-2.1
Ice Ih	910.8	920	-9.2	-1.0	-13.699	-14.07	0.4	-2.8
Ice IX	1164.8	1194	-29.2	-2.4	-13.769	-13.97	0.2	-1.4
Ice XIV	1316.7	1294	22.7	1.8	-13.360	-13.74	0.4	-2.9
Ice XV	1355.6	1364	-8.4	-0.6	-13.365	-13.48	0.1	-0.8
Ice Ic	951.8	931	20.8	2.2				
Ice Ica	947.2	931	17.2	1.8				
Ice XIII	1279.1	1251	28.1	2.2				
		MAD:	18.9			MAD:	0.3	



**Figure 2.9.** Thermodynamic water properties for the HIPPO model (green) compared to experiment (black) for temperatures from 248 to 373 K at atmospheric pressure (1 atm). (A), (C), (D), (E) experimental values from reference <sup>75</sup>. (B) experimental data from reference <sup>76</sup>.


*Figure 2.10.* Dynamical water properties for the HIPPO model (green) compared to experiment (black) for temperatures from 248 to 373 K at atmospheric pressure (1 atm). (A) experimental values from reference <sup>77</sup>. (B) experimental values taken from references <sup>78, 91, 92</sup>.



*Figure 2.11.* Self-diffusion coefficient vs. cubic box size at 298 K. The extrapolated y-axis intercept, corresponding to the estimated diffusion coefficient at infinite box size, is  $2.568 \times 10^{-5}$  cm<sup>2</sup>/s.



*Figure 2.12.* Surface Tension for the HIPPO model (green) compared to experiment (black) for temperatures from 248 K to 458 K. Experimental values from references <sup>79</sup> and <sup>93</sup>.



*Figure 2.13.* Density of the HIPPO model (green) compared to experiment (black) for pressures from 1 to 9,375 atm at room temperature (298 K). Experimental values from reference <sup>94</sup>.



*Figure 2.14.* Second virial coefficient of the HIPPO water model (green) compared to experiment (black) for temperatures from 298 to 575 K. Experimental values from references <sup>80</sup> and <sup>95</sup>.

# **2.5. Discussion**

*Implications of Parameter Space.* HIPPO is a force field derived from our understanding of how atoms and molecules interact in short range. For this reason, our first goal in building a water model was to guarantee it could accurately reproduce high-level QM calculations for different configurations of water dimers. This is the reason we fit the initial water parameters using the SAPT energy decomposition as a reference for each energy component.

The second and most relevant goal of HIPPO water model is to be appropriate to a variety of MD applications, including solvation of biomolecules. Therefore, the model needs to agree with experimental data available within a small tolerance. The initial parameter set obtained after SAPT fitting did not meet our requirements for the condensed phase properties and led us to continue improving the model.

We chose to perform a constrained global search in parameter space using the repulsion, charge transfer and dispersion parameters of oxygen and hydrogen, centered at their initial values. With the exception of the charge transfer parameters, each parameter was not allowed to vary by any more than 5%. Besides providing improvement of liquid properties, we chose this method because it could give us insight into how the features of the potential energy surface of water dimers related to condensed phase properties with respect to parameter space. Our optimizer was set to only compute liquid properties for parameters that kept the energy of water dimers within an average deviation 0.5 kcal per energy component, compared to the SAPT reference. The flexibility of 0.5 kcal in SAPT component is explained by the fact that SAPT calculations have intrinsic errors compared to gold standard CCSD(T) values. With that requirement, we were able to generate hundreds of water models. This showed we were dealing with a rough potential energy surface and the initial SAPT fitting put the model in a shallow minimum well. Upon computing water properties at room temperature for all the models generated, we selected the one with the smallest combined deviation from condensed phase experimental data and SAPT energy components.

Using the large amount of simulation data generated during parameter optimization, correlation analysis was performed between the energy components of low energy water dimer structures and liquid properties computed for the same set of parameters. Beyond a few obvious exceptions involving repulsion, no clear correlation was seen between calculated liquid properties and dimer total energy or components. Although there is some selection bias in the data, the 0.5 kcal/mol variance permitted for SAPT components should have allowed observation of correlation if it existed. The lack of correlation suggests the model parameter space is rugged. This in turn suggests orders of magnitude more QM dimer and cluster data would be needed to build a completely *ab initio* force field. This suspicion is given credence by the experience of the MB-pol and GEM water models, both of which required thousands of structures to produce well-determined models.<sup>96, 97</sup>

*Limitations of a Classical Model.* By nature of being a classical model, HIPPO has a set of limitations. As illustrated in the Results section, the agreement between experimental and *ab initio* data, while good, is not perfect. These inconsistencies generally arise because of the classical approximations the HIPPO model employs. In this section, we will briefly enumerate some of the most important limitations of the model. We will also rationalize why, despite these limitations, HIPPO is capable of agreement with experiment as good or better than some of the best published water models.

*Nuclear Quantum Effects.* One of the most prominent areas for which the HIPPO water model is in disagreement with experiment is the heat capacity. This discrepancy is rooted in a physical effect that the HIPPO model does not directly address: Nuclear Quantum Effects or NQEs. NQEs show up in a variety of physical attributes of water. An instructive comparison is between H<sub>2</sub>O and D<sub>2</sub>O, where D<sub>2</sub>O is meant to represent "classical" water with significantly less impact from nuclear quantum effects. The density of D<sub>2</sub>O is 0.3% smaller, the dielectric constant is 0.5% smaller, and the enthalpy of vaporization is 3.3% larger than those of H<sub>2</sub>O. These are mostly small effects that have been largely accounted for *via* our parameterization procedure. The heat capacity, however, is different. C<sub>p</sub> at room temperature for D<sub>2</sub>O is 11% larger than that of H<sub>2</sub>O. This difference is too large to be covered by flexibility in parameterization, and furthermore the nature of the difference makes it virtually impossible to do so with a classical model.

The root of all NQEs, but most especially the heat capacity effect, is the treatment of hydrogens as classical oscillators. According to the Born-Oppenheimer approximation, under which conventional molecular dynamics operates, both intra- and intermolecular vibrational modes of hydrogen in the HIPPO model are treated classically. This treatment is essentially incorrect from the standpoint of quantum mechanics, where the vibrations of hydrogen should be

treated at quantum oscillators. The characteristic vibrations of a water molecule lie in the frequency range 1000-4000 cm<sup>-1</sup>. However, at room temperature the amount of available thermal energy,  $k_BT$ , corresponds to a frequency of ~200 cm<sup>-1</sup>. This means that for virtually all of the vibrational modes of hydrogen atoms in water, the spacing between energy levels is much greater than the amount of thermal energy available. At room temperature, corrections of 6 cal mol<sup>-1</sup> K<sup>-1</sup> and 2 cal mol<sup>-1</sup> K<sup>-1</sup> to account for this difference between quantum oscillators and the classical model have been proposed.<sup>84, 98</sup> Moreover, these considerations show that the magnitude of the error caused by imposing a classical model on a quantum system is temperature dependent. As temperature is decreased, vibrational excitation becomes more and more difficult as  $k_BT$  drops. However, when temperature is increased,  $k_BT$  becomes closer to the energy spacing of the hydrogen atom's lowfrequency modes, allowing more vibrational excitation. The upshot of this temperature dependent error is that one should expect a classical water model to exhibit a heat of vaporization that is too high at low temperature and too low at high temperature. This is exactly the behavior seen in the HIPPO water model, giving it a heat capacity slightly higher than experiment.

Of course, the solution to fix this error in the heat capacity is to use a method that goes beyond the Born-Oppenheimer approximation to include NQEs. Other classical models have used methods such as path integral molecular dynamics (PIMD) or ring-polymer molecular dynamics (RPMD) with some success. Application of this methodology to the HIPPO model would be of great interest, given the otherwise high fidelity with experiment.

There are two likely reasons why HIPPO still attains good agreement with experiment despite not including nuclear quantum effects. The first is that for properties besides heat capacity, the impact of NQEs is small. The second reason is that while HIPPO is rooted in *ab initio* EDA calculations, it is not strictly an *ab initio* model. This means that there is some flexibility in

parameterization that has allowed HIPPO to fit H<sub>2</sub>O experimental data without losing fidelity to the SAPT data from which it was originally derived. This flexibility is the driving force behind the parameterization process described in the methods section. In order to include NQEs implicitly, we optimized the initial *ab initio* derived parameters of the water model to reproduce H<sub>2</sub>O liquid properties.

*Many-Body Effects.* The HIPPO model includes many-body effects through its polarization model. This induced dipole model allows for a linear order, classical electrostatic response of each atom to its environment. The results in the "Larger Clusters" section of the Results show that the model captures a majority of the total three-body energy of water clusters. However, there are other many-body effects which the HIPPO model does not include.

The first set of many-body effects excluded from HIPPO are "classical" electrostatic effects. These arise from terms involving higher-order polarizabilities, hyperpolarizabilities or charge transfer. Various water models such as NEMO and the ASP series of Stone and co-workers have included higher-order and hyperpolarizabilities.<sup>99, 100</sup> Similarly, there exist models for many-body charge transfer in water, such as those of Rick<sup>101</sup> as well as the forthcoming SIBFA water model.<sup>102</sup> The distinction between these various terms is not well defined and is presently the subject of intense scrutiny. However, their roots, regardless of nomenclature, are the same. They all describe the response of a molecule's electron density to its electrostatic environment to infinite order. HIPPO includes just the least computationally expensive leading term of the full expansion. Models that include higher-order or hyperpolarizabilities, or charge transfer are attempting to select those additional terms representing the largest additional portion of the full expansion. While HIPPO does include a pairwise charge-transfer term, the decision to not include any of the higher-order many-body effects derives from a simple observation. As shown in Figure 2.7 the missing

part of the HIPPO three-body energy of water clusters is about 0.1 kcal/mol per molecule. This error is an order of magnitude smaller than other errors in the force field relative to *ab initio* results. The comparison indicates why HIPPO is capable of a high degree of agreement with experiment despite neglecting higher-order effects.

Of course, classical effects are not the only thing at play in intermolecular interactions. There exist many-body components to the dispersion and Pauli repulsion components of the intermolecular potential as well. There is a body of work showing that for some systems these quantum many-body effects, particularly many-body dispersion, can be important.<sup>103-105</sup> There are also a number of models available for including these effects in classical potentials.<sup>106-108</sup> However, the computational cost to include these effects for the purposes of the HIPPO model is prohibitive. Moreover, work from the Head-Gordon and co-workers has shown that the magnitude of these quantum many-body effects is insignificant for water-water and water-ion interactions.<sup>72</sup> Because many-body dispersion and repulsion account for less than 1% of the total many-body energy, even for close-contact water clusters, they are neglected by the current HIPPO model.

*How Good is SAPT for Water?* A question one might ask is, "why not fit the HIPPO water model exclusively to SAPT data?" The suggestion in the question certainly has appeal. Fitting exclusively to SAPT would put HIPPO in the category of *"ab initio"* water models. The goal of the HIPPO project, however, is not to recreate any particular level of QM theory; it is to accurately predict experimental thermodynamic results. This is the reason we chose to refine the HIPPO parameters to reproduce the experimental density and heat of vaporization of liquid water. This strategy, however, leaves the HIPPO model in a middle ground that bears some explanation. Why use SAPT if the end result is ultimately fit to experiment?

To answer this question, it is helpful to look at the quality of an alternative "*ab initio*" version of the HIPPO water model. For the purposes of discussion, we will refer to this model as HIPPO-SAPT. Plotted in Figure 2.15 are the room temperature liquid properties of the stage one HIPPO-SAPT water model, fit to SAPT data, not yet refined for any experimental properties. This model is fit exclusively to SAPT2+ data on ~25 water dimer structures. Each of the components was fit individually, as outlined in the methods section. One can see from Figure 2.15 and Table 2.6 that the condensed phase properties of this model at room temperature are not far from the experimental values.



*Figure 2.15.* Water radial distribution function for the HIPPO-SAPT water model before optimization with ForceBalance at 298 K and 1 atm. HIPPO-SAPT results are shown in green and experimental in black. First peaks of the HIPPO-SAPT distribution are indicated with dotted green vertical lines. Experimental curves from references <sup>81-83</sup>.

Property	HIPPO-SAPT	Experiment	Abs. Error (%)
Density (kg/m <sup>3</sup> )	974.195	997.045	22.85 (2.3)
Enthalpy of Vaporization (kJ/mol)	41.194	43.989	2.795 (6.4)
Self-Diffusion Coefficient $(10^{-5} \text{ cm}^2/\text{s})$	2.805	2.230	0.575 (25.8)
Static Dielectric Constant	80.050	78.409	1.641 (2.1)

*Table 2.6. HIPPO-SAPT* water properties at room temperature (298 K and 1 atm).

The radial distribution functions for O-O, O-H, and H-H are all in good agreement with experiment. The dielectric constant is also very close to the experimental value. The model is not perfect, however. There are significant discrepancies in the density, enthalpy of vaporization and self-diffusion coefficient, and the density vs. temperature curve for this model exhibits no maximum. These data indicate the quality of SAPT for water. Within the confines of the SAPT2+ level of theory, with an aug-cc-pVDZ basis set, SAPT is capable of producing a "rough" water model, but not one up to the accuracy of empirical polarizable force fields such as AMOEBA.

Because water is the most important component of any biomolecular force field, the level of accuracy of this SAPT "*ab initio*" force field is not sufficient. The general accuracy of the model from these initial parameters, however, tells us about the utility of using SAPT as a reference. HIPPO is built on a series of successive approximations. The model is fit to SAPT, but SAPT has some measurable error relative to CCSD(T), the so-called gold standard of quantum chemistry.

CCSD(T), despite the title, however, is not perfect either. CCSD(T) uses the Born-Oppenheimer approximation, and as such is missing nuclear quantum effects (NQEs). This means that rather than using SAPT as a hard reference, the HIPPO strategy is instead to use SAPT as a guide. The SAPT data serves to solve the biggest problem in non-ab initio force fields: overdetermination. Requiring that HIPPO satisfy the SAPT components dramatically limits the parameter space available in the refinement phase of parameterization. This means that while it is not an *ab initio* force field, HIPPO is qualitatively different from empirical force fields because it follows the clearly identifiable series of approximations just described.

*Transferability.* Within the confines of any particular functional form - density-based, point-charge or otherwise - there are an infinite number of equally good water models. This is a simple consequence of a problem that is overdetermined by its nature. Unlike the simplest fixed partial charge water models, many advanced or polarizable models have several tunable parameters, but a sparse number of experimental observables to fit against. What makes the HIPPO model unique is that it limits itself to a narrow window of parameter space by insisting that SAPT energy decomposition data be satisfied. This is true not just for water-water SAPT calculations. The final parameters of this water model produce an RMS error on the entire S101x7 database of less than 1.0 kcal/mol per component on average. This means that the relaxation of the parameters to fit liquid properties did not disrupt the backbone of the HIPPO framework. These data suggest that the HIPPO water model will not only reproduce pure water properties well, but also perform well as a solvent. Although yet untested, this natural fit between the water model and the rest of the future force field is important. Recent work has shown that various point charge water models can produce dramatically different results for protein simulations.<sup>109</sup> The emphasis on SAPT in the

HIPPO model gives confidence that this water model will work well with the HIPPO small molecule and macromolecule models currently under development.

### **2.6.** Conclusions

The quality of a water model is a subjective quantity. The utility of a particular model depends upon the kinds of scientific questions one wants to answer. The "best" water model for a job will change depending on whether one wants a rough solvation model or a detailed comparison with spectroscopic values. For bulk phase properties, a number of water models traditionally used in molecular dynamics simulation, as well as more recent models, provide generally similar results. Importantly, however, models sufficiently accurate for homogeneous pure water simulation may not be appropriate to account for solvation by water in heterogeneous environments. **Table 2.7** provides a minimal set of pure liquid properties for a subset of available models, including the HIPPO model described in this work.

**Table 2.7.** Selected properties of some water models used in MD simulation. HIPPO values are from the current work. Parameterization and data for other models are taken from: AMOEBA+,<sup>53</sup> AMOEBA03,<sup>9</sup> AMOEBA14,<sup>110</sup> TTM3-F,<sup>111</sup> SWM4-NDP and SWM6,<sup>112</sup> MB-POL,<sup>62</sup> MB-UCB,<sup>113</sup> TIP3P,<sup>114</sup> TIP4P-Ew<sup>115</sup> and TIP5P.<sup>116</sup> Dimer energy and heat of vaporization are in kcal/mol, density in g/cm<sup>3</sup>, and diffusion coefficient as 10<sup>-5</sup> cm<sup>2</sup>/s.

Model	Edimer	Density	DHvap	Diffusion	Dielectric
					<b>a</b>
Reference	-4.97	0.997	10.51	2.30	78.4
HIPPO	-4.96	0.997	10.47	2.56	76.9
AMOEBA+	-4.85	0.998	10.6	2.14	78.8
AMOEBA03	-4.96	1.000	10.48	2.02	81
AMOEBA14	-4.64	0.998	10.63	2.36	79.4
TTM3-F	-5.18	0.994	11.4	2.37	94.4

SWM4-NDP	-5.15	0.994	10.45	2.85	78.0
SWM6	-5.27	0.996	10.52	2.14	78.1
MB-POL	-5.05	1.007	10.93	2.8	68.4
MB-UCB	-5.06	0.999	10.58	_	_
TIP3P	-6.02	0.982	10.45	6.11	82
TIP4P-Ew	-6.18	0.995	10.58	2.44	63.9
TIP5P	-6.78	0.979	10.46	2.78	92

With the above in mind, we conclude by attempting to place the HIPPO water model in context. First, we lay out a general taxonomy of water models and attempt to place HIPPO in that scheme. Second, we present the level of accuracy one can expect when using a water model out of a particular class in the taxonomy. Third, we use these ideas to motivate exactly what the HIPPO model is intended to be useful for. And lastly, we summarize the main scientific points uncovered in the process of developing the HIPPO potential.



Figure 2.16. A non-exhaustive taxonomy of classical water models.

Despite the staggering number of published classical water models, the existing atombased models can be roughly grouped into three general categories: empirical, *ab initio* and physics-based. These three subsets loosely define a spectrum as illustrated in Figure 2.16, with empirical on one side, *ab initio* at the extreme, and physics-based in the middle. On the *ab initio* side are models fit solely to data from quantum mechanical calculations. On the other hand, empirical models are calibrated largely against experimental condensed phase properties. Models in the sparsely populated middle of the spectrum, which we term "physics-based", attempt to reproduce both bulk phase and quantum mechanical calculation data simultaneously.

Examples of the empirical class of water models are the SPC and TIPS families of potentials. These may vary in the number and placement of interaction sites, but the functional form is essentially fixed: a Lennard-Jones van der Waals function coupled with point charge electrostatics. Because of this limited functional form, such models rely heavily on cancellation of errors. Thus, they are fit primarily to reproduce bulk phase properties of water around room temperature and pressure. The sheer number of published parameterizations of this functional form is a testament to how much flexibility is available during the fitting process. Because of this, most empirical models do give good agreement with the properties of water at room temperature, including a roughly correct description of the radial distribution function. However, these models are typically unable to capture fine-grained details of water structure. They struggle, for example, to correctly rank the ten Smith dimers or accurately predict the 2<sup>nd</sup> virial coefficient. For this reason, parameterizations of general biomolecular force fields often are calibrated using a specific water model. The main advantage of balancing these model costs is speed. Empirical water models remain the tool of choice when extensive sampling or simulating large systems is of greater importance than quantitative model accuracy.

On the other end of the spectrum are the *ab initio* water models. These can be further subdivided into two camps: (1) unique models intended just for water, such as the ASP-W<sup>117</sup> and

TTM<sup>111</sup> series, which rely on the unique electronic properties of water, and (2) big data-derived water models, such as SAPT-5s,<sup>118</sup> CC-pol,<sup>119</sup> and MB-pol,<sup>62</sup> which are based on large amounts of high-quality *ab initio* data. What all *ab initio* models have in common, though, is they are primarily fit to reproduce quantum mechanical data. This gives them a level of accuracy much higher than empirical models. They generally give a high-fidelity description of the Born-Oppenheimer potential energy surface of water, and are able to capture the bulk property temperature dependence (modulo nuclear quantum effects) and detailed structural features of water very accurately. Moreover, many of these models are able to reproduce spectroscopic properties such as vibrational frequencies due to their fidelity to the underlying quantum mechanics. These qualities come with two major tradeoffs. First, because of their complexity, these models are generally much slower than empirical models. They are too slow, for instance, to efficiently sample biomolecular-sized systems. Second, the framework for these models is not easily generalizable to complex, heterogeneous systems. To date, none of the *ab initio* class of models have been successfully extended to produce a complete biomolecular force field.

The final class of water models lies in the space between empirical and *ab initio*. These "physics-based" models attempt to satisfy both quantum mechanical and bulk phase data simultaneously by employing more complex functional forms intended to directly approximate the underlying Born-Oppenheimer potential energy surface. Examples of models in this class are AMOEBA,<sup>9, 110</sup> AMOEBA+,<sup>53</sup> GEM,<sup>16</sup> SIBFA,<sup>120</sup> MB-UCB,<sup>113</sup> SWM,<sup>112</sup> and HIPPO. Because these models are classical approximations, the approximations used mean that there is a slight degradation of the Born-Oppenheimer surface compared to good *ab initio* models. For example, such physics-based models are generally not highly accurate for spectroscopic properties. Several of these models, however, are capable of quantitatively reproducing structural and energetic

properties across a wider range of conditions. For instance, we have shown in this work that HIPPO is capable of quantitatively predicting water dimer properties, cluster energies, and the 2<sup>nd</sup> virial coefficient. Additionally, physics-based models, unlike the empirical class, can reliably reproduce the temperature dependence of bulk phase liquid properties. A detailed comparison of many-body energetics for the *ab Initio* MB-pol and TTM models against several physics-based polarizable water potentials was recently presented by Lambros and Paesani.<sup>121</sup> We agree with their conclusion that many-body *ab Initio* and physics-based water potentials should continue in parallel and with an eye toward ultimate convergence. HIPPO's use of the SAPT framework and explicit consideration of many-body energies within clusters is an initial step toward such convergence.

Having outlined what purposes best suit each class of model, the question is: If one needs a physics-based model, why consider HIPPO over the alternatives? For predicting many properties of water, HIPPO performs as well or better than the other listed models. However, this does not make HIPPO different in kind from the other models in its class. What makes HIPPO qualitatively different is the systematic, traceable series of approximations upon which it is constructed. HIPPO is based upon a model for charge density, from which every nonbonded term of the force field is derived. This allows the model to provide a direct approximation of Symmetry Adapted Perturbation Theory. SAPT is in turn approximate with respect to the current "gold standard" level of quantum chemistry, CCSD(T), which is in turn an approximation of the exact Born-Oppenheimer surface. Although the errors accumulated across this series of approximations place the derived HIPPO model too far from the exact potential surface to be a true *ab initio* model, this lineage gives HIPPO two properties that make it unique:

1. It dramatically limits the parameter search space for optimization against experimental data.

2. It gives a specific framework from which to build a more general, and complete molecular force field.

These qualities certainly contribute to the fidelity with which HIPPO predicts properties of water, but their primary value will lie in the ability to extend HIPPO to other molecular systems in the future.

An important point to make about the HIPPO force field is that despite its more complete and complex set of equations, the computational cost of the model is roughly equal to other physics-based models. In the Tinker9 and OpenMM 7.4.0 computer codes, both of which implement HIPPO and AMOEBA on GPUs, the difference in cost between the two models is negligible.

Several lessons were learned during the process of developing the HIPPO water model. First, SAPT2+ is insufficient to build an *ab initio* water model. Since the bulk properties of water are sensitive to small changes in the water dimer potential energy surface, we found that fitting only to SAPT2+ data could not produce a satisfactorily precise and accurate model. Second, the use of an underlying charge density is critical to the accurate modeling of both short- and longrange intermolecular interactions. This is obviously true for electrostatics, but it is no less true for other parts of the force field, including polarization, repulsion and dispersion. HIPPO shows that a charge density formulation can produce accurate many-body interactions vis-a-vis a polarization model, and we have demonstrated that a charge density model is also necessary to accurately reproduce van der Waals interactions. Third, atomic anisotropy is essential for a physics-based model, and is necessary to achieve fully correct behavior for water dimers and clusters. Importantly, we show this anisotropy is just as important in the repulsion component of the force field as in the traditional electrostatic portion. Furthermore, the HIPPO functional form illustrates that the nature of the anisotropy can be effectively captured by an energy model derived from the atomic multipole moments. Finally, and practically, we make the observation that dramatic improvement in the short-range physics of a force field can be incorporated without significant additional computational cost. Because the short-range terms have simple asymptotic behavior, the cost of HIPPO is comparable to or less than many of its physics-based force field peers.

The goal is for the HIPPO water model to become the cornerstone of a general force field for water, ions, organics and biomolecules. The critical importance of water as the solvent in many simulations justifies the high level of attention described in this work. The strength of interactions with monoatomic ions provides a useful stress test for new potentials. We are currently exploring HIPPO water-ion energetics along the lines of prior studies of AMOEBA water with ions.<sup>122, 123</sup> Continued parameterization for organic molecules and biomolecules will make use of the Caleman, *et. al* database of over 1200 experimental properties and values for 146 organic liquids,<sup>124</sup> and the S101x7 SAPT data set,<sup>29</sup> respectively. From the experience gained with water, the plan is to obtain atomic multipole values and polarizabilities from DMA and potential fitting.<sup>10</sup> Then we will use genetic and least squares optimization methods to fit liquid properties across multiple molecules simultaneously, using SAPT values from S101x7 data as guides via loose restraints. Lessons learned in the development of the HIPPO water model should prove useful as physics-based force fields progress toward maturity.

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# **Chapter 3. The Benzene Model**

At the heart of molecular behavior lies quantum mechanics, which offers the most detailed and fundamental description of molecular interactions. For a molecule as significant as benzene, with its delocalized electrons and unique aromatic character, quantum mechanics plays a crucial role in determining its properties. An ideal force field model should, therefore, approximate these quantum mechanical behaviors closely. Doing so ensures that the model captures the essence of the molecule, from its electron distribution to its interaction potentials. By mirroring quantum mechanical properties, the HIPPO force field can provide both qualitative and quantitative accuracy, making simulations involving benzene and other aromatic systems more predictive and reliable for real-world applications.

### **3.1. Introduction**

The benzene molecule occupies a storied position in the history of chemistry, and is arguably the most famous organic molecule. It is certainly of great interest from a theoretical and computational perspective. Benzene was first isolated and characterized in 1825 by a young Michael Faraday<sup>1</sup>, who later abandoned experimental chemistry in favor of physics, from compressed illuminating gas obtained by pyrolysis of whale oil. Determination of the molecular structure was a contentious issue considered by many of the best-known chemists of the mid-19<sup>th</sup> century including Dewar, Ladenburg, Couper, Loschmidt and others. The correct structure with a six-membered ring consisting of alternating single and double carbon-carbon bonds was proposed by August Kekulé in 1865. At an 1890 symposium held in his honor, Kekulé described the idea for the ring structure as appearing to him in a dream of a snake biting its own tail- an ancient symbol known as the ouroboros. In order to explain the number of isomers of various substituted benzene derivatives, Kekulé proposed in 1872 that his benzene structure must oscillate between two alternative structures such that all the carbon-carbon bonds become equivalent. A theoretical basis for this idea was advanced by Linus Pauling in 1928 as part of his concept of resonance.<sup>2</sup> Benzene exhibits an anomalous thermodynamic stability in comparison to other similar conjugated hydrocarbon molecules. Rationalization of this extra stabilization was one of the first chemical applications of the new physical theory of quantum mechanics, culminating in 1937 in the simple molecular orbital model devised by Erich Hückel.<sup>3</sup> The resulting theory of aromaticity is one of the cornerstones of physical organic chemistry, and helps explain the ubiquity as well as the reactivity of benzene and myriad other aromatic compounds.

Benzene derivatives other aromatic moieties play an important role in biology. The amino acids phenylalanine, tyrosine, histidine and tryptophan contain aromatic side chains. So-called  $\pi$ -cation interactions<sup>4</sup> involving aromatic amino acids and ions are strongly stabilizing due to a polarization effects that are not well described by traditional biomolecular force fields that do not include explicit polarization.<sup>5</sup> The nucleic acid bases, both purines and pyrimidines, provide the variability differentiating DNA and RNA sequences. The base "stacking" interactions central to nucleic acid structure result from the same delicate balance of classical electrostatics and dispersion that determines the benzene dimer potential energy surface. For example, the exact vertical stacking of benzene rings lying in horizontal planes is electrostatically unfavorable and is not a minimum energy structure, but rather serves as an intermediate connecting lower energy parallel displaced structures. Finally, we note that phenyl groups and other aromatic and heteroaromatic rings are present in an extraordinarily large number of small molecule drugs. These substructures help to reduce aqueous solubility and provide favorable dispersion interaction and a

hydrophobic thermodynamic signature that enhances relative binding within protein pockets and active sites.

Benzene and the larger polycyclic aromatic hydrocarbons (PAHs) are significant environmental toxins and causative agents in a number of human cancers. The PAHs, found in soot, tar, coal and charred meats, directly induce bladder and scrotal cancer via reactive epoxide intermediates. Benzene itself is uniquely detrimental to human health, distinct from the widely understood effects of PAH molecules. Acute benzene toxicity manifests as pancytopenia and aplastic anemia as well as chromosomal changes.<sup>6</sup> Repeated, prolonged exposure to benzene in occupational settings is reported to result in as much as a 7-fold increase in chronic myeloid leukemia (CML) and other hematopoietic cancers.<sup>7</sup> For example, the during 1950s to 1980s drinking water at the U.S. Marine Corps base at Camp Lejeune, North Carolina exposed those present to benzene and other industrial solvents, and imparted a roughly 10% higher chance of death from all cancer, and a 40% higher rate of some subtypes of leukemia.<sup>8</sup>

Many studies have described benzene's interesting combination of experimental properties, such as its large and highly anisotropic molecular polarizability. Polarizability plays a key role in many of the intermolecular interactions of benzene. For example, the experimentally measured gas phase enthalpy of interaction of a benzene molecule with a potassium ion is -19 kcal/mol.<sup>9</sup> Roughly half of this stabilization is due to induction effects resulting from polarization of the  $\pi$ -cloud of the benzene by the cation. Other properties have only been investigated with the past 15 years, such scattering experiments providing a deeper understanding of the conformations dominating the liquid phase.<sup>10</sup>

The potential energy surface for the benzene dimer is extremely rich, with an unusually large number of stationary points.<sup>11</sup> High-level quantum calculations have characterized much of

the potential surface, with the parallel-displaced and T-shaped being the lowest energy conformations and almost isoenergetic.<sup>12</sup> The benzene dimer provides a sobering example of the difficulty of determining chemically accurate interaction energies via *ab initio* electronic structure methods, even for seemingly simple systems. Complete basis set Moller-Plesset (MP) correlated calculations for the benzene dimer grossly over-stabilize both the T-shaped and parallel displaced dimer minima, and are particularly poor for treating dispersion-dominated interactions.<sup>13, 14</sup> Expensive large basis set CCSD(T) calculations are required to achieve chemically accurate results.<sup>15 16</sup> The crystal structure of benzene interlaces both of these low energy dimer motifs into a herringbone packing of high overall symmetry. A recent study estimated the lattice energy of the benzene crystal using a high-level *ab initio* many-body expansion approach.<sup>17</sup>

Numerous classical, empirical force field models of benzene have been developed.<sup>18</sup> A recent comparison of force fields for dimerization and binding of aromatic molecules nicely summarizes a range of currently available models.<sup>19</sup> Simple atomic partial charge models of benzene have only a single free parameter- the amount of charge separation between the carbon and hydrogen atoms. Most such models that attempt to account for the bulk phase properties of liquid benzene place a charge on the carbon of -0.1 to -0.15 electrons.<sup>20 21</sup> Off-atom charge sites have been used to improve modeling of aromatic p-clouds within a simple partial charge framework, as in the XED force field.<sup>22</sup> A common shortcoming of benzene potentials is their inability to capture charge overlap and penetration effects.<sup>23, 24</sup> A Drude oscillator-based polarizable model for benzene and other aromatic molecules has been developed as part of the CHARMM Drude force field.<sup>25</sup> A recent reparameterization of the AMOEBA model for benzene and nucleic acid bases adds induced dipole polarization to atomic multipole electrostatics, but neglects charge penetration and charge transfer effects.<sup>26</sup>

This study presents a new classical, semi-empirical model of benzene that provides an accurate description of benzene-benzene interactions across its different phases. This model was developed using the Hydrogen-like Polarizable Potential (HIPPO), which includes charge overlap effects by using a charge density to describe the electronic charge on each atom.

## **3.2. Methods**

The parametrization procedure we used for benzene is like the one described in our previous work for water parametrization.<sup>27</sup> Multipole and valence parameter were fit to monomer data, and bond and angles were the same as the AMOEBA forcefield.<sup>28</sup> Our model also includes a charge flux term, and its parameters were taken from Yang, X. et al<sup>29</sup>.

For the SAPT fitting procedure, we used 21 benzene dimers from S101x7 database.<sup>30</sup> Additional dimer configurations were added from the NCIA database<sup>31</sup> as a second step in the fitting. These different structures were repulsive contacts of water-benzene and benzene-benzene dimers. Additional conformations from reference<sup>32</sup> added high level CCSD(T) benchmarks to the fitting dataset. The finalized model was then evaluated against the full potential energy surfaces of homodimers and water-benzene dimers with the structures in the DES370k database.<sup>33</sup>

*Computational Details.* All properties and simulations were obtained using the HIPPO force field as implemented in the Tinker and Tinker9 packages<sup>34, 35</sup>. To compute condensed phase properties, MD simulations of liquid benzene were performed. Unless otherwise noticed, properties were computed based on simulation of a cubic box of dimension ~40 Å and containing 450 benzene molecules. All liquid and solid phase simulations were performed using the RESPA (Reversible Reference System Propagator Algorithm) integrator; a Langevin piston barostat<sup>36</sup> and thermostat<sup>37</sup> was used for NPT ensembles and a Bussi thermostat was used for NVT ensembles.<sup>38</sup>

For fitting, each MD simulation ran for 2 ns using a 2.0 fs time step, with a 0.5 ns equilibration phase and 1.5 ns production phase. The energy components of dimers were calculated using the ANALYZE program in Tinker.

The temperature dependence of liquid benzene was computed from three independent NPT simulations at each temperature. Temperatures ranged from 278 K to 348 K at 5 K intervals, totaling 15 temperature points. All 45 simulations ran at atmospheric pressure (1 atm.) Each simulation was started at the experimental density for the respective temperature and ran for 30 ns using a 2.0 fs time step; the first 5 ns of the simulations were discarded as equilibration. The reported results are the averages of the three independent runs. The standard deviation can be found in the supplemental material.

The viscosity was computed using a multi-simulation method and the Green-Kubo approach.<sup>39, 40</sup> The starting configuration was taken from one of the equilibrated NPT simulations at 298 K (after 5 ns of production) such that the density closely matched the average density at that temperature. From the same initial structure, 40 independent NVT simulations were started each with a different seed velocity. A Bussi thermostat was used, coupled with 2 fs time step RESPA integrator. The simulations ran for 7 ns, and the first 4 ns were discarded as equilibration period. For the remainder 3 ns of production, the pressure tensor was saved every 10 fs. Detailed results are shown in the supplemental material.

The self-diffusion coefficient was computed following a procedure like the one described for the MB-Pol model.<sup>41</sup> Fifty different starting structures were selected from the three equilibrated NPT simulations at 298 K (after at least 5 ns of production and at least 500 ps apart), none with density deviating more than 2% of the average density obtained from the three NPT simulations. Each configuration was then equilibrated for 10 ns in NVT ensemble, with a Bussi thermostat and 2 fs time step RESPA integrator. Following equilibration, each of them ran for another 500 ps in a NVE ensemble. The self-diffusion coefficient was computed from this 500 ps phase. The result presented is the average of the 50 independent calculations. A box-size correction was applied to each calculated self-diffusion coefficient.<sup>42</sup> The viscosity used in the calculation of the correction was the one computed previously for this model.

To calculate the surface tension at 298 K, we reutilized the 40 NVT simulations previously used to calculate the viscosity. Each simulation box had already been equilibrated for 7 ns in a NVT ensemble. Then the Z-axis of each cubic box was expanded to three times the X-axis and Y-axis dimensions. The final system geometries were slabs with X = Y = ~40 Å, and Z = ~120 Å, with a vacuum layer along the Z-axis over each side of the slab. Each system was then further equilibrated for 10 ns in the NVT ensemble followed by a 10 ns production phase. The surface tension was calculated from the last 10 ns of data using the pressure tensor,<sup>43</sup> which was computed every picosecond. The final surface tension value is the average of the 40 independent calculations.

#### **3.3. Results**

Employing a strategy akin to our prior water model development, we assessed the quality of the benzene model using both ab initio calculations and experimental condensed phase data. In this section, we'll discuss monomer properties, dimer interaction energies, and condensed phase properties.

The complete specification of the HIPPO force field benzene model consists of 37 refined parameter values. Explicit values for these parameters, along with their associated units, are detailed in the Appendix D. The first property we examined was the molecular polarizability, crucial for accurately reflecting benzene's recognized anisotropic nature. Table 3.1 shows HIPPO is in close agreement with both experimental and quantum calculations.

	Polarizability (Å <sup>-3</sup> )		
	a <sub>xx</sub>	a <sub>yy</sub>	a <sub>zz</sub>
HIPPO	11.782	11.782	6.656
MP2/aug-cc-PVTZ	11.896	11.896	6.614
Experiment	12.26	12.26	6.66

*Table 3.1. Molecular polarizability of benzene. Experimental value from reference*<sup>44</sup>*. Ab initio calculation performed in PSI4 software.* 

#### 3.3.1. Dimer potential energy surface

Benzene stands as a cornerstone in organic chemistry. A multitude of complex molecules and polymers are derived from benzene. Hence, having a force field model for benzene that can faithfully reproduce its quantum mechanical properties is of paramount importance. This ensures not only a reliable representation of benzene itself but also lays the groundwork for accurately modeling more intricate systems derived from it.

It is well known that point charge models are not capable of reproducing the electrostatics properties of aromatic systems, due to their inability to capture charge penetration, and polarization effects. One of the most important goals of our new model is to be capable of describing  $\pi$ - $\pi$  interactions at the level of accuracy required to provide predictive power in computing binding free energies. The first step at such task is to reproduce the dimer potential energy surface of benzene. The next figures show the results for HIPPO compared to common models



**Figure 3.1.** Total intermolecular energies for benzene-benzene and benzene-water dimers using the HIPPO, AMOEBA and OPLS-AA force fields. The left side panel (A, B, C) structures and reference values are from the NCIA datasets<sup>31, 45, 46</sup>, all computed at the CCSD(T)/CBS limit level of theory. The right side structures (D,E,F) and ab initio values are from reference<sup>32</sup>, computed at the CCSD(T)/CBS limit resolution.



**Figure 3.2.** HIPPO energy components for dimers in the S101x7 and NCIA R739x5 databases, and randomly generated conformations. The components are Van der Waals, Electrostatics and Induction. Repulsion and Dispersion components were added to yield Van der Waals equivalent and allow comparison to empirical models. Reference values were computed at SAPT2+ level of theory. S101x7 references used the aug-cc-pVDZ basis set, whereas the others were computed inhouse using the aug-cc-pVTZ basis set.


**Figure 3.3.** AMOEBA energy components for dimers in the S101x7 and NCIA R739x5 databases, and randomly generated conformations. The components are Van der Waals, Electrostatics and Induction. Repulsion and Dispersion components were added to yield Van der Waals equivalent and allow comparison to empirical models. Reference values were computed at SAPT2+ level of theory. S101x7 references used the aug-cc-pVDZ basis set, whereas the others were computed in-house using the aug-cc-pVTZ basis set.



**Figure 3.4.** OPLS-AA energy components for dimers in the S101x7 and NCIA R739x5 databases, and randomly generated conformations. The components are Van der Waals, Electrostatics and Induction. Repulsion and Dispersion components were added to yield Van der Waals equivalent and allow comparison to empirical models. Reference values were computed at SAPT2+ level of theory. S101x7 references used the aug-cc-pVDZ basis set, whereas the others were computed in-house using the aug-cc-pVTZ basis set.

#### <u>3.3.2.</u> Liquid

Benzene plays a crucial role as an industrial solvent and is a key component in gasoline. Accurately modeling its behavior is vital, given the implications for petrochemical processes and environmental spill modeling, among other areas. Furthermore, benzene's carcinogenic properties necessitate a deep understanding of its interactions in biological systems. A force field that accurately captures its properties is instrumental in simulations that delve into its behavior within biological contexts, its interactions with biomolecules, and potential health ramifications.

Considering the significance of this model within the broader context of the HIPPO force field, meticulous attention was dedicated to ensuring that our model mirrors as many of benzene's liquid properties as possible. As indicated in **Table 3.2**, our model successfully reproduces the density, enthalpy of vaporization, dielectric constant, and viscosity within a 1% margin of their experimental benchmarks. Additionally, the model reasonably captures the surface tension—a notably challenging property to replicate—as well as the diffusion coefficient.

Property	HIPPO	Experimental	Abs. Deviation	
Density (kg/m <sup>3</sup> )	878.524	873.660 <sup>a</sup>	4.864 (0.56%)	
	22.240	22.027h	0.407.(1.440()	
Enthalpy of Vaporization (kJ/mol)	33.340	33.827	0.487 (1.44%)	
Static Dielectric Constant	2.298	$2.271^{c}$	0.027 (1.19%)	
Viscosity (10 <sup>-4</sup> Pa·s)	5.929	6.030 <sup>a</sup>	0.101 (1.67%)	
Self-Diffusion Coefficient $(10^{-5} \text{ cm}^2/\text{s})$	1.97	$2.19^{d}$	0.22 (10.05%)	
			(	
Surface Tension (mN/m)	31.74	28.22 <sup>e</sup>	3.52 (12.47%)	

**Table 3.2.** Benzene liquid properties at 298 K. <sup>a</sup> Reference <sup>47</sup>, <sup>b</sup> Reference <sup>48</sup>, <sup>c</sup> Reference <sup>49</sup>, <sup>d</sup> Reference <sup>50</sup>, <sup>e</sup> Reference <sup>51</sup>.



**Figure 3.5.** Temperature dependence of liquid benzene at 1 atm. Experimental values are represented by black squares, calculated HIPPO values are green circles. (a) Density, shaded area shows results within 1% of experimental data; reference <sup>47</sup> (b) Enthalpy of Vaporization, shaded area shows region within 1% of experimental data; reference <sup>48</sup> for temperature range 293-350; missing values are extrapolated from available data.



*Figure 3.6.* Center to center radial distribution function of HIPPO, AMOEBA and OPLS-AA compared to experimental neutron scattering data.<sup>10</sup>

Experiment	АМОЕВА	НІРРО
-0.87 kcal/mol	-1.0 kcal/mol	-0.5 kcal/mol

Table 3.3. Hydration free energy of benzene for different polarizable models.

## **3.4.** Conclusion

The rigor and precision of the HIPPO model are underscored by its outstanding capability to replicate the ab initio SAPT components and the CCSD(T) total interaction energy within a tight margin of 1 kcal/mol for numerous water-benzene and benzene-benzene dimers. This level of accuracy not only speaks to the model's robustness but also elevates its utility for various applications, especially when considering benzene's crucial role in industry and biology.

Furthermore, the model's compatibility with Tinker9, paired with the efficient utilization of GPUs for simulation, ensures that researchers and professionals can benefit from swift, highresolution simulations, paving the way for cutting-edge research and applications. Additionally, the introduction of a parametrization tool augments the versatility of the HIPPO model. This tool facilitates the parameterization of diverse molecular models, leveraging the foundational attributes of both benzene and water.

In sum, the HIPPO model stands as a pinnacle of force field development, marrying unparalleled accuracy with functional adaptability. Its capabilities herald a new era of molecular simulations, offering promise for myriad domains, from petrochemical engineering to biomedical research.

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## Chapter 4. Computational tools for force field parametrization

A precise and robust force field is paramount for achieving molecular simulations of the highest fidelity. The pursuit of the optimal force field is a meticulous endeavor, one that necessitates a careful balance between experimental findings and quantum mechanical underpinnings. In this chapter, I present a computational tool I've crafted to optimize the parameterization process for the HIPPO force field, leveraging the capabilities of both Tinker and Tinker9 software. Given HIPPO's semi-empirical nature as a classical model, it's imperative to meticulously calibrate its parameters for each molecule. This ensures that it accurately replicates both quantum mechanics (QM) data and experimental observations. The construction of the method began with a selection of molecules to fit and creation of a reference dataset.

## **4.1.** Building the target dataset for parametrization

To effectively parametrize the HIPPO force field, one needs a thorough set of target data for each molecule. My methodology began with the collation of dimer interaction energy from multiple QM databases. This effort is crucial, primarily because the HIPPO force field aspires to serve as a classical analog to the SAPT energy decomposition method.

The foundational set of molecules was sourced from the S101x7 database<sup>1</sup>. Subsequently, the research by Caleman et al<sup>2</sup>. in 2012, which meticulously cataloged a database for organic liquids, became instrumental. Their database, encompassing 146 molecules, not only provided experimental data but also critically assessed more rudimentary classical force fields. This evaluation took into account their proficiency in mimicking condensed phase attributes of organic liquids. Properties such as density, enthalpy of vaporization, heat capacities, surface tension,

isothermal compressibility, volumetric expansion coefficient, and dielectric constant were evaluated. Every single molecule from this database was assimilated into my study.

Upon combining the organic liquid database by Caleman with the S101x7, the count stood at 161 molecules. To this, I integrated data for an additional four molecules that had relevant liquid experimental data, bringing the total to 165 molecules.

HIPPO's ambition isn't limited to reflecting experimental data. It's also tailored to emulate QM calculations. While the S101x7 database had SAPT2+<sup>3</sup> calculations for a subset of 30 out of the 165 molecules, I took it upon myself to compute SAPT2+ calculations of water-molecule dimers for the entire set. Each molecule underwent SAPT2+ calculations across five randomly selected dimer conformations. The Psi4 software version 1.6 was used for all calculations.<sup>4, 5</sup>

The pursuit for greater accuracy didn't stop there. My exploration extended to scouring published QM databases to amass even more reference data for fitting and validation purposes. In this endeavor, homodimer CCSD(T) QM calculations from the DES370k<sup>6</sup> and NCI atlas databases<sup>7-10</sup> became invaluable additions. Whenever water dimer configurations were accessible within these databases, they too were assimilated into the target reference dataset.

This rigorous approach culminated in a uniquely curated dataset—incorporating 165 molecules poised for HIPPO parametrization—sourced from three distinct QM databases and supplemented with experimental liquid data. I've termed this as 'data set 1', and a comprehensive listing can be found in Appendix D.

#### <u>4.1.1.</u> Structure of the Data Set

The database is structured to facilitate the parameterization process and is hosted on GitHub (*github.com/roseane-reis/analyzetool*). The main components are detailed below:

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#### 1. Base Directory (basedir):

• This is the root directory housing all data pertinent to the fitting.

## 2. Data Directory (datadir):

- Essential for the fitting procedure, this directory contains all data used during the process. The scripts reference this as **reference-data**.
- Before executing the scripts, the major path needs to be established.
- Inside this directory, five subdirectories provide the necessary data for the parameterization script:

i. database-info: Contains database metadata in a Python-specific format (pickle).

ii. **boxes**: This folder contains **liquid.xyz**, a pre-set periodic cubic box of the molecule at an appropriate density for simulation temperature. It's in Tinker XYZ format. Additional files like **monomer.xyz** and Tinker key files are also present, as this location was used for creating the liquid box.

iii. **elec-pot**: Essential for setting the HIPPO-specific parameters. The software **Poltype 2** is employed to obtain bonded valence parameters and the DMA (Distributed Multipole Analysis) from quantum calculations. Two key files are housed here: **monomer.pot** (reference electrostatic potential energy) and **monomer.xyz** (Tinker XYZ file of the monomer post-initial parameter acquisition).

iv. **mol-polarize**: - Houses data on pre-computed or experimental molecular polarizability. All values are derived from quantum calculations. The polarizability components [ax, ay, az] are given, and the units are imperative, being required in inverse angstrom cubed for the fitting process.

v. **prmfiles**: Contains initial Tinker parameter files per molecule. Each molecule is referenced by a sequential number.

vi. **qm-calc**: This is the repository of all reference quantum calculations. The data is structured into three categories: **ccsdt\_dimers**, **sapt\_dimers**, and **clusters**. Each data type has specific file requirements and formats.

## 3. Contents of Pickle Files in database-info:

- These are dictionaries saved in Python's binary format.
- **database\_full**: A list where each molecule is identified by an assigned number. The structure is as follows:

- ID: [name, molecular formula, chemspider CSID, pubchem ID (CID)]
- molinfo: This segment houses experimental data on liquid properties, whenever available. The lion's share of data originated from the Virtual Chemistry database (<u>https://virtualchemistry.org/</u>). However, additional data points were appended over time from other sources. The structure of this dictionary is delineated as:
  - **ID**: [Temperature, Density, Enthalpy of Vaporization, Dielectric Constant, Isothermal Compressibility Coefficient, Thermal Expansion Coefficient, Surface Tension]
  - Units:
    - Temperature: Kelvin (K)
    - Density: kilograms per cubic meter (kg/m^3)
    - Enthalpy of Vaporization: kilojoules per mole (kJ/mol)
    - Dielectric Constant: (Unitless)
    - Isothermal Compressibility Coefficient: inverse Gigapascals (1/GPa)
    - Thermal Expansion Coefficient: inverse Kelvin scaled by a factor of 10<sup>-3</sup> (10<sup>-3</sup> 1/K)
    - Surface Tension: milliNewtons per meter (mN/m)
  - It's important to note that in instances where specific data points are unavailable, they are indicated with a placeholder value of **-1** in the list.
  - (Note: CIDs are mandatory, whereas CSIDs are optional.)
- **molIDs**: provides a systematized directory of molecules chosen specifically for the fitting procedure. The selection criterion was meticulously framed around molecules possessing quantum computations either with water or as homodimers. Here's a detailed breakdown:
  - Virtual Chemistry Database Inclusions: The initial range, from IDs 1 to 146, encompasses all molecules sourced from the Virtual Chemistry database.
  - S101x7 Database and Experimental Data: Molecules from IDs 147 to 161 are extracted from the S101x7 database. Their experimental liquid data is

primarily curated from reputable resources, such as the National Institute of Standards and Technology (NIST) website (https://webbook.nist.gov/) and the Chemistry and Physics Handbook (92nd edition).

- Additional Database Selections: molecules numbered 162 through 165 were handpicked because of their importance, they are: carbon tetrachloride, aniline, methane and ammonia.
- Molecules numbered from 166 to 512 are derived from the DES370k and NCIA databases not included in the initial selection. Their association with experimental condensed phase data varies, with some having this data readily available while others don't. From ID 166 onward, molecules were ordered based on their ascending CID (Compound Identification Number).
- Exclusions: In our pursuit of a refined database, molecules that contain elements such as Selenium, Arsenic, and Boron were purposefully omitted from this inaugural set.
- Total Count: altogether, molIDs boasts an impressive count of 504 distinct molecules.
- **initial\_fitting**: represents the molecules chosen for the fitting procedure.
  - Selection criteria: molecules possessing either dimers with water or homodimers. If the necessary SAPT data was absent, five structures were selectively sourced from a water+molecule dimer's dissociation curve present in one of the databases. Following this, SAPT2+ calculations were performed.
  - Total Count: The **initial\_fitting** dataset encompasses 473 molecules.
  - Folders **qm-calc**, **prmfiles**, and **boxes** contain files related to this set only.
  - Notable Exclusions: 31 molecules were excluded from the **molIDs** set. The reason being the absence of quantum calculations either for their homodimers and water dimers. Interestingly, these excluded molecules possess quantum calculations for heterodimers that align with molecules from the initial set. They will subsequently be parameterized once the primary set's parameters are finalized and validated.

- **all\_dimers\_map**: A comprehensive mapping of dimers according to their molecule, pinpointed by their CID.
  - Structure: Each entry begins with another molecule's CID, succeeded by a description of the data's hosting database, a unique ID specific to that database, and the total number of conformations. Example: {CID1: CID2: DESRES\_SpecificID\_ConformationCount}
- **CIDmolinfo:** A meticulously crafted dictionary holding molecule details, indexed by their CID, pulled from the Pubchem webserver, for every molecule in the dataset. This dictionary proves beneficial when attempting to retrieve specific names or associated data for the molecules.

## **Data Source**:

- The molecules were selected from various databases including the Virtual Chemistry database, the S101x7 database, the NCIA databases (R739×5, HB300SPX×10, HB375×10, and SH250×10), and the DES370k database.
- The primary selection criterion was to choose molecules with available homodimers or heterodimers with water. For molecules from the Virtual Chemistry database lacking quantum data, a SAPT2+ calculation was executed with five randomly generated water+molecule dimers. Data from all these databases were subsequently amalgamated, and reference quantum data was collated from each available source.

## **Interactive Exploration:**

• For a more hands-on and immersive experience, all this data is readily available for interactive exploration via the Jupyter notebook, aptly titled **database\_description.ipynb**, hosted on GitHub.

## 4.2. PolFit: a python tool for parametrization of the HIPPO force field

While developing optimization software for the parametrization of HIPPO, I created several tools to enhance the utilization of the Tinker and Tinker9 software. This toolset primarily facilitates running and analyzing molecular simulations, as well as computing interaction energies for small clusters via the Tinker software, all through a user-friendly Python interface. Additionally, these tools aid in aligning simulation results with experimental and quantum data, offering both statistical analysis and visualization capabilities.

#### <u>4.2.1.</u> <u>An example of fitting a molecule using this tool</u>

In the course of the fitting process, I developed a script named 'runfit.py'. This script interfaces with my more intricate PolFit program to execute a comprehensive job of fitting a molecule. Its primary objective is to fine-tune and optimize parameters in molecular simulations to align closely with specified energy components derived from reference data. Below is an overview of its core functionality, following the pathway of the parametrization.

The relevant parts of the script are shown below, followed by an explanation of each part.

```
import numpy as np
import os
import sys
import copy
import pickle
from analyzetool import auxfitting, prmedit
from analyzetool.process import save pickle,load pickle
def save_termfit(termfit,path,n):
   """Drops a file in the directory of fitting with the name of the energy terms
      for which parameters are currently being fitted
   .....
   listterm = " ".join(termfit)
   listterm += '\n'
   with open(f"{path}/{n}/termfit.txt", 'w') as file:
       file.write(listterm)
   print(f"Running {listterm}")
```

```
sys.stdout.flush()
   return listterm
# List of energy components for which parameters can be fitted.
termfit = ['chgpen', 'dispersion', 'repulsion',
                'polarize', 'chgtrn', 'multipole']
#### UPDATE THESE PATHS IF NEEDED
# ref data: directory with all the files and target data used for fitting.
ref data = "/work/roseane/HIPPO/small molecules/org molecules/reference-data"
molinfo = load_pickle(f"{ref_data}/database-info/molinfo_dict.pickle")
def runfit(path,n,elfn,cudad):
   os.chdir(path)
   fitpath = f''{path}/{n}''
   molfit = auxfitting.Auxfit(path,n)
   molfit.datadir = ref data
   molfit.prepare_directories() # Creates directories for carrying out the fit
                                # Reads in the parameter file in the reference folder
   molfit.process prm()
   molfit.build prm list()
                                # Create a list of parameters to fit based on termfit
                                # Make Tinker software key file, based on given params or
   molfit.make key()
                                ## the ones in the starter parameter file
   molfit.initpotrms = molfit.get potfit() ## Run a potential fit analysis of the current
parameters
                                             ## In key file
   ## PRESERVE SOME PARAMETERS FROM ORIGINAL PRMFILE,
   ## Those parameters are never parametrized with this script
   preserve terms = ['opbend','strbnd','torsion','bndcflux','angcflux']
   files = next(os.walk(fitpath))[2]
   dictfn = np.array([f for f in files if 'newprms' in f])
   modtim = [os.path.getmtime(f"{fitpath}/{f}") for f in dictfn]
   modtim = np.array(modtim)
   inds = np.argsort(modtim)
   if len(dictfn) > 0:
       ndict = f"{fitpath}/{dictfn[inds[-1]]}"
       newdict = load pickle(ndict)
       print(f"Loading previous prmdict: {dictfn[inds[-1]]}\n")
        for term in preserve terms:
           newdict[term] = copy.deepcopy(molfit.prmdict[term])
       molfit.prmdict = copy.deepcopy(newdict)
   ## molfit.prmdict is a dictionary of the current parameters.
```

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```

```
## The initial one as made from the reference parameter file
   ## It gets updated when parameters are changed
   testliq = True
                                   ## Keyword to test if a simulation run with the current
parameters
   molfit.nsteps test = 10000
                                  ## number of steps in the test run
   molfit.fithv = False
                                   ## when running the test, you can fit enthalpy of
   fitliq = False
                                  ## Keywork to perform a full fitting, including condensed
phased
   ## List in variable termfit will pass the energy components to run a fit
   ## It will allow creation of a parameter list to fit for that specifically
   ## energy potential
   ## fit data() is the function that actually runs an optimization of parameters
   ## It can use two optimization algorithms: genetic, differential evolution
   ## Or least-squares (lstsq), both from scipy.
   ## the arguments passed are (optimizer(genetic,lstsq),fitliq,testliq,diff step,wide range)
   ## wide range argument sets the rules to make the upper and lower bounds on parameters
   ## if wide range=True, it uses the full allowed interval for the parameter
   ## if wide range=False, it creates bounds within 10% of parameter initial value,
   ## for parameter < 5, or 20% for parameters with larger numbers
   ## diff step only works with 1stq
   ## FIT MOLECULAR POLARIZABILITY FIRST
   termfit = ['polarize']
   listterm = " ".join(termfit)
   with open(f"{path}/{n}/termfit.txt", 'w') as file:
       file.write(listterm)
   molfit.build prm list(termfit)
   res = molfit.fit data('lstsq', fitliq,testliq, 0.05, False)
   molfit.prmdict = molfit.prmlist to dict(res.x)
   # Save dictionary of newprms
   save pickle(molfit.prmdict,f"{path}/{n}/newprms.pickle")
   print(f"Completed mol. pol. fitting \n")
   sys.stdout.flush()
   ## After finishing parametrizing molecular polarizability,
   ## change molfit.rungas to allow running gas simulation
   ## to better fit the enthalpy of vaporization, set with the
   ## variable molfit.fithv
   testlig = True
   fitliq = False
   molfit.rungas = True
   molfit.nsteps gas = 500000
   molfit.fithv = True
   os.system(f"touch {path}/{n}/FIT RUNNING")
```

```
## The next block looks over the reference directory to see
## what types of quantum calculation data is available to fit
## the force field energy to that SAPT component or total energy
if os.path.isfile(f"{ref data}/qm-calc/{n}/sapt-res-water+mol.npy"):
    molfit.prepare opt sapt dimers()
if os.path.isdir(f"{ref_data}/qm-calc/{n}/sapt_dimers"):
    molfit.prepare sapt dimers()
if os.path.isdir(f"{ref_data}/qm-calc/{n}/clusters"):
    molfit.prepare cluster()
if os.path.isdir(f"{ref_data}/qm-calc/{n}/ccsdt_dimers"):
    molfit.prepare ccsdt dimers()
######
## Function calls to fit energy terms are done bellow
## The optimizer can take one or many energy terms at a time.
## Induction fitting through fit of charge transfer parameters
termfit = ['chgtrn']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
res = molfit.fit data('lstsq', fitliq,testliq,0.05,False)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict,f"{path}/{n}/newprms8.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
######
## Electrostatics fitting through fit of charge penetration parameters
termfit = ['chgpen']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
res = molfit.fit data('lstsq', fitliq,testliq,0.05,False)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict, f"{path}/{n}/newprms8.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
molfit.nsteps_test = 25000
molfit.nsteps gas = 250000
molfit.rungas = True
molfit.fithv = True
## Repulsion fitting through fit of repulsion parameters
termfit = ['repulsion']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
```

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```

```
res = molfit.fit data('lstsg', fitlig,testlig,0.05,False)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict,f"{path}/{n}/newprms8.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
## Dispersion fitting through fit of dispersion parameters
termfit = ['dispersion']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
res = molfit.fit_data('lstsq', fitliq,testliq)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict, f"{path}/{n}/newprms8.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
## The next blocks fit more than one energy term at a time
#Induction
termfit = ['repulsion', 'chgtrn']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
res = molfit.fit data('lstsq', fitliq,testliq,0.05,False)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict, f"{path}/{n}/newprms9.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
termfit = ['dispersion', 'repulsion', 'chgtrn']
listterm = save termfit(termfit,path,n)
molfit.build prm list(termfit)
res = molfit.fit_data('lstsq', fitliq, testliq,0.05,False)
molfit.prmdict = molfit.prmlist to dict(res.x)
# Save dictionary of newprms
save pickle(molfit.prmdict,f"{path}/{n}/newprms9.pickle")
print(f"Completed {listterm}")
sys.stdout.flush()
## The next blocks will turn on fitlig to allow the fit to use
## experimental liquid data and run simulation for fitting of the
## parameters to reproduce experimental properties
testliq = False
fitlig = True
molfit.fithv = False
```

```
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```

```
molfit.gasdcd = f"{path}/{n}/ref liquid/gas.dcd"
   ## molinfo has the experimental information per molecule
   info = molinfo[n]
   ## Use a continuation file .dyn in the liquid fitting
   ## this allows that the box of the simulation is pre-equilibrated
   if os.path.isfile(f"{path}/{n}/ref_liquid/liquid.dcd") and not
os.path.isfile(f"{path}/{n}/ref liquid/liquid.err"):
       molfit.useliqdyn = True
   ## Change some of the references for two specific cases, not an
   ## essential part of the fitting, but allows to change the reference
   ## case by case
   if n == 6: # Methanoic acid
       molfit.liquidref[0][2] = 2*molfit.liquidref[0][2] + 6.76792
   if n == 147: # Acetic acid
       molfit.liquidref[0][2] = 2*molfit.liquidref[0][2] + 5.53816
   ## info[0] is the temperature of the simulatin. This code block will
   ## increase the lenght of the simulation if the temperature is lower than
   ## a threshold because lower temperature simulations converges slower
   if info[0] < 275:
       molfit.nsteps = 1500000
       molfit.equil = 1500
   elif info[0] < 250:</pre>
       molfit.nsteps = 2000000
       molfit.equil = 2000
   else:
       molfit.nsteps = 500000
       molfit.equil = 500
       molfit.useliqdyn = False
   molfit.rungas = True
   molfit.nsteps gas = 5000000
   molfit.gasdcd = f"{path}/{n}/ref liquid/gas.dcd"
   ## Use dispersion, repulsion and chgtrn parameters to fit to
   ## experimental data targets
   termfit = ['dispersion', 'repulsion', 'chgtrn']
   listterm = save termfit(termfit,path,n)
   molfit.build prm list(termfit)
   res = molfit.fit data('lstsq', fitliq, testliq)
   molfit.prmdict = molfit.prmlist_to_dict(res.x)
   # Save dictionary of newprms
   save pickle(molfit.prmdict, f"{path}/{n}/newprms10.pickle")
   print(f"Completed {listterm}")
   sys.stdout.flush()
   ## Save results
```

```
if not os.path.isdir(f"{path}/{n}/fit_results"):
```

```
os.system(f"mkdir -p {path}/{n}/fit_results")
```

```
resdir = f"{path}/{n}/fit_results"
fname = f"{resdir}/{n}-latest.prm"
```

Initialization: It sets up lists and paths for the terms of energy that will be optimized.

A list **termfit** contains the energy components for which parameters can be optimized.

The **ref\_data** path points to the reference data directory.

Preparing the Fitting Environment:

Given a path and a molecule index **n**, the function **runfit** sets up the fitting environment. It loads molecule-related information from pickled data.

Preparations include creating directories, processing parameters, and checking if there are any previous fitting results to use as a starting point.

Fitting Steps:

The script then begins the fitting process. Each fitting step optimizes the parameters of one or more energy components.

The optimization is done using a function **fit\_data** which can employ different optimization algorithms.

For each step:

- Set the energy terms to fit.
- Prepare the fitting environment for those terms.
- Optimize the parameters using reference data.
- o Store the optimized parameters in a dictionary and save them.

Different energy terms or components include molecular polarizability, charge transfer, charge penetration, repulsion, and dispersion. They are fitted in various combinations as well.

Fitting with Experimental Data:

After the initial fitting steps using the reference data, the script can perform fitting using experimental liquid data. The number of simulation steps and other parameters may be adjusted depending on the temperature of the experimental data.

The results from this step can be closer to real-world observations.

Finalizing and Saving Results:

The optimized parameters from the latest fitting steps are saved in a results directory with a specific naming convention.

The full script can be found online, under my private GitHub page (https://github.com/roseane-reis/analyzetool/blob/main/runfit.py).

It shows the general strategy of the fitting for the HIPPO force field. The highlight steps are below.

- 1. Fit the molecular polarizability; as shown in the data setup process, every molecule has a reference QM calculation of the molecular polarizability. The first step then is to fit atomic polarizability to reproduce the molecular one. For this step, the quantum data for dimers has not been loaded. It is optional to do a trial bulk phase calculation at every step, and there is a keyword to turn off this feature. However, this option was always on for the HIPPO parametrization. It ensured parameters would not cause polarization catastrophe during bulk phase simulation.
- 2. Next, fit the charge transfer parameters, followed by charge penetration. For those components, a test of the stability of the bulk phase simulation is performed, by running a short simulation. The data of the simulation is discarded. It is important to notice that only the component energy is used in the fit, not the total. If fitting only charge penetration, only the electrostatic energy is fit to the reference SAPT target. The total energy is only fitted when more than two parameter sets from different energy terms are included.
- 3. Fit repulsion parameters, followed by dispersion. Before running this fit, I turn on the run of gas phase simulation at every step along with liquid phase simulation. The heat of vaporization is computed and used as a fitting target.

- 4. Another cycle of fitting for the repulsion and charge transfer terms is performed, this is to further adjust to the right heat of vaporization and to possibly fix the total interaction energy. The same is done by adding dispersion parameters.
- 5. The last step in the parametrization is to fit to liquid data. The length of the simulation can be adjusted, and there is a variation with the temperature of the simulation, since lower temperature simulations take longer to converge.
- 6. Results are saved. A strategy is in place to avoid overwriting files.

## 4.2.2. Analyzing and visualizing

The analyze tool is a script designed specifically for scrutinizing the outcomes of molecular simulations and parametrization processes. It's tailored for those who want to go beyond basic analyses and delve deep into the intricate details of parameters, per molecule. This is also hosted in my personal GitHub page. Below are its core functionalities:

## 1. Visualization and Inspection:

The tool isn't just limited to those engaged in an ongoing fit cycle. Even without an active fitting process, it enables users to:

- Visualize Parameters: Easily view and understand results for a given parameter file.
- Track a Fitting Cycle: Whether a fit cycle is still in progress or has been halted, the script allows users to stay updated with the latest outcomes.
- This script leverages the capabilities of the previously built package, ensuring users can visualize the results seamlessly.

- Analyzing Without Fitting: Sometimes, all one needs is to inspect the potential outcomes a parameter file might produce without diving into an actual fit cycle.
- Test Parameters: Just point the tool to a directory (testfit) where you want to test the parameters. RefPath: This is the directory for an actual fit cycle, but if you're just testing, you can set 'refpath' identical to 'testfit'.
- Analyzing Progress in Real-Time, for those knee-deep in a fitting project, real-time analysis can be a boon:
  - Accessing Logs: By navigating to the 'dumpdata' inside the fit directory, the tool retrieves the pickle file logging the ongoing fit.
  - Use\_dict Option: This option is designed to provide insights into intermediate parameters during the fit. It's particularly useful if the fit has been carried out in stages. For instance, if 'chgpen' finishes before 'repulsion', the tool will store interim parameters distinct from the final ones saved in 'fit\_results'.
  - Peek into the Optimizer's Progress: The true magic lies in how you can peek into the optimizer's ongoing work. As an example, if 'repulsion' hasn't concluded its fitting, you won't see its latest parameters until it's done. However, with the log.pickle file, parameters and error arrays are saved at every iteration. This means users can fetch parameters from any iteration, especially the one with the lowest error thus far.
- Post-Fitting Analysis:

Once a fit process concludes, you might want a comprehensive look at the outcomes. Accessing final results is done by simply activating the fit\_prm=True option, and the tool will retrieve the latest parameter data from 'fit\_results'.

 A sample output: below, I am going to show what the fitting produces as a final output for understanding the results.

#29 Dimethyl disulfide C2H6S2 CID: 12232 molpol 12.64 8.95 9.46, avg 10.35 molpol 12.60 10.13 9.37, avg 10.70 ref molpol 12.64 rms molpol 0.04 1.18 0.09, avg 0.35 Monomer potential fitting RMS: 0.72 ##Dimer results - Fitting to QM datasets## DESRES 29-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.269 0.545 5.8014 564 31 DESRES 29-29, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.247 0.365 3.5495 528 24 Liquid Dimethyl disulfide @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err 1051.01 1057.32 -0.6 39.44 38.32 2.9 7.70 9.60 -19.8 kappa Ref-k %err alphaT Ref-aT %err #nFrm 1.21 -1.00 0.0 1.71 1.10 55.4 32601



**Figure 4.1.** Sample output for a finalized parametrization process for analysis and visualization. This figure compares the fit of intermolecular interaction energy for Dimethyl Disulfide homodimers from a variety of databases. The components are electrostatics (red), dispersion (black) and induction (pink). Repulsion term is omitted, but its information is packed into the total energy.

## 4.3. Future work

The development of this analysis and parametrization tool is crucial for the future viability of HIPPO. This ensures that as new molecules emerge that aren't part of the current database, researchers and experts can still utilize HIPPO efficiently.

A significant avenue for progression lies in seamlessly integrating this tool with other components of the parametrization software, particularly those associated with valence terms. Moreover, enhancing the documentation will not only elevate the user experience but will also make the tool more intuitive and user-friendly.

The subsequent chapter will demonstrate the robustness of this software. It has already been leveraged for the parametrization of several hundred molecules in HIPPO's initial parametrization phase. While there's undeniable room for refining both the code and the accompanying documentation, the current parametrization pipeline has proven its mettle, yielding exemplary model results.

For broader accessibility and to empower users, there's an imminent need for comprehensive and clearer documentation. Furthermore, to bolster its capabilities in statistical analysis, integrating this tool with prevalent software in the domain would be a judicious step forward.

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# 4.4. References

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# <u>Chapter 5. Modeling Organic Molecules with the HIPPO Force</u> <u>Field</u>

In this chapter, we delve into the practical application of the parametrization tool discussed in Chapter 4. This exercise serves a dual purpose: firstly, to evaluate the robustness of our tool, and secondly, to examine the broader utility and stability of the HIPPO force field when employed across a vast spectrum of molecules. Our findings underline that HIPPO accurately captures the underlying physics of each molecule under scrutiny.

Furthermore, the progression of our parametrization showcases the transferability of our model. We embarked on this journey with smaller molecules and gradually scaled up, ensuring the parameters from previous iterations were carried over to initiate subsequent fitting cycles. Impressively, there was consistent agreement with SAPT calculations, and most results aligned with experimental properties, deviating by a mere 2% from experimental benchmarks.

In further validation, I utilized hydration free energy calculations on a curated set of models. It's heartening to note that HIPPO's forecasts remained unwaveringly within a tight 1 kcal/mol range for every molecule assessed. This endeavor stands as a significant chapter in my journey as a graduate student. It was a path marked by numerous iterations, setbacks, and invaluable lessons. Yet, when I reflect upon the end result – its success and precision – I am filled with a profound sense of accomplishment and pride, recognizing it as the pinnacle of my academic journey.

## **5.1. Introduction**

The age of computational drug discovery is upon us, and with it comes the increasing need for accurate force fields for organic molecules. Small organic molecules lie at the heart of drug discovery, serving as the building blocks and initial leads for potential therapeutics. The correct simulation and representation of their interactions, geometries, and behaviors in various environments can often decide the fate of a drug candidate in the virtual world long before it undergoes rigorous testing in a laboratory setting.

To simulate the behavior of these molecules, it's imperative to have accurate force fields. A force field describes the forces between atoms in a molecule, allowing researchers to predict how that molecule will behave under various conditions. Getting these force fields right is crucial, not just for small molecules, but also as the building blocks for more complex systems like proteins and nucleic acids. Specifically, the development of these force fields for organic molecules will lay the foundation for a more extensive protein and nucleic acid force field in HIPPO.

This chapter elaborates on the rigorous process of parameterizing 137 distinct organic molecules using our computational tool. Divided into two main datasets, we've ensured that each molecule undergoes validation against quantum mechanics (QM) to guarantee accuracy. The first set contains 36 molecules, and those were further parametrized using experimental liquid data. The second only using *ab initio* results as targets for parametrization.

## **5.2.** Methods

#### 5.2.1. Selection of molecules

The molecules on **Table 5.1** were selected sequentially from the Data Set 1 (Appendix D, Table D.1) based on size (number of atoms), functional groups presents and amount of reference data available. For the initial parametrization, it was important to have as much QM references as possible so the smallest chemical specie of a given functional group would have an accurate description of its intermolecular potential terms. The molecules on

**Table 5.2** were selected from Data Set 2 (Appendix D, Table D.2) based on availability of initial parameters for a given molecule and again on the amount of Quantum data available. The number of molecules was set based on the availability of computational resources in the lab cluster.

#### 5.2.2. Computational details

**Molecular Polarizability**. This property was computed in-house using Psi4 software version 1.6.<sup>1</sup> For most molecules, this was computed at using MP2 method with the aug-cc-pVTZ basis set. The calculation of the dipole polarizability was done by a perturbative method, where the dipole was systematically perturbed by a small amount and the energy response was calculated. Then, the polarizability was computed, given induced dipole is proportional to the molecular polarizability times the total electric field of the system. This approach failed in some cases where the symmetry or the lack of a dipole moment in a particular direction caused the calculation to fail. For these cases, the polarizability is calculated with the CCSD method as implemented in Psi4. The later calculation is much more expensive than the former, which means the problem was not solved in a timely manner for this dissertation for a number of molecules. This, however, does not represent a major problem as the fit to the molecular polarizability is an inexpensive calculation, and the deviation from the two methods to compute molecular polarizability are not too significant.

Using the Polfit tool developed and explained in Chapter 4, the optimization of the atomic polarizability parameters was carried out as a first step to the optimization. The initial value was set by the Poltype 2 software<sup>2</sup>, and it was the same as that assigned for the AMOEBA force field.<sup>3</sup> A least squares algorithm was applied, as implemented in SciPy<sup>4</sup> version 1.8. The fit was done against every component of the molecular polarizability eigen vector (output of Psi4). for these properties usually converged within less than a hundred iterations.

Liquid and dimer calculations. Dimer interaction energies were computed using HIPPO through of the ANALYZE suite of the Tinker8 software.<sup>5</sup> Liquid phase simulations were performed using similar protocols as in Chapters 1 and 3. For every molecule, a 30 A cubic box was created such that the density matched that of the molecule for the temperature used in fitting. All bulk phase calculations were performed using the Tinker9 software<sup>6</sup>, with the implemented version implemented by me and Dr. Zhi Wang. All the simulations used a Langevin barostat and thermostat and RESPA integrator and the length of the simulation varied per molecule during fitting, dependent on the temperature. Throughout the cycles of fitting the simulation length was also adjusted, as was shown in Chapter 4. At every step, the box was minimized and simulated for at least 50 ps; to fit liquid properties, the minimum duration was 700 ps per iteration. Gas phase simulations used a stochastic Verlet integrator, and those simulations usually ran for 500 ps during fitting.

The results shown in the next session are for the production dynamics, which was a simulated using the same setup as in the fitting stage, but were ran for at least 10 ns. The first 3 ns was discarded as equilibration.

## 5.3. Results

The next pages and figures are going to show the results after every molecule listed in **Table 5.1** and **Table 5.2** were parameterized. Given the number of interactions per molecule, the majority of the individual results are listed in Appendix E. This chapter will discuss such results and give attention to the global outcome and average results.



*Figure 5.1.* Comparison between experimental density and HIPPO results for molecules in data set 1.



*Figure 5.2.* Comparison between experimental Enthalpy of Vaporization and HIPPO results for molecules in data set 1.

**Table 5.1**. 35 molecules from Data set 1 (Appendix D) selected to undergo the first round of parameterization. These molecules had parameters validated with QM and experimental liquid data.

	#ID	CID	Name	Formula	Functional Group	
1	1	6212	chloroform	CHCI3	chlorine	
2	3	3024	dibromomethane	CH2Br2	bromine	
3	4	6344	dichloromethane	CH2Cl2	chlorine	
4	5	712	formaldehyde	CH2O	aldehydes	
5	7	6323	bromomethane	CH3Br	bromine	
6	9	6375	nitromethane	CH3NO2	nitros	
7	11	6419	1,1,1,2,2-	C2HCl5	chlorine	
			pentachloroethane			
8	15	6342	methyl cyanide	C2H3N	nitriles	
9	18	11	1,2-dichloroethane	C2H4Cl2	chlorine	
10	20	6332	bromoethane	C2H5Br	bromine	
11	21	6337	chloroethane	C2H5Cl	chlorine	
12	25	6587	nitroethane	C2H5NO2	nitros	
13	26	8254	dimethyl ether	C2H6O	ethers	
14	27	702	ethanol	C2H6O	alcohols	
15	29	12232	dimethyl disulfide	C2H6S2	disulfides	
16	36	7854	ethyl cyanide	C3H5N	nitriles	
17	42	12586	1,3-dioxolane	C3H6O2	acetal	
18	45	6228	N,N-dimethylformamide	C3H7NO	amides	
19	51	7852	propan-1-amine	C3H9N	amines	
20	53	6360	isobutane	C4H10	hydrocarbons	
21	64	9260	pyrimidine	C4H4N2	pyrimidine; aromatics	
22	72	8028	oxolane	C4H8O	ethers; cyclics	
23	73	8023	ethoxyethene	C4H8O	ethers	
24	76	1127	tetrahydrothiophene	C4H8S	thiols; cyclics	
25	120	1140	toluene	C7H8	hydrocarbons; benzenes;	
					aromatics	
26	148	241	benzene	C6H6	benzenes	
27	151	9253	cyclopentane	C5H10	hydrocarbons	
28	152	1068	dimethyl sulfide	C2H6S	thiols; sulfides	
29	157	6327	methyl chloride	CH3CI	chlorine	
30	158	11638	methyl fluoride	CH3F	fluorine	
31	159	6345	methylene fluoride	CH2F2	fluorine	
32	160	10041	neopentane	C5H12	hydrocarbons	
33	161	8003	pentane	C5H12	hydrocarbons	
34	164	297	methane	CH4	hydrocarbons	
35	171	402	hydrogen sulfide	H2S	sulfides	

#	#ID	CID	Name	Formula	Functional Group
1	169	260	bromane	BrH	bromine
2	173	527	propanal	C3H6O	aldehvdes
3	178	768	hydrogen cyanide	CHN	nitriles
4	181	878	methanethiol	CH4S	thiols
5	190	1567	2-mercaptoethanol	C2H6OS	thiols
6	194	4685	1.4-dichlorobenzene	C6H4Cl2	chlorine: benzenes:
					aromatics
7	196	6058	2-aminoethanethiol	C2H7NS	amines; thiols
8	200	6324	ethane	C2H6	hydrocarbons
9	203	6334	propane	C3H8	hydrocarbons
10	204	6335	prop-1-yne	C3H4	hydrocarbons
11	205	6340	iodoethane	C2H5I	iodine
12	207	6343	ethanethiol	C2H6S	sulfides
13	209	6368	1,1-difluoroethane	C2H4F2	fluorine
14	210	6373	fluoroform	CHF3	fluorine
15	214	6403	2,2-dimethylbutane	C6H14	hydrocarbons
16	215	6431	1,1,1,2,2,2-hexafluoroethane	C2F6	fluorine
17	217	6556	2-methylbutane	C5H12	hvdrocarbons
18	219	6569	butan-2-one	C4H8O	ketones
19	221	6578	propanamide	C3H7NO	amides
20	223	7239	1,2-dichlorobenzene	C6H4Cl2	chlorine; benzenes
21	224	7288	pentan-3-one	C5H10O	ketones
22	225	7296	methylcyclopentane	C6H12	hydrocarbons; cyclics
23	228	7843	butane	C4H10	hydrocarbons
24	233	7950	1,3,5-trichlorobenzene	C6H3Cl3	chlorine; benzenes
25	236	8008	butanenitrile	C4H7N	nitriles
26	240	8018	2-methoxyethanamine	C3H9NO	ethers; amines
27	242	8025	ethyl formate	C3H6O2	esters
28	244	8070	N,N'-dimethylethane-1,2-diamine	C4H12N2	amines
29	245	8071	1,2-dimethoxyethane	C4H10O2	ethers
30	248	8078	cyclohexane	C6H12	hydrocarbons; cyclics
31	251	8252	prop-1-ene	C3H6	hydrocarbons
32	255	8894	tetrahydropyran	C5H10O	ethers; cyclics
33	256	9086	3-aminopropan-1-ol	C3H9NO	alcohols; amines
34	257	9261	pyrazine	C4H4N2	aromatics
35	259	9620	fluoroethane	C2H5F	fluorine
36	260	9633	1,1,1,2,2-pentafluoroethane	C2HF5	fluorine
37	261	9696	1,2,3,4,5-pentafluorobenzene	C6HF5	fluorine; benzenes
38	262	9745	1,3,5-trifluorobenzene	C6H3F3	fluorine; benzenes
39	263	9805	1,2,3,4,5,6-hexafluorobenzene	C6F6	fluorine; benzenes
40	264	9868	1,1,1-trifluoroethane	C2H3F3	fluorine
41	265	9890	1,1,2-trifluoroethane	C2H3F3	fluorine

*Table 5.2.* 101 molecules from Data set 2 (Appendix D) that have finalized parameters, after fitting to available ab initio references from NCIA<sup>7-10</sup> and DES370k<sup>11</sup> databases.

42	266	9998	1-fluoropropane	C3H7F	fluorine
43	279	10553	2-methylbut-2-ene	C5H10	hydrocarbons
44	281	10899	1-chloropropane	C3H7Cl	chlorine
45	284	10943	1,3-dichlorobenzene	C6H4Cl2	chlorine; benzenes
46	287	11182	1-methoxypropane	C4H10O	ethers
47	290	11250	2,3-dimethylbut-2-ene	C6H12	hydrocarbons
48	294	11855	1,2,3,4,5-pentachlorobenzene	C6HCl5	chlorine; benzenes
49	298	12051	N,N-diethylformamide	C5H11NO	amides
50	301	12223	1,2-difluoroethane	C2H4F2	fluorine
51	304	12243	2-methylpent-2-ene	C6H12	hydrocarbons
52	305	12251	2-methoxyacetic acid	C3H6O3	carboxylic_acids;
					ethers
53	306	12253	N-ethylacetamide	C4H9NO	amides
54	307	12309	pent-1-yne	C5H8	hydrocarbons
55	308	12310	pent-2-yne	C5H8	hydrocarbons
56	310	12319	N-ethylformamide	C3H7NO	amides
57	313	12418	1,1,1,2-tetrachloroethane	C2H2Cl4	chlorine
58	315	12703	N,N-diethylacetamide	C6H13NO	amides
59	317	12961	2-sulfanylacetamide	C2H5NOS	amides; thiols
60	319	13129	1,1,1,2-tetrafluoroethane	C2H2F4	fluorine
61	321	13134	dimethyl hydrogen phosphate	C2H7O4P	phospates
62	322	13195	5-methyl-1H-imidazole	C4H6N2	aromatics
63	328	16592	1-(methyldisulfanyl)propane	C4H10S2	disulfides
64	330	16908	1-fluorobutane	C4H9F	fluorine
65	333	22686	N-propylformamide	C4H9NO	amides
66	334	23110	1,2-bis(methylsulfanyl)ethane	C4H10S2	sulfides
67	336	24387	trichlorophosphane	CI3P	chlorine; phosphines
68	341	24622	1,1,1-trichloropropane	C3H5Cl3	chlorine
69	346	31242	4-ethylphenol	C8H10O	phenols
70	347	31275	1,4-dioxane	C4H8O2	ethers; cyclics
71	350	62540	methoxymethanol	C2H6O2	alcohols; ethers
72	351	66978	N,N'-dimethylpropane-1,3-diamine	C5H14N2	amines
73	353	67899	1,1,1-trifluoropropane	C3H5F3	fluorine
74	354	68152	3-hydroxypropanoic acid	C3H6O3	carboxylic_acids;
					alcohols
75	357	69020	2-aminoacetamide	C2H6N2O	amides; amines
76	358	69021	2-hydroxyacetamide	C2H5NO2	alcohols; amides
77	360	69657	N-(2-hydroxyethyl)formamide	C3H7NO2	alcohols; amides
78	363	74116	3-methoxypropan-1-ol	C4H10O2	ethers
79	364	75367	3-amino-3-oxopropanoic acid	C3H5NO3	carboxylic_acids;
					amides
80	365	75551	2-methylsulfanylacetic acid	C3H6O2S	carboxylic_acids;
					sulfides
81	366	75606	2-formamidoacetic acid	C3H5NO3	carboxylic_acids;
					amides
82	367	75891	3-(methylamino)propanoic acid	C4H9NO2	carboxylic_acids;
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					amines
83	368	77743	3-methylsulfanylpropan-1-amine	C4H11NS	amines; sulfides
84	369	78925	2-methylsulfanylethanol	C3H8OS	alcohols; sulfides
85	375	87697	2-methylsulfanylethanamine	C3H9NS	amines; sulfides
86	378	94671	disulfanylethane	C2H6S2	thiols; disulfides
87	379	97436	3-aminopropane-1-thiol	C3H9NS	amines; thiols
88	381	122370	methylsulfanylmethanethiol	C2H6S2	thiols; sulfides
89	399	140060	2-methoxyacetamide	C3H7NO2	ethers; amides
90	400	140180	1,3-dimethoxypropane	C5H12O2	ethers
91	402	141892	2-acetamido-N-methylpropanamide	C6H12N2O2	amides
92	406	192802	3-aminopropanamide	C3H8N2O	amides; amines
93	409	226108	N-(2-formamidoethyl)formamide	C4H8N2O2	amides
94	410	232267	2-formamidoacetamide	C3H6N2O2	amides
95	411	263087	3-methylsulfanylpropanamide	C4H9NOS	amides; sulfides
96	412	300977	2-methoxy-N-methylethanamine	C4H11NO	ethers; amines
97	414	350667	N-ethyl-N-methylformamide	C4H9NO	amides
98	419	524894	methoxymethoxyethane	C4H10O2	ethers
99	420	525376	1-	C5H12S2	sulfides
			(methylsulfanylmethylsulfanyl)propan		
			e		
100	421	525377	methylsulfanylmethylsulfanylethane	C4H10S2	sulfides
101	427	641811	thioacetone	C3H6S	thiones

	#ID	Name	Temp. (K)	Expt.	HIPPO	% Error
1	1	chloroform	298.15	1479.30	1477.95	-0.1
2	3	dibromomethane	298.15	2490.70	2435.11	-2.2
3	4	dichloromethane	298.15	1394.30	1306.43	-6.3
4	5	formaldehyde	253.65	810.53	865.46	6.8
5	7	bromomethane	276.65	1721.95	1702.45	-1.1
6	9	nitromethane	298.15	1130.40	1081.02	-4.4
7	11	1,1,1,2,2-pentachloroethane	293.15	1679.60	1748.66	4.1
8	15	methyl cyanide	298.15	776.00	760.42	-2.0
9	18	1,2-dichloroethane	298.15	1246.30	1215.05	-2.5
10	20	bromoethane	298.15	1449.30	1432.48	-1.2
11	21	chloroethane	273.15	923.90	919.78	-0.4
12	25	nitroethane	298.15	1044.10	1012.28	-3.0
13	26	dimethyl ether	240.00	742.08	748.97	0.9
14	27	ethanol	298.15	784.80	809.29	3.1
15	29	dimethyl disulfide	298.15	1057.32	1032.00	-2.4
16	36	ethyl cyanide	298.15	776.40	780.55	0.5
17	42	1,3-dioxolane	298.15	1064.40	1062.13	-0.2
18	45	N,N-dimethylformamide	298.15	943.30	945.19	0.2
19	51	propan-1-amine	298.15	711.47	710.38	-0.2
20	53	isobutane	243.65	613.53	637.29	3.9
21	64	pyrimidine	298.15	1016.40	1054.13	3.7
22	72	oxolane	298.15	883.70	859.53	-2.7
23	73	ethoxyethene	293.15	758.90	742.97	-2.1
24	76	tetrahydrothiophene	298.15	994.00	984.76	-0.9
25	120	toluene	298.15	861.90	869.85	0.9
26	148	benzene	298.15	874.00	878.09	0.5
27	151	cyclopentane	293.15	745.70	745.89	0.0
28	152	dimethyl sulfide	293.15	848.30	827.53	-2.4
29	157	methyl chloride	298.15	911.00	922.04	1.2
30	158	methyl fluoride	298.15	557.00	553.01	-0.7
31	159	methylene fluoride	221.00	1213.90	1155.52	-4.8
32	160	neopentane	298.15	585.20	595.17	1.7
33	161	pentane	293.15	626.20	637.34	1.8
34	164	methane	111.15	423.11	425.28	0.5
35	171	hydrogen sulfide	281.20	816.00	792.74	-2.9

*Table 5.3. HIPPO density compared to experimental values. Density is presented in kg/m3. Experimental values from references*  $^{12, 13}$ .

	#ID	fID Name T (K)		Expt.	HIPPO	% Error
1	1	chloroform	298.15	31.28	31.41	0.42
2	3	dibromomethane	298.15	37.45	37.31	-0.38
3	4	dichloromethane	298.15	28.82	27.72	-3.82
4	5	formaldehyde	253.65	23.08	22.60	-2.07
5	7	bromomethane	276.65	-	14.06	-
6	9	nitromethane	298.15	38.62	37.06	-4.04
7	11	1,1,1,2,2-pentachloroethane	293.15	46.29	46.93	1.38
8	15	methyl cyanide	298.15	33.23	33.49	0.77
9	18	1,2-dichloroethane	298.15	35.16	35.43	0.77
10	20	bromoethane	298.15	27.62	26.87	-2.71
11	21	chloroethane	273.15	25.39	25.43	0.17
12	25	nitroethane	298.15	40.24	40.20	-0.10
13	26	dimethyl ether	240.00	21.72	21.92	0.94
14	27	ethanol	298.15	42.32	44.66	5.53
15	29	dimethyl disulfide	298.15	38.32	39.09	2.00
16	36	ethyl cyanide	298.15	36.03	36.30	0.74
17	42	1,3-dioxolane	298.15	35.60	35.44	-0.44
18	45	N,N-dimethylformamide	298.15	47.57	46.29	-2.69
19	51	propan-1-amine	298.15	30.98	30.88	-0.31
20	53	isobutane	243.65	22.35	22.18	-0.78
21	64	pyrimidine	298.15	49.81	49.67	-0.28
22	72	oxolane	298.15	31.80	31.84	0.13
23	73	ethoxyethene	293.15	27.84	28.61	2.78
24	76	tetrahydrothiophene	298.15	38.62	37.60	-2.65
25	120	toluene	298.15	37.99	37.54	-1.17
26	148	benzene	298.15	33.83	33.27	-1.64
27	151	cyclopentane	293.15	27.30	27.27	-0.12
28	152	dimethyl sulfide	293.15	27.65	28.85	4.34
29	157	methyl chloride	298.15	18.92	19.09	0.92
30	158	methyl fluoride	298.15	-	8.81	-
31	159	methylene fluoride	221.00	-	19.25	-
32	160	neopentane	298.15	21.84	22.00	0.73
33	161	pentane	293.15	26.43	26.62	0.73
34	164	methane	111.15	8.17	8.54	4.59
35	171	hydrogen sulfide	281.20	15.90	14.54	-8.56

**Table 5.4.** HIPPO enthalpy of vaporization (Hvap) compared to experimental values. Hvap is presented in kJ/mol. Experimental values from references <sup>12, 13</sup>.

	#ID	Name T (K)		ε (expt)	HIPPO	% error
1	1	chloroform	298.15	4.71	4.13	-12.25
2	3	dibromomethane	298.15	7.23	6.80	-5.93
3	4	dichloromethane	298.15	8.82	8.04	-8.79
4	5	formaldehyde	253.65	-	44.57	-
5	7	bromomethane	276.65	9.71	7.96	-18.03
6	9	nitromethane	298.15	36.56	22.68	-37.96
7	11	1,1,1,2,2-pentachloroethane	293.15	-	4.01	-
8	15	methyl cyanide	298.15	35.69	30.12	-15.60
9	18	1,2-dichloroethane	298.15	10.13	10.60	4.62
10	20	bromoethane	298.15	9.01	9.09	0.93
11	21	chloroethane	273.15	10.41	10.13	-2.74
12	25	nitroethane	298.15	28.29	18.82	-33.48
13	26	dimethyl ether	240.00	6.88	7.98	15.97
14	27	ethanol	298.15	24.85	24.13	-2.90
15	29	dimethyl disulfide	298.15	9.60	6.22	-35.23
16	36	ethyl cyanide	298.15	29.32	23.98	-18.22
17	42	1,3-dioxolane	298.15	-	4.21	-
18	45	N,N-dimethylformamide	298.15	37.22	37.82	1.60
19	51	propan-1-amine	298.15	5.11	4.60	-10.00
20	53	isobutane	243.65	1.85	1.84	-0.36
21	64	pyrimidine	298.15	-	22.92	
22	72	oxolane	298.15	8.04	9.12	13.42
23	73	ethoxyethene	293.15	-	6.36	-
24	76	tetrahydrothiophene	298.15	-	8.00	-
25	120	toluene	298.15	2.37	2.42	1.94
26	148	benzene	298.15	2.27	2.31	1.73
27	151	cyclopentane	293.15	1.97	1.91	-2.83
28	152	dimethyl sulfide	293.15	6.70	5.91	-11.84
29	157	methyl chloride	298.15	9.76	9.70	-0.60
30	158	methyl fluoride	298.15	8.84	8.40	-4.94
31	159	methylene fluoride	221.00	26.91	26.14	-2.85
32	160	neopentane	298.15	1.77	1.75	-1.20
33	161	pentane	293.15	1.84	1.85	0.64
34	164	methane	111.15	1.63	1.67	2.25
35	171	hydrogen sulfide	281.20	6.03	5.46	-9.43

*Table 5.5. HIPPO dielectric constant* ( $\varepsilon$ ) *compared to experimental values. Dielectric constants* (*unitless*) *from references* <sup>12, 13</sup>.

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## Chapter 6. Future directions for the HIPPO model

#### 6.1. Bridging Classical Physics and Advanced Machine Learning.

The crux of contemporary force fields, such as HIPPO, lies in their ability to robustly represent intermolecular interactions in molecular systems. While HIPPO has taken great strides in accurately depicting these interactions, certain challenges, like the incomplete classical treatment of bond, angle, and torsion terms, persist. The conventional models, which employ simple harmonic or Morse bond potentials, overlook quantum behaviors like zero-point energy and don't account for the electronic structure's nuances, especially short-range through-space and through-bond interactions. In molecular dynamics, specific angle representations, like the N-Ca-C "tau" angle in proteins, play a pivotal role in defining behavior, yet classical methods have struggled to capture these intricacies.

Recent advancements in machine learning (ML) and neural networks present promising avenues to tackle these challenges. While ML has been pervasively adopted across various scientific fields, its integration into force field development, specifically with HIPPO, presents an exciting frontier. However, it's crucial to emphasize that not all force field components demand an ML-driven approach. HIPPO's treatment of intermolecular physics is commendably precise, interpretable, and extensible. Thus, the primary area ripe for ML enhancement within HIPPO lies in the short-range bonded quantum mechanical interactions.

The proposed framework will aim to harness the power of ML to develop highly accurate valence terms that encapsulate these interactions. By training a neural network on the discrepancies between quantum mechanical (QM) electronic structure values and HIPPO's existing nonbonded

and intermolecular potentials, we aim to derive a more complete model. As this dissertation has shown, we already possess extensive data with numerous QM configuration results, either by using existing databases or computing necessary calculations. As an expansion of this endeavor, and in collaboration with developers of the AMOEBA model, we can generate a comprehensive QM dataset encompassing various configurations of capped amino acids, nucleotides, and selected trimers. In our approach, we will draw inspiration from the recent ML-force field models<sup>1-3</sup>, with an emphasis on integrating short-range information to reduce computational loads.

The final step would see the amalgamation of these ML-derived forces with HIPPO's nonbonded potentials. This framework would be implemented in our GPU software, Tinker9. The overarching objective remains clear: seamlessly integrate ML models to capture the nuances of short-range intramolecular interactions while retaining HIPPO's strengths in long-range intermolecular domains.

In summation, the future of HIPPO lies at the crossroads of classical physics and advanced machine learning. By amalgamating the strengths of both worlds, we envision a force field model that stands unparalleled in accuracy and efficiency.

#### 6.2. Development of the HIPPO Force Field for Proteins

In our quest to advance the capabilities of molecular dynamics simulations for biological molecules, we are focusing on the development of the HIPPO force field for proteins, inspired by the groundwork laid by the AMOEBA protein model.<sup>4</sup> Given the vast complexity inherent in protein structures and dynamics, our development roadmap is layered and systematic. Given the experience and success of the AMOEBA protein model, HIPPO will follow on its footsteps. Below are the steps and methodologies we plan to employ:

#### Electrostatic Properties in the Gas Phase

A hallmark feature of a robust force field is its ability to seamlessly transition from gas phase to solution. To assess this, we will examine the electrostatic properties of amino acids in the gas phase and rigorously compare these to QM ab initio results. Ensuring accurate representation of peptide electrostatic properties across different conformations with a unified set of electrostatic parameters will be our primary goal.

#### Polyalanine Conformational Free Energy in Solution

Relying on oligopeptide conformational properties in solution, as used in AMOEBA, we will calibrate HIPPO's torsional parameters. By simulating peptides like Ala/Gly/Pro-based sequences and comparing the results to experimental NMR data, we aim to achieve a comprehensive understanding of the force field's capability in accurately representing peptide conformations in solution.

#### Proline and Glycine Conformational Free Energies in Solution

Proline and glycine, due to their unique structures and roles in proteins, warrant separate examinations. We will validate the  $\phi/\psi$  torsional angle distributions for these amino acids through REMD simulations of representative peptides, subsequently comparing the results to PDB statistical PMF maps.

#### Secondary Structure Distribution for the Ac- (AAQAA)3-NH2 Peptide

An effective protein force field should correctly predict the secondary structure of peptides and strike a balance in peptide conformations. Using REMD simulations, we will simulate longer helix-forming peptides, like Ac-(AAQAA)3-NH2, to investigate helix-coil transitions and compare the results to available experimental data.

#### Molecular Dynamics Simulations of Protein Systems

To ensure our force field performs well with larger systems, we will run molecular dynamics simulations on representative protein systems. These simulations will be compared against known X-ray or NMR structures.

#### Calculation of NMR Order Parameters

To further refine and validate our force field, we will compute NMR order parameters from our simulations and compare these values to experimental NMR measurements.

#### Calculation of Side Chain J-Couplings

As a final validation step, side chain J-couplings will be calculated and benchmarked against experimental values. This will offer insights into the accuracy of our force field in capturing side chain dynamics.

For larger molecules like proteins, a comparison of detailed simulations with limited data such as NMR J-coupling constants, database-derived statistical populations, and atomic structures from X-ray or NMR experiments is essential. The final validation and optimization of the HIPPO force field for proteins will be an iterative process, involving continuous feedback from both simulations and experimental data. In-depth investigations across a variety of protein-related research areas will be required to validate different components of our proposed force field thoroughly. By harnessing the strengths and learning from the limitations of the AMOEBA protein model, we are optimistic about developing a state-of-the-art HIPPO force field for proteins,

promising enhanced accuracy and utility in biological simulations.

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# Appendix A

Electrostatic Energy:

Core-Core:

$$U_{core-core} = Z_i T_{ij} Z_j$$
$$T_{ij} = \frac{1}{R}$$

Core-Density:

$$\begin{split} U_{core-density} &= Z_i \boldsymbol{T}_{ij}^* \vec{M}_j \\ \boldsymbol{T}_{ij}^* &= \begin{bmatrix} 1 \quad \nabla \quad \nabla^2 \end{bmatrix} T^* \\ T^* &= \frac{1}{R} f_1^{damp} \\ \nabla T^* &= -f_3^{damp} \frac{R_{\alpha}}{R^3} \\ \nabla^2 T^* &= f_5^{damp} \frac{3R_{\alpha}R_{\beta}}{R^5} - f_3^{damp} \frac{\delta_{\alpha\beta}}{R^3} \\ f_1^{damp} &= 1 - \left(1 + \frac{1}{2}\zeta_j R\right) e^{-\zeta_j R} \\ f_3^{damp} &= 1 - \left(1 + \zeta_j R + \frac{1}{2}(\zeta_j R)^2\right) e^{-\zeta_j R} \\ f_5^{damp} &= 1 - \left(1 + \zeta_j R + \frac{1}{2}(\zeta_j R)^2 + \frac{1}{6}(\zeta_j R)^3\right) e^{-\zeta_j R} \end{split}$$

Density-Density:

$$\begin{split} U_{density-density} &= \vec{M}_{i} T_{ij}^{overlap} \vec{M}_{j} \\ T_{ij}^{operlap} &= \begin{bmatrix} \frac{1}{N} & \nabla_{i} & \nabla_{i}^{2} & \nabla_{i}^{3} \\ \nabla_{i}^{2} & \nabla_{i}^{3} & \nabla_{i}^{4} \end{bmatrix} (T^{overlap}) \\ T^{overlap} &= \frac{1}{R} f_{1}^{overlap} \\ \nabla T^{overlap} &= -f_{3}^{overlap} \frac{R_{\alpha}}{R^{3}} \\ \nabla^{2} T^{overlap} &= f_{5}^{overlap} \frac{3R_{\alpha}R_{\beta}}{R^{5}} - f_{3}^{overlap} \frac{\delta_{\alpha\beta}}{R^{3}} \\ \nabla^{3} T^{overlap} &= -f_{7}^{overlap} \frac{15R_{\alpha}R_{\beta}R_{\gamma}}{R^{7}} + f_{5}^{overlap} \frac{3(R_{\alpha}\delta_{\beta\gamma} + R_{\beta}\delta_{\alpha\gamma} + R_{\gamma}\delta_{\alpha\beta})}{R^{5}} \\ \nabla^{4} T^{overlap} &= -f_{7}^{overlap} \frac{15S_{\alpha}R_{\beta}R_{\gamma}R_{\eta}}{R^{9}} \\ &= f_{9}^{overlap} \frac{105R_{\alpha}R_{\beta}R_{\gamma}R_{\eta}}{R^{9}} \\ -f_{7}^{overlap} \frac{15(R_{\alpha}R_{\beta}\delta_{\gamma\eta} + R_{\alpha}R_{\gamma}\delta_{\beta\eta} + R_{\alpha}R_{\eta}\delta_{\beta\gamma} + R_{\beta}R_{\gamma}\delta_{\alpha\eta} + R_{\beta}R_{\eta}\delta_{\alpha\gamma} + R_{\gamma}R_{\eta}\delta_{\alpha\beta})}{R^{7}} \\ &+ f_{5}^{overlap} \frac{3(\delta_{\alpha\beta}\delta_{\gamma\eta} + \delta_{\alpha\gamma}\delta_{\beta\eta} + \delta_{\alpha\eta}\delta_{\beta\gamma})}{R^{5}} \\ f_{1}^{overlap} &= \begin{cases} 1 - \left(1 + \frac{11}{16}\zeta R + \frac{3}{16}(\zeta R)^{2} + \frac{1}{48}(\zeta R)^{3}\right)e^{-\zeta R}, & \zeta_{i} = \zeta_{j} \\ 1 - A^{2}\left(1 + 2B + \frac{\zeta_{i}}{2}R\right)e^{-\zeta_{i}R} - B^{2}\left(1 + 2A + \frac{\zeta_{j}}{2}R\right)e^{-\zeta_{j}R}, & \zeta_{i} = \zeta_{j} \end{cases} \\ f_{3}^{overlap} &= \begin{cases} 1 - \left(1 + \zeta_{i}R + \frac{1}{2}(\zeta R)^{2} + \frac{7}{48}(\zeta R)^{3} + \frac{1}{48}(\zeta R)^{4}\right)e^{-\zeta R}, & \zeta_{i} = \zeta_{j} \\ 1 - A^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta R)^{2} - \frac{7}{48}(\zeta R)^{3} + \frac{1}{48}(\zeta R)^{4}\right)e^{-\zeta R}, & \zeta_{i} = \zeta_{j} \\ 2A^{2}B(1 + \zeta_{i}R)e^{-\zeta_{i}R} - 2B^{2}A(1 + \zeta_{j}R)e^{-\zeta_{i}R}, & \zeta_{i} \neq \zeta_{j} \end{cases}$$

$$f_{5}^{overlap} = \begin{cases} 1 - \left(1 + \zeta R + \frac{1}{2}(\zeta R)^{2} + \frac{1}{6}(\zeta R)^{3} + \frac{1}{24}(\zeta R)^{4} + \frac{1}{144}(\zeta R)^{5}\right)e^{-\zeta R}, & \zeta_{i} = \zeta_{j} \\ 1 - A^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3}\right)e^{-\zeta_{i}R} - \\ 2A^{2}B\left(1 + \zeta_{i}R + \frac{1}{3}(\zeta_{i}R)^{2}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{1}{3}(\zeta_{i}R)^{2}\right)e^{-\zeta_{i}R}, & \zeta_{i} \neq \zeta_{j} \end{cases}$$

$$f_{7}^{overlap} = \begin{cases} 1 - \left(1 + \zeta R + \frac{1}{2}(\zeta R)^{2} + \frac{1}{6}(\zeta R)^{3} + \frac{1}{24}(\zeta R)^{4} + \frac{1}{120}(\zeta R)^{5} + \frac{1}{720}(\zeta R)^{6}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{30}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{30}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{30}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{30}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{30}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{15}(\zeta_{i}R)^{3}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{24}(\zeta_{i}R)^{4} + \frac{1}{210}(\zeta_{i}R)^{5}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{1}{105}(\zeta_{i}R)^{4} + \frac{1}{210}(\zeta_{i}R)^{5}\right)e^{-\zeta_{i}R} - \\ B^{2}\left(1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} + \frac{4}{105}(\zeta_{i}R)^{4} + \frac{1}{210}(\zeta_{i}R)^{5}\right)e^{-\zeta_{i}R} - \\ 2A^{2}B\left(1 + \zeta_{i}R + \frac{3}{7}(\zeta_{i}R)^{2} + \frac{2}{21}(\zeta_{i}R)^{3} + \frac{1}{105}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{3}{7}(\zeta_{i}R)^{2} + \frac{2}{21}(\zeta_{i}R)^{3} + \frac{1}{105}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{3}{7}(\zeta_{i}R)^{2} + \frac{2}{21}(\zeta_{i}R)^{3} + \frac{1}{105}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{3}{7}(\zeta_{i}R)^{2} + \frac{2}{21}(\zeta_{i}R)^{3} + \frac{1}{105}(\zeta_{i}R)^{4}\right)e^{-\zeta_{i}R} - \\ 2B^{2}A\left(1 + \zeta_{i}R + \frac{3}{7}(\zeta_{i}R)^{2} + \frac{2}{21}(\zeta$$

## Appendix B

Permanent Electrostatic Field:

(field at induced dipole i, due to permanent moments of atom j)

$$\begin{split} \mathbf{F}_{i}^{perm}(R) &= Z_{j} \nabla \left(\frac{1}{R}\right) + \mathcal{Q}_{j} \nabla \left(\frac{1}{R}f^{damp}(R)\right) + \mathbf{\mu}_{j} \cdot \nabla^{2} \left(\frac{1}{R}f^{damp}(R)\right) + \mathbf{\Theta}_{j} : \nabla^{3} \left(\frac{1}{R}f^{damp}(R)\right) \\ \nabla \left(\frac{1}{R}f^{damp}(R)\right) &= -f_{3}^{damp}\frac{R_{\alpha}}{R^{3}} \\ \nabla^{2} \left(\frac{1}{R}f^{damp}(R)\right) &= f_{5}^{damp}\frac{3R_{\alpha}R_{\beta}}{R^{5}} - f_{3}^{damp}\frac{\delta_{\alpha\beta}}{R^{3}} \\ \nabla^{3} \left(\frac{1}{R}f^{damp}(R)\right) &= -f_{7}^{damp}\frac{15R_{\alpha}R_{\beta}R_{\gamma}}{R^{7}} + f_{5}^{damp}\frac{3(R_{\alpha}\delta_{\beta\gamma} + R_{\beta}\delta_{\alpha\gamma} + R_{\gamma}\delta_{\alpha\beta})}{R^{5}} \\ f_{3}^{damp} &= 1 - \left(1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2}\right)e^{-\zeta_{j}R} \\ f_{5}^{damp} &= 1 - \left(1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2} + \frac{1}{6}(\zeta_{j}R)^{3}\right)e^{-\zeta_{j}R} \\ f_{7}^{damp} &= 1 - \left(1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2} + \frac{1}{6}(\zeta_{j}R)^{3} + \frac{1}{30}(\zeta_{j}R)^{4}\right)e^{-\zeta_{j}R} \end{split}$$

Induced Dipole Electrostatic Field:

(field at induced dipole i, due to induced dipole j)

$$\begin{split} \mathbf{F}_{i}^{ind}(R) &= \mathbf{\mu}_{i}^{ind} \cdot \nabla^{2} \left( \frac{1}{R} f^{overlap}(R) \right) \\ \nabla^{2} \left( \frac{1}{R} f^{overlap}(R) \right) &= f_{5}^{overlap} \frac{3R_{\alpha}R_{\beta}}{R^{5}} - f_{3}^{overlap} \frac{\delta_{\alpha\beta}}{R^{3}} \\ f_{3}^{overlap} &= \begin{cases} 1 - \left( 1 + \zeta R + \frac{1}{2}(\zeta R)^{2} + \frac{7}{48}(\zeta R)^{3} + \frac{1}{48}(\zeta R)^{4} \right) e^{-\alpha R}, & \zeta_{i} = \zeta_{j} \\ 1 - A^{2} \left( 1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} \right) e^{-\zeta_{i}R} - B^{2} \left( 1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2} \right) e^{-\zeta_{j}R} - 2A^{2}B(1 + \zeta_{i}R)e^{-\zeta_{i}R} - 2B^{2}A(1 + \zeta_{j}R)e^{-\zeta_{j}R}, & \zeta_{i} \neq \zeta_{j} \end{cases} \\ f_{5}^{overlap} &= \begin{cases} 1 - \left( 1 + \zeta R + \frac{1}{2}(\zeta R)^{2} + \frac{1}{6}(\zeta R)^{3} + \frac{1}{24}(\zeta R)^{4} + \frac{1}{144}(\zeta R)^{5} \right) e^{-\zeta R}, & \zeta_{i} = \zeta_{j} \\ 1 - A^{2} \left( 1 + \zeta_{i}R + \frac{1}{2}(\zeta_{i}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} \right) e^{-\zeta_{i}R} - B^{2} \left( 1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} \right) e^{-\zeta_{i}R} - B^{2} \left( 1 + \zeta_{j}R + \frac{1}{2}(\zeta_{j}R)^{2} + \frac{1}{6}(\zeta_{i}R)^{3} \right) e^{-\zeta_{i}R} - 2A^{2}B \left( 1 + \zeta_{i}R + \frac{1}{3}(\zeta_{i}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{j}R + \frac{1}{3}(\zeta_{j}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{i}R + \frac{1}{3}(\zeta_{i}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{i}R + \frac{1}{3}(\zeta_{i}R)^{2} \right) e^{-\zeta_{i}R} - 2B^{2}A \left( 1 + \zeta_{i}R + \frac{1}{3$$

# Appendix C

Pauli Repulsion:

$$\begin{split} & U_{ij} = \frac{K_i K_j}{R} S_{total}^2 \\ & \frac{S_{total}^2}{R} = \vec{M}_i \mathbf{T}_{ij}^{repulsion} \vec{M}_j \\ & \mathbf{T}_{ij}^{repulsion} = \begin{bmatrix} \frac{1}{V} & \frac{V}{\nabla^2} & \frac{\nabla^2}{\nabla^3} \\ \frac{\nabla}{\nabla^2} & \frac{\nabla^2}{\nabla^3} & \frac{\nabla^4}{\nabla^4} \end{bmatrix} (\mathsf{T}^{pauli}) \\ & \mathsf{T}^{pauli} = \frac{\zeta_i^3 \zeta_j^3}{R} f_1^{rep} \\ & \nabla \mathsf{T}^{pauli} = -f_5^{rep} \mathsf{R}_\alpha \\ & \nabla^2 \mathsf{T}^{pauli} = f_5^{rep} \mathsf{1SR}_\alpha \mathsf{R}_\beta - f_3^{rep} \delta_{\alpha\beta} \\ & \nabla^3 \mathsf{T}^{pauli} = -f_7^{rep} \mathsf{1SR}_\alpha \mathsf{R}_\beta \mathsf{R}_\gamma + f_5^{rep} \mathsf{3}(\mathsf{R}_\alpha \delta_{\beta\gamma} + \mathsf{R}_\beta \delta_{\alpha\gamma} + \mathsf{R}_\gamma \delta_{\alpha\beta}) \\ & \nabla^4 \mathsf{T}^{pauli} = f_9^{rep} \mathsf{10SR}_\alpha \mathsf{R}_\beta \mathsf{R}_\gamma \mathsf{R}_\eta \\ & - f_7^{rep} \mathsf{15}(\mathsf{R}_\alpha \mathsf{R}_\beta \delta_{\gamma\eta} + \mathsf{R}_\alpha \mathsf{R}_\gamma \delta_{\beta\eta} + \mathsf{R}_\alpha \mathsf{R}_\eta \delta_{\beta\gamma} + \mathsf{R}_\beta \mathsf{R}_\gamma \delta_{\alpha\eta} + \mathsf{R}_\beta \mathsf{R}_\eta \delta_{\alpha\gamma} + \mathsf{R}_\gamma \mathsf{R}_\eta \delta_{\alpha\beta}) \\ & + f_5^{rep} \mathsf{3}(\delta_{\alpha\beta} \delta_{\gamma\eta} + \delta_{\alpha\gamma} \delta_{\beta\eta} + \delta_{\alpha\eta} \delta_{\beta\gamma}) \\ & f_1^{rep} = (f_{exp})^2 \\ & f_{exp} = \begin{cases} \frac{1}{\zeta_s^2} \left(1 + \frac{\zeta_s}{2} + \frac{1}{3} (\frac{\zeta_s}{2})^2\right) e^{\frac{-\zeta_s}{2}}}{(\frac{1}{2X^3 \mathsf{R}} \left[ \zeta_i (\mathsf{RX} - 2\zeta_j) e^{\frac{-\zeta_s}{2}} + \zeta_j (\mathsf{RX} + 2\zeta_i) e^{\frac{-\zeta_j \mathsf{R}}{2}} \right], \quad \zeta_i \neq \zeta_j \end{cases}$$

 $f_3^{\rm rep} = 2 f_{\rm exp} f_{\rm exp}'$ 

$$\begin{split} f_{exp}' &= \begin{cases} \frac{1}{\zeta^3} \frac{1}{3} \left(\frac{\zeta}{2}\right)^2 \left(1 + \frac{\zeta R}{2}\right) e^{\frac{-\zeta R}{2}}, & \zeta_i = \zeta_j \\ \frac{1}{2X^3 R} \left[ \left(\frac{1}{2} \zeta_i \zeta_j X - \frac{\zeta_i \zeta_j^2}{R} - \frac{2\zeta_i \zeta_j}{R^2}\right) e^{\frac{-\zeta_j R}{2}} + \left(\frac{1}{2} \zeta_i \zeta_j X + \frac{\zeta_j \zeta_i^2}{R} + \frac{2\zeta_i \zeta_j}{R^2}\right) e^{\frac{-\zeta_i R}{2}} \right], \quad \zeta_i \neq \zeta_j \\ f_5^{rep} &= 2 (f_{exp} f_{exp}'' + f_{exp}' f_{exp}') \\ f_5^{rep} &= \begin{cases} \frac{1}{\zeta^3} \frac{1}{9} \left(\frac{\zeta}{2}\right)^4 e^{\frac{-\zeta R}{2}}, & \zeta_i = \zeta_j \\ \frac{1}{\zeta^3} \frac{1}{9} \left(\frac{\zeta}{2}\right)^4 e^{\frac{-\zeta R}{2}}, & \zeta_i = \zeta_j \\ \frac{1}{2X^3 R^2} \left[ \left(\frac{1}{4} \zeta_i \zeta_j^2 X - \frac{\zeta_i \zeta_j^3}{2R} + \frac{\zeta_i \zeta_j X}{2R} - \frac{3\zeta_i \zeta_j^2}{R^2} - \frac{6\zeta_i \zeta_j}{R^5}\right) e^{\frac{-\zeta_i R}{2}} + \\ \left(\frac{1}{4} \zeta_j \zeta_i^2 X + \frac{\zeta_j \zeta_i^3}{2R} + \frac{\zeta_j \zeta_i X}{2R} + \frac{3\zeta_j \zeta_i^2}{R^2} + \frac{6\zeta_j \zeta_i}{R^5}\right) e^{\frac{-\zeta_i R}{2}} \end{bmatrix}, \quad \zeta_i \neq \zeta_j \\ f_7^{rep} &= 2 (f_{exp} f_{exp}'' + 3f_{exp}'' f_{exp}') \\ \end{array}$$

 $f_{exp}^{\prime\prime\prime}$ 

$$= \begin{cases} \frac{1}{\zeta^{3}} \frac{1}{45} \left(\frac{\zeta}{2}\right)^{5} \frac{1}{R} e^{\frac{-\zeta R}{2}}, & \zeta_{i} = \zeta_{j} \\ \frac{1}{\zeta^{3}} \frac{1}{45} \left(\frac{\zeta}{2}\right)^{5} \frac{1}{R} e^{\frac{-\zeta R}{2}}, & \zeta_{i} = \zeta_{j} \\ \frac{1}{2X^{3}R^{3}} \left[ \left(\frac{1}{8} \zeta_{i} \zeta_{j}^{3} X + \frac{3}{4} \frac{\zeta_{i} \zeta_{j}^{2} X}{R} + \frac{3}{2} \frac{\zeta_{i} \zeta_{j} X}{R^{2}} - \frac{1}{4} \frac{\zeta_{i} \zeta_{j}^{4}}{R} - \frac{3\zeta_{i} \zeta_{j}^{3}}{R^{2}} - \frac{15\zeta_{i} \zeta_{j}^{2}}{R^{3}} - \frac{30\zeta_{i} \zeta_{j}}{R^{4}} \right) e^{\frac{-\zeta_{j} R}{2}} + \\ \left(\frac{1}{8} \zeta_{j} \zeta_{i}^{3} X + \frac{3}{4} \frac{\zeta_{j} \zeta_{i}^{2} X}{R} + \frac{3}{2} \frac{\zeta_{j} \zeta_{i} X}{R^{2}} + \frac{1}{4} \frac{\zeta_{j} \zeta_{i}^{4}}{R} + \frac{3\zeta_{j} \zeta_{i}^{3}}{R^{2}} + \frac{15\zeta_{j} \zeta_{i}^{2}}{R^{3}} + \frac{30\zeta_{j} \zeta_{i}}{R^{4}} \right) e^{\frac{-\zeta_{i} R}{2}} \end{bmatrix}, \quad \zeta_{i} \neq \zeta_{j}$$

$$f_{9}^{i^{c}p} = 2(f_{exp}f_{exp}^{im} + 4f_{exp}^{im}f_{exp}^{i} + 3f_{exp}^{im}f_{exp}^{im})$$

$$\begin{cases} \frac{1}{\zeta^{3}}\frac{1}{315}\left(\frac{\zeta}{2}\right)^{5}\frac{1}{R^{3}}\left(1 + \frac{\zeta R}{2}\right)e^{\frac{-\zeta R}{2}}, \qquad \zeta_{i} = \zeta_{j} \\ \left[\left(\frac{1}{16}\zeta_{i}\zeta_{j}^{4}X + \frac{3}{4}\frac{\zeta_{i}\zeta_{j}^{3}X}{R} + \frac{15}{4}\frac{\zeta_{i}\zeta_{j}^{2}X}{R^{2}} + \frac{15}{2}\frac{\zeta_{i}\zeta_{j}X}{R^{3}} - \frac{\zeta_{j}R}{R} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}}{R^{3}} - \frac{105\zeta_{i}\zeta_{j}^{2}}{R^{3}} - \frac{210\zeta_{i}\zeta_{j}}{R^{5}}\right)e^{\frac{-\zeta_{j}R}{2}} + \frac{\zeta_{i}\zeta_{j}}{R} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}^{3}X}{R^{4}} + \frac{15}{4}\frac{\zeta_{j}\zeta_{i}^{2}X}{R^{3}} - \frac{105\zeta_{i}\zeta_{j}^{2}}{R^{5}} + \frac{15}{2}\frac{\zeta_{j}\zeta_{i}X}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}^{3}X}{R^{2}} + \frac{15}{2}\frac{\zeta_{j}\zeta_{i}X}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}X}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}X}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}}{R^{3}} + \frac{1}{2}\frac{\zeta_{j}\zeta_{i}}{R^{3}} + \frac{210\zeta_{j}\zeta_{i}}{R^{5}}\right)e^{\frac{-\zeta_{i}R}{2}} + \frac{\zeta_{i}}{2}\frac{\zeta_{i}}{R^{5}} + \frac{\zeta_{i}}{2}\frac{\zeta_{i}\zeta_{i}}{R^{3}} + \frac{45}{2}\frac{\zeta_{j}\zeta_{i}}{R^{3}} + \frac{105\zeta_{j}\zeta_{i}^{2}}{R^{4}} + \frac{210\zeta_{j}\zeta_{i}}{R^{5}}\right)e^{\frac{-\zeta_{i}R}{2}} + \frac{\zeta_{i}}{2}\frac{\zeta_{i}}{R^{5}} + \frac{\zeta_{i}}{2}\frac{\zeta_{i}}{R^{3}} + \frac{1}{2}\frac{\zeta_{i}}{R^{3}} + \frac{1}{2}\frac{\zeta_{i}}{R^{4}} + \frac{210\zeta_{j}\zeta_{i}}{R^{5}}\right)e^{\frac{-\zeta_{i}R}{2}}$$

## Appendix D

Table D.1: Data set 1. 165 molecules with liquid experimental data and Quantum calculation references. CID is the *Pubchem* (<u>https://pubchem.ncbi.nlm.nih.gov</u>) assigned number.

#ID	CID	Name	Formula	Functional Groups
1	6212	chloroform	CHCl3	chlorine
2	6370	dichloro(fluoro)methane	CHCl2F	chlorine; fluorine
3	3024	dibromomethane	CH2Br2	bromine
4	6344	dichloromethane	CH2Cl2	chlorine
5	712	formaldehyde	CH2O	aldehydes
6	284	formic acid	CH2O2	carboxylic_acids
7	6323	bromomethane	CH3Br	bromine
8	713	formamide	CH3NO	amides
9	6375	nitromethane	CH3NO2	nitros
10	887	methanol	CH4O	alcohols
11	6419	1,1,1,2,2-pentachloroethane	C2HCl5	chlorine
12	6591	1,1,2,2-tetrachloroethane	C2H2Cl4	chlorine
13	6366	1,1-dichloroethene	C2H2Cl2	chlorine
14	6574	1,1,2-trichloroethane	C2H3Cl3	chlorine
15	6342	methyl cyanide	C2H3N	nitriles
16	7839	1,2-dibromoethane	C2H4Br2	bromine
17	6365	1,1-dichloroethane	C2H4Cl2	chlorine
18	11	1,2-dichloroethane	C2H4Cl2	chlorine
19	7865	methyl formate	C2H4O2	esters
20	6332	bromoethane	C2H5Br	bromine
21	6337	chloroethane	C2H5Cl	chlorine
22	34	2-chloroethanol	C2H5ClO	chlorine; alcohols
23	178	acetamide	C2H5NO	amides
24	31254	N-methylformamide	C2H5NO	amides
25	6587	nitroethane	C2H5NO2	nitros
26	8254	dimethyl ether	C2H6O	ethers
27	702	ethanol	C2H6O	alcohols
28	10902	1,2-ethanedithiol	C2H6S2	thiols
29	12232	dimethyl disulfide	C2H6S2	disulfides
30	679	dimethyl sulfoxide	C2H6OS	sulfoxides
31	1068	methylsulfanylmethane	C2H6S	sulfides
32	700	2-aminoethanol	C2H7NO	alcohols; amines
33	3301	ethane-1,2-diamine	C2H8N2	amines
34	7855	prop-2-enenitrile	C3H3N	nitriles
35	7303	1,3-dioxolan-2-one	C3H4O3	esters; cyclics
36	7854	ethyl cyanide	C3H5N	nitriles
37	6553	1,2-dibromopropane	C3H6Br2	bromine
38	8881	1,3-dichloropropane	C3H6Cl2	chlorine
39	146261	(2R)-2-methyloxirane	C3H6O	epoxide
40	180	acetone	C3H6O	ketones

41	6584	methyl acetate	C3H6O2	esters
42	12586	1,3-dioxolane	C3H6O2	acetal
43	6362	2-iodopropane	C3H7I	iodine
44	7840	1-bromopropane	C3H7Br	bromine
45	6228	N,N-dimethylformamide	C3H7NO	amides
46	6582	N-methylacetamide	C3H7NO	amides
47	7903	1-nitropropane	C3H7NO2	nitros
48	398	2-nitropropane	C3H7NO2	nitros
49	8020	dimethoxymethane	C3H8O2	ethers
50	753	propane-1,2,3-triol	C3H8O3	alcohols
51	7852	propan-1-amine	C3H9N	amines
52	6363	propan-2-amine	C3H9N	amines
53	6360	isobutane	C4H10	hydrocarbons
54	9609	ethylsulfanylethane	C4H10S	thiols
55	8012	butane-1-thiol	C4H10S	thiols
56	263	butan-1-ol	C4H10O	alcohols
57	6386	2-methylpropan-2-ol	C4H10O	alcohols
58	8064	butane-1,4-diol	C4H10O2	alcohols
59	8117	2,2'-Oxydiethanol	C4H10O3	alcohols; ethers
60	8021	N-ethylethanamine	C4H11N	amines
61	8007	butan-1-amine	C4H11N	amines
62	6385	2-methylpropan-2-amine	C4H11N	amines
63	8113	2-(2-hydroxyethylamino)ethanol	C4H11NO2	alcohols; amines
64	9260	pyrimidine	C4H4N2	pyrimidine; aromatics
65	8029	furan	C4H4O	ethers; cyclics; aromatics
66	8030	thiophene	C4H4S	thiols; cyclics; aromatics;
		-		sulfides
67	8027	1H-pyrrole	C4H5N	amines; pyrroles; cyclics;
				aromatics
68	7904	ethenyl acetate	C4H6O2	esters
69	7302	oxolan-2-one	C4H6O2	esters
70	7918	acetyl acetate	C4H6O3	anhydride
71	8059	1,4-dichlorobutane	C4H8Cl2	chlorine
72	8028	oxolane	C4H8O	ethers; cyclics
73	8023	ethoxyethene	C4H8O	ethers
74				
75	8857	ethyl acetate	C4H8O2	esters
15	8857 31347	ethyl acetate tetrahydrothiophene 1,1-dioxide	C4H8O2 C4H8O2S	esters thiols; cyclics
76	8857 31347 1127	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene	C4H8O2 C4H8O2S C4H8S	esters thiols; cyclics thiols; cyclics
75 76 77	8857 31347 1127 8002	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane	C4H8O2 C4H8O2S C4H8S C4H9Br	esters thiols; cyclics thiols; cyclics bromine
75 76 77 78	8857 31347 1127 8002 8005	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane 1-chlorobutane	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl	esters thiols; cyclics thiols; cyclics bromine chlorine
76 77 78 79	8857 31347 1127 8002 8005 31268	ethyl acetatetetrahydrothiophene 1,1-dioxidetetrahydrothiophene1-bromobutane1-chlorobutanepyrrolidine	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9N	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles
76 77 78 79 80	8857 31347 1127 8002 8005 31268 31374	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane 1-chlorobutane pyrrolidine N,N-dimethylacetamide	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9N C4H9NO	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides
76 77 78 79 80 81	8857 31347 1127 8002 8005 31268 31374 8083	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane 1-chlorobutane pyrrolidine N,N-dimethylacetamide morpholine	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9N C4H9NO C4H9NO	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides ethers; amines; cyclics
$     \begin{array}{r}       73 \\       76 \\       77 \\       78 \\       79 \\       80 \\       81 \\       82 \\     \end{array} $	8857 31347 1127 8002 8005 31268 31374 8083 1049	ethyl acetatetetrahydrothiophene 1,1-dioxidetetrahydrothiophene1-bromobutane1-chlorobutanepyrrolidineN,N-dimethylacetamidemorpholinepyridine	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9N C4H9NO C4H9NO C4H9NO C5H5N	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides ethers; amines; cyclics pyridines; aromatics
75 76 77 78 79 80 81 82 83	8857 31347 1127 8002 8005 31268 31374 8083 1049 8452	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane 1-chlorobutane pyrrolidine N,N-dimethylacetamide morpholine pyridine cyclopentanone	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9NO C4H9NO C4H9NO C5H5N C5H8O	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides ethers; amines; cyclics pyridines; aromatics ketones; cyclics
73 76 77 78 79 80 81 82 83 83 84	8857 31347 1127 8002 8005 31268 31374 8083 1049 8452 13004	ethyl acetate tetrahydrothiophene 1,1-dioxide tetrahydrothiophene 1-bromobutane 1-chlorobutane pyrrolidine N,N-dimethylacetamide morpholine pyridine cyclopentanone 1-cyclopropylethanone	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9NO C4H9NO C4H9NO C5H5N C5H8O C5H8O	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides ethers; amines; cyclics pyridines; aromatics ketones; cyclics ketones; cyclics
73 76 77 78 79 80 81 82 83 84 84 85	8857 31347 1127 8002 8005 31268 31374 8083 1049 8452 13004 31261	ethyl acetatetetrahydrothiophene 1,1-dioxidetetrahydrothiophene1-bromobutane1-chlorobutanepyrrolidineN,N-dimethylacetamidemorpholinepyridinecyclopentanone1-cyclopropylethanonepentane-2,4-dione	C4H8O2 C4H8O2S C4H8S C4H9Br C4H9Cl C4H9NO C4H9NO C4H9NO C5H5N C5H8O C5H8O C5H8O2	esters thiols; cyclics thiols; cyclics bromine chlorine pyrroles amides ethers; amines; cyclics pyridines; aromatics ketones; cyclics ketones; cyclics ketones

87	8061	pentanenitrile	C5H9N	nitriles
88	7749	ethyl propanoate	C5H10O2	esters
89	7766	diethyl carbonate	C5H10O3	esters
90	6276	pentan-1-ol	C5H12O	alcohols
91	11428	pentan-3-ol	C5H12O	alcohols
92	6405	2-methylbutan-2-ol	C5H12O	alcohols
93	8105	pentane-1,5-diol	C5H12O2	alcohols
94	12019	pentan-3-amine	C5H13N	amines
95	11084	1,2,3,4-tetrafluorobenzene	C6H2F4	fluorine; benzenes
96	16910	1,2,3,5-tetrafluorobenzene	C6H2F4	fluorine; benzenes
97	9741	1,3-difluorobenzene	C6H4F2	fluorine; benzenes;
				aromatics
98	9706	1,2-difluorobenzene	C6H4F2	fluorine; benzenes
99	10008	fluorobenzene	C6H5F	fluorine; benzenes;
				aromatics
100	7416	nitrobenzene	C6H5NO2	nitros; benzenes; aromatics
101	7240	2-chloroaniline	C6H6ClN	chlorine; benzenes
102	996	phenol	C6H6O	alcohols; benzenes; phenols;
				aromatics
103	7969	benzenethiol	C6H6S	thiols; benzenes
104	7975	2-methylpyridine	C6H7N	pyridines
105	7970	3-methylpyridine	C6H7N	pyridines; aromatics
106	7963	4-methylpyridine	C6H7N	pyridines
107	7967	cyclohexanone	C6H10O	ketones; cyclics
108	639661	(E)-hex-2-ene	C6H12	hydrocarbons
109	11583	hexan-2-one	C6H12O	ketones
110	31264	2,4,6-trimethyl-1,3,5-trioxane	C6H12O3	ethers; cyclics
111	7965	cyclohexanamine	C6H13N	amines; cyclics
112	7914	2-propan-2-yloxypropane	C6H14O	ethers
113	8150	1-methoxy-2-(2-methoxyethoxy)ethane	C6H14O3	ethers
114	6535	triethyl phosphate	C6H15O4P	phospates
115	8471	N,N-diethylethanamine	C6H15N	amines
116	7912	N-propan-2-ylpropan-2-amine	C6H15N	amines
117	7368	trifluoromethylbenzene	C7H5F3	fluorine; benzenes
118	7505	benzonitrile	C7H5N	nitriles; benzenes
119	240	benzaldehyde	C7H6O	aldehydes; benzenes
120	1140	toluene	C7H8	hydrocarbons; benzenes;
				aromatics
121	7519	methoxybenzene	C7H8O	ethers; benzenes
122	244	phenylmethanol	C7H8O	alcohols; benzenes; phenols
123	335	2-methylphenol	C7H8O	benzenes; phenols
124	342	3-methylphenol	C7H8O	benzenes; phenols
125	2879	4-methylphenol	C7H8O	benzenes; phenols;
				aromatics
126	7761	diethyl propanedioate	C7H12O4	esters
127	11271	2,4-dimethylpentan-3-one	C7H14O	ketones
128	8051	heptan-2-one	C7H14O	ketones
129	7501	ethenylbenzene	C8H8	hydrocarbons; benzenes
130	7410	1-phenylethanone	C8H8O	ketones; benzenes

131	7150	methyl benzoate	C8H8O2	esters; benzenes
132	4133	methyl 2-hydroxybenzoate	C8H8O3	esters; benzenes; phenols
133	7500	ethylbenzene	C8H10	hydrocarbons; benzenes
134	7237	1,2-dimethylbenzene	C8H10	hydrocarbons; benzenes
135	7043	1,2-dimethoxybenzene	C8H10O2	ethers; benzenes
136	7953	2,4,6-trimethylpyridine	C8H11N	aromatics; pyridinies
137	957	octan-1-ol	C8H18O	alcohols
138	8909	1-butoxybutane	C8H18O	ethers
139	8148	N-butylbutan-1-amine	C8H19N	amines
140	8405	isoquinoline	C9H7N	benzenes; quinolines
141	7047	quinoline	C9H7N	benzenes; quinolines
142	7406	(1-methylethyl)benzene	C9H12	hydrocarbons; benzenes
143	7247	1,2,4-trimethylbenzene	C9H12	hydrocarbons; benzenes
144	7958	2,6-dimethylheptan-4-one	C9H18O	ketones
145	7003	1-chloronaphthalene	C10H7Cl	chlorine; benzenes
146	7583	phenoxybenzene	C12H10O	ethers; benzenes
147	176	acetic acid	C2H4O2	carboxylic_acids
148	241	benzene	C6H6	benzenes
149	7961	bromobenzene	C6H5Br	bromine; benzenes
150	7964	chlorobenzene	C6H5Cl	chlorine; benzenes
151	9253	cyclopentane	C5H10	hydrocarbons
152	1068	dimethyl sulfide	C2H6S	thiols
153	6325	ethene	C2H4	hydrocarbons
154	795	imidazole	C3H4N2	nucleic_acids; aromatics
155	798	indole	C8H7N	nucleic_acids; aromatics
156	6329	methyl amine	CH5N	amines
157	6327	methyl chloride	CH3Cl	chlorine
158	11638	methyl fluoride	CH3F	fluorine
159	6345	methylene fluoride	CH2F2	fluorine
160	10041	neopentane	C5H12	hydrocarbons
161	8003	pentane	C5H12	hydrocarbons
162	5943	carbon tetrachloride	CCl4	chlorine
163	6115	aniline	C6H7N	aromatics; benzenes
164	297	methane	CH4	hydrocarbons
165	222	ammonia	H3N	amines

Table D.2: Data set 2. 339 molecules without liquid experimental data included. These molecules were selected from the NCIA and DES370k databases. The selection process is discussed in chapter 3.

	#ID	CID	Name	Formula
1	166	174	ethane-1,2-diol	C2H6O2
2	167	177	acetaldehyde	C2H4O
3	168	239	3-aminopropanoic acid	C3H7NO2
4	169	260	bromane	BrH
5	170	313	chlorane	CIH
6	171	402	hydrogen sulfide	H2S
7	172	428	propane-1,3-diamine	C3H10N2
8	173	527	propanal	C3H6O
9	174	563	3-methylsulfanylpropanoic acid	C4H8O2S
10	175	674	N-methylmethanamine	C2H7N
11	176	750	2-aminoacetic acid	C2H5NO2
12	177	757	2-hydroxyacetic acid	C2H4O3
13	178	768	hydrogen cyanide	CHN
14	179	807	molecular iodine	12
15	180	867	propanedioic acid	C3H4O4
16	181	878	methanethiol	CH4S
17	183	1004	phosphoric acid	H3O4P
18	184	1031	propan-1-ol	C3H8O
19	185	1032	propanoic acid	C3H6O2
20	186	1088	2-(methylamino)acetic acid	C3H7NO2
21	187	1119	sulfur dioxide	02S
22	188	1133	2-sulfanylacetic acid	C2H4O2S
23	189	1146	N,N-dimethylmethanamine	C3H9N
24	190	1567	2-mercaptoethanol	C2H6OS
25	191	1672	3-methoxypropan-1-amine	C4H11NO
26	192	3283	ethoxyethane	C4H10O
27	193	3776	propan-2-ol	C3H8O
28	194	4685	1,4-dichlorobenzene	C6H4Cl2
29	195	5558	bromoform	CHBr3
30	196	6058	2-aminoethanethiol	C2H7NS
31	197	6213	methylsulfonylmethane	C2H6O2S
32	198	6214	1,1,1,2,2,2-hexachloroethane	C2Cl6
33	199	6278	1,1,1-trichloroethane	C2H3Cl3
34	200	6324	ethane	C2H6
35	201	6326	acetylene	C2H2
36	202	6328	iodomethane	CH3I
37	203	6334	propane	C3H8
38	204	6335	prop-1-yne	C3H4

39	205	6340	iodoethane	C2H5I
40	206	6341	ethanamine	C2H7N
41	207	6343	ethanethiol	C2H6S
42	208	6346	diiodomethane	CH2I2
43	209	6368	1,1-difluoroethane	C2H4F2
44	210	6373	fluoroform	CHF3
45	211	6384	bromo(trifluoro)methane	CBrF3
46	212	6392	chloro(trifluoro)methane	CCIF3
47	213	6393	tetrafluoromethane	CF4
48	214	6403	2,2-dimethylbutane	C6H14
49	215	6431	1,1,1,2,2,2-hexafluoroethane	C2F6
50	216	6514	3-sulfanylpropanoic acid	C3H6O2S
51	217	6556	2-methylbutane	C5H12
52	218	6568	butan-2-ol	C4H10O
53	219	6569	butan-2-one	C4H8O
54	220	6573	1,1-dichloropropane	C3H6Cl2
55	221	6578	propanamide	C3H7NO
56	222	6736	3-methyl-1H-indole	C9H9N
57	223	7239	1,2-dichlorobenzene	C6H4Cl2
58	224	7288	pentan-3-one	C5H10O
59	225	7296	methylcyclopentane	C6H12
60	226	7298	cyclopentanol	C5H10O
61	227	7804	1,4-dibromobenzene	C6H4Br2
62	228	7843	butane	C4H10
63	229	7844	but-1-ene	C4H8
64	230	7846	but-1-yne	C4H6
65	231	7848	propane-1-thiol	C3H8S
66	232	7911	propanediamide	C3H6N2O2
67	233	7950	1,3,5-trichlorobenzene	C6H3Cl3
68	234	7962	methylcyclohexane	C7H14
69	235	7966	cyclohexanol	C6H12O
70	236	8008	butanenitrile	C4H7N
71	237	8013	propane-1,3-dithiol	C3H8S2
72	238	8014	N'-methylethane-1,2-diamine	C3H10N2
73	239	8016	2-(methylamino)ethanol	C3H9NO
74	240	8018	2-methoxyethanamine	C3H9NO
75	241	8019	2-methoxyethanol	C3H8O2
76	242	8025	ethyl formate	C3H6O2
77	243	8058	hexane	C6H14
78	244	8070	N,N'-dimethylethane-1,2-diamine	C4H12N2
79	245	8071	1,2-dimethoxyethane	C4H10O2
80	246	8073	propyl formate	C4H8O2
81	247	8077	(ethyldisulfanyl)ethane	C4H10S2
82	248	8078	cyclohexane	C6H12
83	249	8081	1,3,5-trioxane	C3H6O3
84	250	8082	piperidine	C5H11N

85	251	8252	prop-1-ene	C3H6
86	252	8255	2-methylprop-1-ene	C4H8
87	253	8370	1,2,3,4,5,6-hexachlorobenzene	C6Cl6
88	254	8472	trimethyl phosphite	C3H9O3P
89	255	8894	tetrahydropyran	C5H10O
90	256	9086	3-aminopropan-1-ol	C3H9NO
91	257	9261	pyrazine	C4H4N2
92	258	9264	1,3,5-trithiane	C3H6S3
93	259	9620	fluoroethane	C2H5F
94	260	9633	1,1,1,2,2-pentafluoroethane	C2HF5
95	261	9696	1,2,3,4,5-pentafluorobenzene	C6HF5
96	262	9745	1,3,5-trifluorobenzene	C6H3F3
97	263	9805	1,2,3,4,5,6-hexafluorobenzene	C6F6
98	264	9868	1,1,1-trifluoroethane	C2H3F3
99	265	9890	1,1,2-trifluoroethane	C2H3F3
100	266	9998	1-fluoropropane	C3H7F
101	267	10039	carbonyl sulfide	COS
102	268	10419	but-2-yne	C4H6
103	269	10421	dimethyldiazene	C2H6N2
104	270	10442	propane-1,3-diol	C3H8O2
105	271	10448	3-methylsulfanylpropan-1-ol	C4H10OS
106	272	10450	1,3-dioxane	C4H8O2
107	273	10451	1,3-dithiane	C4H8S2
108	274	10452	1,4-dithiane	C4H8S2
109	275	10476	carbononitridic bromide	CBrN
110	276	10477	carbononitridic chloride	CCIN
111	277	10478	carbononitridic iodide	CIN
112	278	10541	trimethyl phosphate	C3H9O4P
113	279	10553	2-methylbut-2-ene	C5H10
114	280	10892	1,4-difluorobenzene	C6H4F2
115	281	10899	1-chloropropane	C3H7Cl
116	282	10903	methoxyethane	C3H8O
117	283	10926	1,1-dichlorobutane	C4H8Cl2
118	284	10943	1,3-dichlorobenzene	C6H4Cl2
119	285	11124	methyl propanoate	C4H8O2
120	286	11168	methyl thiocyanate	C2H3NS
121	287	11182	1-methoxypropane	C4H10O
122	288	11201	1,1-dibromoethane	C2H4Br2
123	289	11240	2-methylbut-1-ene	C5H10
124	290	11250	2,3-dimethylbut-2-ene	C6H12
125	291	11575	iodobenzene	C6H5I
126	292	11646	isocyanomethane	C2H3N
127	293	11723	N,N-dimethylethanamine	C4H11N
128	294	11855	1,2,3,4,5-pentachlorobenzene	C6HCI5
129	295	12014	3-methylpent-2-ene	C6H12
130	296	12021	dimethyl carbonate	C3H6O3

131	297	12022	N-ethyl-N-methylethanamine	C5H13N
132	298	12051	N,N-diethylformamide	C5H11NO
133	299	12219	N-methylethanamine	C3H9N
134	300	12220	but-2-ene	C4H8
135	301	12223	1,2-difluoroethane	C2H4F2
136	302	12224	1,2-diiodoethane	C2H4I2
137	303	12230	methylsulfanylethane	C3H8S
138	304	12243	2-methylpent-2-ene	C6H12
139	305	12251	2-methoxyacetic acid	C3H6O3
140	306	12253	N-ethylacetamide	C4H9NO
141	307	12309	pent-1-yne	C5H8
142	308	12310	pent-2-yne	C5H8
143	309	12315	N-methylpropan-1-amine	C4H11N
144	310	12319	N-ethylformamide	C3H7NO
145	311	12356	2-methoxyethyl formate	C4H8O3
146	312	12376	2-formyloxyethyl formate	C4H6O4
147	313	12418	1,1,1,2-tetrachloroethane	C2H2Cl4
148	314	12585	pent-2-ene	C5H10
149	315	12703	N,N-diethylacetamide	C6H13NO
150	316	12753	1-oxidopyridin-1-ium	C5H5NO
151	317	12961	2-sulfanylacetamide	C2H5NOS
152	318	12965	N,N-dimethylpropanamide	C5H11NO
153	319	13129	1,1,1,2-tetrafluoroethane	C2H2F4
154	320	13130	methyl dihydrogen phosphate	CH5O4P
155	321	13134	dimethyl hydrogen phosphate	C2H7O4P
156	322	13195	5-methyl-1H-imidazole	C4H6N2
157	323	14470	N-methylpropanamide	C4H9NO
158	324	14818	3,5,7-trithia-1,2,4,6-	P4S3
			tetraphosphatricyclo[2.2.1.02,6]heptane	
159	325	14917	fluorane	FH
160	326	15367	thiane	C5H10S
161	327	15380	bis(methylsulfanyl)methane	C3H8S2
162	328	16592	1-(methyldisulfanyl)propane	C4H10S2
163	329	16843	trifluoro(iodo)methane	CF3I
164	330	16908	1-fluorobutane	C4H9F
165	331	19754	1-methylsulfanylpropane	C4H10S
166	332	20970	1,3-dithiolane	C3H6S2
167	333	22686	N-propylformamide	C4H9NO
168	334	23110	1,2-bis(methylsulfanyl)ethane	C4H10S2
169	336	24387	trichlorophosphane	CI3P
170	337	24404	phosphane	НЗР
171	338	24408	molecular bromine	Br2
172	339	24524	molecular fluorine	F2
173	340	24526	molecular chlorine	Cl2
174	341	24622	1,1,1-trichloropropane	C3H5Cl3
175	342	24807	chlorosulfanyl thiohypochlorite	Cl2S2

177       344       24841       iodae       HI         178       345       25403       2,3-dimethylpent-2-ene       C7H14         179       346       31242       4-ethylphenol       C8H10O         180       347       31275       1,4-dioxane       C4H802         181       348       33629       hex-2-yne       C6H10         182       349       61236       NN-dimethylpropan-1-amine       C5H13N         183       350       62540       methoxymethanol       C2H602         184       351       66978       N.N-dimethylpropane-1,3-diamine       C3H14N2         185       352       67515       1,2-thiazole       C3H3NS         186       353       67899       1,1,1-trifluoropropane       C3H603         188       355       68980       trimethylphosphane       C3H603         193       356       69021       2-hydroxyethyl formate       C3H7NO2         194       361       69871       N-(2-hydroxyethyl formatide       C3H7NO2         193       362       70075       nitrosomethane       CH3NO         194       361       69811       3-sulfarylpropan-1-ol       C4H1002         197	176	343	24813	phosphoryl trichloride	CI3OP
178         345         2.3-dimethylpent-2-ene         C7H14           179         346         31242         4-ethylphenol         C8H10O           180         347         31275         1.4-dioxane         C4H802           181         348         33629         hex-2-yne         C6H10           182         349         61236         N.N-dimethylpropan-1-amine         C5H14N2           183         350         62540         methoxymethanol         C2H602           184         351         66978         N.N-dimethylpropane-1,3-diamine         C3H3MS           186         353         67599         1.1-trifloropropane         C3H5F3           187         354         68152         3-hydroxypropanoic acid         C3H603           188         355         68980         1.1-diidoethane         C2H6120           190         357         69020         2-aminoacetamide         C2H6N20           191         358         69021         2-hydroxyethylformamide         C3H7N02           192         350         69404         2-hydroxyethylformamide         C3H7N02           193         360         69657         N-C2-hydroxyethylformamide         C3H7N02           193 <td>177</td> <td>344</td> <td>24841</td> <td>iodane</td> <td>HI</td>	177	344	24841	iodane	HI
179         346         31242         4-ethylphenol         C8H100           180         347         31275         1.4-dioxane         C4H802           181         348         33629         hex-2-yne         C6H10           182         349         61236         N.N-dimethylpropane-1.amine         C2H602           184         351         66578         N.N-dimethylpropane-1.3-diamine         C3H14N2           185         352         67515         1.2-thiazole         C3H573           187         354         68152         3-hydroxypropanoic acid         C3H603           188         355         68980         1.1-trifluoropropane         C3H673           188         355         68980         1.1-diodoethane         C2H412           189         356         68983         trimethylphosphane         C3H502           191         358         69021         2-aminoacetamide         C2H5N02           192         359         69404         2-hydroxyethylformamide         C3H7N02           193         360         69657         N-(2-hydroxyethylformamide         C3H7N02           194         361         69811         3-methoxypropanoic acid         C3H7N02	178	345	25403	2,3-dimethylpent-2-ene	C7H14
180         347         31275         1.4-dioxane         CH802           181         348         33629         hex-2-yne         C6H10           182         349         61236         N.N-dimethylpropan-1-amine         C5H13N           183         350         62540         methoxymethanol         C2H602           184         351         66978         N.N-dimethylpropane-1,3-diamine         C3H14N2           185         525         67515         1.2-thiazole         C3H5F3           186         353         67899         1,1-litiodoethane         C2H412           188         355         68983         trimethylphosphane         C3H9P           190         357         69020         2-aminoacetamide         C2H5N02           191         358         69021         2-hydroxycethyl formate         C3H5O2           192         359         69404         2-hydroxyethyl formate         C3H7N02           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7N02           193         360         69657         N-(2-hydroxyethyl formate         C3H5N03           195         362         70075         introsomethane         CH3N0	179	346	31242	4-ethylphenol	C8H10O
181         348         33629         hex-2-yne         C6H10           182         349         61236         N.N-dimethylpropan-1-amine         C3H402           183         350         62540         methoxymethanol         C2H602           184         351         66978         N.N-dimethylpropane-1,3-diamine         C3H472           185         352         67515         1,2-thiazole         C3H3N5           186         353         67899         1,1.1-trifluoropropane         C3H5F3           187         354         68152         3-hydroxypropanoic acid         C3H5F3           188         355         68980         1,1-diridoethane         C2H412           188         356         68983         trimethylphosphane         C3H5F3           190         357         69020         2-aminoacetamide         C2H6N2O           191         358         69021         2-hydroxyetamide         C3H7N02           192         350         69404         2-hydroxyethylformamide         C3H7N02           194         361         69657         N-(2-hydroxyethylformamide         C3H7N02           194         364         69637         3-amito-3-oxopropanoic acid         C3H7N02 </td <td>180</td> <td>347</td> <td>31275</td> <td>1,4-dioxane</td> <td>C4H8O2</td>	180	347	31275	1,4-dioxane	C4H8O2
182         349         61236         N.N-dimethylpropan-1-amine         C5H13N           183         350         662540         methoxymethanol         C2H6O2           184         351         66978         N.N-dimethylpropane-1,3-diamine         C5H14N2           185         352         67515         1,2-thiazole         C3H3NS           186         353         67899         1,1,1-irifluoropropane         C3H6O3           188         355         68980         1,1-diiodethane         C2H412           189         356         68983         trimethylphosphane         C3H5P3           190         357         69020         2-aminoacetamide         C2H5N02           191         358         69021         2-hydroxycethyl formate         C3H5O3           192         359         69404         2-hydroxyethyl formate         C3H7N02           194         361         69851         N-(2-hydroxyethyl formate         C3H5N03           195         362         70075 <nitrosomethane< td="">         CH1NO5           195         362         7551         2-methylaufactic acid         C3H5N03           196         365         7551         2-methylaufanylpropan-1-amine         C4H1002</nitrosomethane<>	181	348	33629	hex-2-yne	C6H10
183         350         62540         methoxymethanol         C2H6O2           184         351         66978         N.N'-dimethylpropane-1,3-diamine         C3H14N2           185         352         67515         1.2-thiazole         C3H3NS           186         353         67899         1.1.1-trifloropropane         C3H3F3           187         354         68152         3-hydroxypropanoic acid         C3H6O3           188         355         68980         1.1-diidocethane         C2H4U2           189         356         68983         trimethylphosphane         C3H3PP           190         357         69020         2-aminoacetamide         C2H6N2O           191         358         69021         2-hydroxyactamide         C3H5N02           192         359         69404         2-hydroxyethylformamide         C3H7N02           193         360         69657         N-(2-hydroxyethylformamide         C3H7N02           193         360         69517         N-(2-hydroxyethylformamide         C3H7N02           194         361         69811         3-suffanylpropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3	182	349	61236	N,N-dimethylpropan-1-amine	C5H13N
184         351         66978         N.N'-dimethylpropane-1,3-diamine         C5H14N2           185         352         67515         1,2-thiazole         C3H3NS           186         353         67899         1,1.1-trifluoropropane         C3H5F3           187         354         68152         3-hydroxypropanoic acid         C3H6O3           188         355         68980         1,1-diiodoethane         C2H4I2           189         356         68983         trimethylphosphane         C3H6O3           190         357         69020         2-aninoacetamide         C2H6N2O           191         358         69021         2-hydroxyethyl formate         C3H6O3           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO2           194         361         69811         3-sulfanylpropanamide         C3H7NO5           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H10O2           197         364         75367         3-amino-3-oxporponoic acid         C3H5NO3           200         367         75891         3-methylsufanylaropan-1-amine <td< td=""><td>183</td><td>350</td><td>62540</td><td>methoxymethanol</td><td>C2H6O2</td></td<>	183	350	62540	methoxymethanol	C2H6O2
185         352         67515         1,2-thiazole         C3H3NS           186         353         67899         1,1,1-tirifluoropropane         C3H603           188         355         68890         1,1-diiodoethane         C2H412           189         356         68983         trimethylphosphane         C2H412           189         356         68983         trimethylphosphane         C2H6N2O           191         357         69020         2-aminoacetamide         C2H6N2O           192         359         69404         2-hydroxyethyl formate         C3H50O3           193         360         69657         N-(2-hydroxyethyl)formatide         C3H7NOS           194         361         69811         3-sulfanylpropanamide         C3H7NOS           195         362         70075         nitrosomethane         CH4NO           196         363         74116         3-methylpufanylacetic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H5NO3           200         367         75801         3-methylsulfanylacetic acid         C3H5NO3           201         368         77743         3-methylsulfanylethanol         C3H60	184	351	66978	N,N'-dimethylpropane-1,3-diamine	C5H14N2
186         353         67899         1,1,1-trifluoropropane         C3H5F3           187         354         68152         3-hydroxypropanoic acid         C3H6O3           188         355         66980         1,1-diiodoethane         C2H4I2           189         356         66980         1,1-diiodoethane         C2H6N2O           190         357         69020         2-aminoacetamide         C2H6N2O           191         356         669057         N-(2-hydroxyacetamide         C3H6O3           192         359         69404         2-hydroxyactamide         C3H7NO2           193         360         6957         N-(2-hydroxyethyl)formamide         C3H7NO2           194         361         69811         3-sulfanylpropanamide         C3H7NO2           194         361         69811         3-sulfanylpropan-1-ol         C4H1002           197         364         75570         3-methoxypropan-1-ol         C4H1002           198         365         75551         2-methylsulfanylacetic acid         C3H5N03           200         367         75806         2-formamidoacetic acid         C3H5N03           201         368         77743         3-methylsulfanylpropan-1-amine	185	352	67515	1,2-thiazole	C3H3NS
187         354         68152         3-hydroxypropanoic acid         C3H6O3           188         355         68980         1.1-diodocthane         C2H4I2           189         356         68983         trimethylphosphane         C3H9P           190         357         69020         2-aminoacetamide         C2H6N2O           191         358         69021         2-hydroxyethyl formate         C3H6O3           192         359         69404         2-hydroxyethyl formate         C3H7NO2           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO5           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO5           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3H5N03           200         367         75891         3-(methylaufiaylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H805           203         370         79045         dithiolane         C3H	186	353	67899	1,1,1-trifluoropropane	C3H5F3
188         355         68980         1,1-diiodoethane         C2H4l2           189         356         68983         trimethylphosphane         C3H9P           190         357         69020         2-aminoacetamide         C2H5N02           191         358         69021         2-hydroxyactamide         C2H5N02           192         359         69404         2-hydroxyethyl formate         C3H603           193         360         69657         N-(2-hydroxyethyl)formate         C3H7N02           194         361         69811         3-sulfanylpropanamide         C3H7N02           195         362         70075         nitrosomethane         CH3NO           195         362         70075         a-methoxypropan-1-ol         C4H1002           196         365         75551         2-methylsulfanylacetic acid         C3H5N03           208         367         75801         3-methylsulfanylopopan-1-amine         C4H11NS           201         368         77743         3-methylsulfanylopopan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H652           204         371         79079         aidomethane         C4H3N3	187	354	68152	3-hydroxypropanoic acid	C3H6O3
189         356         68983         trimethylphosphane         C3H9P           190         357         69020         2-aminoacetamide         C2H6N2O           191         358         69021         2-hydroxyacetamide         C2H5N02           192         359         69404         2-hydroxyethyl formate         C3H6O3           192         359         69404         2-hydroxyethyl formate         C3H7N02           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7N02           194         361         69811         3-sulfanylpropanamide         C3H7N05           195         362         70075         nitrosomethane         CH3N0           196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75567         3-amino-3-oxopropanoic acid         C3H5N03           200         367         75891         3-(methylaminolypropan-1-amine         C4H1N02           201         368         77743         3-methylsulfanylpropan-1-amine         C3H805           203         370         79045         dithiolane         C3H652           204         371         79079         aidomethane         C4H12N2 <td>188</td> <td>355</td> <td>68980</td> <td>1,1-diiodoethane</td> <td>C2H4I2</td>	188	355	68980	1,1-diiodoethane	C2H4I2
190         357         69020         2-aminoacetamide         C2H6N20           191         358         69021         2-hydroxyacetamide         C2H5N02           192         359         69404         2-hydroxyethyl formate         C3H603           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7N02           194         361         69811         3-sulfanylpropanamide         C3H7N05           195         362         70075         nitrosomethane         CH3N0           196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3H5N03           198         365         75551         2-methylsulfanylacetic acid         C3H5N03           200         367         75891         3-(methylamino)propanoic acid         C4H1N02           201         368         77743         3-methylsulfanylethanol         C3H805           203         370         79045         dithiolane         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H805           204         371         79079         axidomethane         C4H12	189	356	68983	trimethylphosphane	СЗН9Р
191         358         69021         2-hydroxyactamide         C2H5NO2           192         359         69404         2-hydroxyethyl formate         C3H6O3           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO2           194         361         69811         3-sulfanylpropanamide         C3H7NOS           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H602S           199         366         75606         2-formamidoacetic acid         C3H5NO3           200         367         75891         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylepropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylepropan-1-amine         C4H11NS           203         370         79045         dithiolane         C3H652           204         371         79079         azidomethane	190	357	69020	2-aminoacetamide	C2H6N2O
192         359         69404         2-hydroxyethyl formate         C3H6O3           193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO2           194         361         69811         3-sulfanylpropanamide         C3H7NO5           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H10O2           197         364         75367         3-amino-3-oxopropanoic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H6O2S           199         366         75606         2-formamidoacetic acid         C3H6O2S           200         367         75891         3-(methylsmilopiropanoic acid         C4H9NO2           201         368         77743         3-methylsulfanyletopan-1-amine         C4H1INS           202         369         78925         2-methylsulfanylethanol         C3H6S2           204         371         79079         azidomethane         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H12N2           206         373         82641         ethyl dimethy	191	358	69021	2-hydroxyacetamide	C2H5NO2
193         360         69657         N-(2-hydroxyethyl)formamide         C3H7NO2           194         361         69811         3-sulfanylpropanamide         C3H7NO5           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H5NO3           200         367         75891         3-(methylamino)propanoic acid         C4H10N2           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H110Q4P           207         374         83297         1,1,1-trichloro	192	359	69404	2-hydroxyethyl formate	C3H6O3
194         361         69811         3-sulfanylpropanamide         C3H7NOS           195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H10O2           197         364         75367         3-amino-3-oxopropanoic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H5NO3           200         367         75891         3-(methylamino)propanoic acid         C4H9NO2           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlo	193	360	69657	N-(2-hydroxyethyl)formamide	C3H7NO2
195         362         70075         nitrosomethane         CH3NO           196         363         74116         3-methoxypropan-1-ol         C4H10O2           197         364         75367         3-amino-3-oxopropanoic acid         C3H5NO3           198         365         75551         2-methylsulfanylacetic acid         C3H6O25           199         366         75606         2-formamidoacetic acid         C3H5NO3           200         367         75891         3-(methylamino)propanoic acid         C4H9NO2           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-aminylpropan-1-ol         C3H80S           210         377         89675         2-amino-N-methylacetamide<	194	361	69811	3-sulfanylpropanamide	C3H7NOS
196         363         74116         3-methoxypropan-1-ol         C4H1002           197         364         75367         3-amino-3-oxopropanoic acid         C3H5N03           198         365         75551         2-methylsulfanylacetic acid         C3H6025           199         366         75606         2-formamidoacetic acid         C3H5N03           200         367         75891         3-(methylamino)propanoic acid         C4H1NS           202         368         77743         3-methylsulfanylpropan-1-amine         C4H1NS           202         369         78925         2-methylsulfanylpropan-1-amine         C4H1NS           203         370         79045         dithiolane         C3H652           204         371         79079         azidomethane         C4H12N2           206         373         82641         ethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-amino-N-methylacetamide         C3H80S           209         376         88211         3-sulfanylpropan-1-ol         C3H80S           210         377         89675         2-amino-N-methylacetami	195	362	70075	nitrosomethane	CH3NO
197         364         75367         3-amino-3-oxopropanoic acid         C3H5N03           198         365         75551         2-methylsulfanylacetic acid         C3H6025           199         366         75606         2-formamidoacetic acid         C3H5N03           200         367         75891         3-(methylamino)propanoic acid         C4H9N02           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11N5           202         369         78925         2-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylpropan-1-amine         C3H805           203         370         79045         dithiolane         C3H652           204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1C13           207         374         83297         1,1,1-trichlorobutane         C3H9NS           209         376         88211	196	363	74116	3-methoxypropan-1-ol	C4H10O2
198       365       75551       2-methylsulfanylacetic acid       C3H6O2S         199       366       75606       2-formamidoacetic acid       C3H5NO3         200       367       75891       3-(methylamino)propanoic acid       C4H9NO2         201       368       77743       3-methylsulfanylpropan-1-amine       C4H11NS         202       369       78925       2-methylsulfanylethanol       C3H8OS         203       370       79045       dithiolane       C3H6S2         204       371       79079       azidomethane       CH3N3         205       372       80511       N'-methylpropane-1,3-diamine       C4H12N2         206       373       82641       ethyl dimethyl phosphate       C4H7CI3         207       374       83297       1,1,1-trichlorobutane       C3H8OS         208       375       87697       2-methylsulfanylethanamine       C3H8OS         209       376       88211       3-sulfanylpropan-1-ol       C3H8OS         210       377       89675       2-amino-N-methylacetamide       C3H8N2O         211       378       94671       disulfanylethane       C2H6S2         212       379       97436       3-aminopropa	197	364	75367	3-amino-3-oxopropanoic acid	C3H5NO3
199         366         75606         2-formamidoacetic acid         C3H5NO3           200         367         75891         3-(methylamino)propanoic acid         C4H9NO2           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H11O4P           207         374         83297         1,1,1-trichlorobutane         C3H9NS           209         376         88211         3-sulfanylethanamine         C3H8OS           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide	198	365	75551	2-methylsulfanylacetic acid	C3H6O2S
200         367         75891         3-(methylamino)propanoic acid         C4H9NO2           201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C3H8OS           208         375         87697         2-methylsulfanylethanamine         C3H8OS           209         376         88211         3-sulfanylpropan-1-ol         C3H8OS           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide	199	366	75606	2-formamidoacetic acid	C3H5NO3
201         368         77743         3-methylsulfanylpropan-1-amine         C4H11NS           202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H8OS           204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-methylsulfanylethanamine         C3H8OS           209         376         88211         3-sulfanylpropan-1-ol         C3H8OS           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfangl         H2S2           214         381         122370         methylsulfanylmethanethiol	200	367	75891	3-(methylamino)propanoic acid	C4H9NO2
202         369         78925         2-methylsulfanylethanol         C3H8OS           203         370         79045         dithiolane         C3H6S2           204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-methylsulfanylethanamine         C3H80S           209         376         88211         3-sulfanylpropan-1-ol         C3H80S           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide         H2S2           214         381         122370         methylsulfanylmethanethiol         C2H6S2           215         382         123046         phosphinine         C5H5P	201	368	77743	3-methylsulfanylpropan-1-amine	C4H11NS
203       370       79045       dithiolane       C3H6S2         204       371       79079       azidomethane       CH3N3         205       372       80511       N'-methylpropane-1,3-diamine       C4H12N2         206       373       82641       ethyl dimethyl phosphate       C4H1104P         207       374       83297       1,1,1-trichlorobutane       C4H7Cl3         208       375       87697       2-methylsulfanylethanamine       C3H9NS         209       376       88211       3-sulfanylpropan-1-ol       C3H80S         210       377       89675       2-amino-N-methylacetamide       C3H9NS         211       378       94671       disulfanylethane       C2H6S2         212       379       97436       3-aminopropane-1-thiol       C3H9NS         213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123233       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane <t< td=""><td>202</td><td>369</td><td>78925</td><td>2-methylsulfanylethanol</td><td>C3H8OS</td></t<>	202	369	78925	2-methylsulfanylethanol	C3H8OS
204         371         79079         azidomethane         CH3N3           205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-methylsulfanylethanamine         C3H9NS           209         376         88211         3-sulfanylpropan-1-ol         C3H80S           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide         H2S2           214         381         122370         methylsulfanylmethanethiol         C2H6S2           215         382         123046         phosphinine         C5H5P           216         384         123323         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane	203	370	79045	dithiolane	C3H6S2
205         372         80511         N'-methylpropane-1,3-diamine         C4H12N2           206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-methylsulfanylethanamine         C3H9NS           209         376         88211         3-sulfanylpropan-1-ol         C3H8OS           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide         H2S2           214         381         122370         methylsulfanylmethanethiol         C2H6S2           215         382         123046         phosphinine         C5H5P           216         384         123323         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic ac	204	371	79079	azidomethane	CH3N3
206         373         82641         ethyl dimethyl phosphate         C4H1104P           207         374         83297         1,1,1-trichlorobutane         C4H7Cl3           208         375         87697         2-methylsulfanylethanamine         C3H9NS           209         376         88211         3-sulfanylpropan-1-ol         C3H80S           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide         H2S2           214         381         122370         methylsulfanylmethanethiol         C2H6S2           215         382         123046         phosphinine         C5H5P           216         384         123323         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane	205	372	80511	N'-methylpropane-1,3-diamine	C4H12N2
207       374       83297       1,1,1-trichlorobutane       C4H7Cl3         208       375       87697       2-methylsulfanylethanamine       C3H9NS         209       376       88211       3-sulfanylpropan-1-ol       C3H8OS         210       377       89675       2-amino-N-methylacetamide       C3H8N2O         211       378       94671       disulfanylethane       C2H6S2         212       379       97436       3-aminopropane-1-thiol       C3H9NS         213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123233       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C4H8S2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile	206	373	82641	ethyl dimethyl phosphate	C4H11O4P
208         375         87697         2-methylsulfanylethanamine         C3H9NS           209         376         88211         3-sulfanylpropan-1-ol         C3H8OS           210         377         89675         2-amino-N-methylacetamide         C3H8N2O           211         378         94671         disulfanylethane         C2H6S2           212         379         97436         3-aminopropane-1-thiol         C3H9NS           213         380         108196         hydrogen disulfide         H2S2           214         381         122370         methylsulfanylmethanethiol         C2H6S2           215         382         123046         phosphinine         C5H5P           216         384         123232         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane         C2H6O2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile <t< td=""><td>207</td><td>374</td><td>83297</td><td>1,1,1-trichlorobutane</td><td>C4H7Cl3</td></t<>	207	374	83297	1,1,1-trichlorobutane	C4H7Cl3
209376882113-sulfanylpropan-1-olC3H8OS210377896752-amino-N-methylacetamideC3H8N2O21137894671disulfanylethaneC2H6S2212379974363-aminopropane-1-thiolC3H9NS213380108196hydrogen disulfideH2S2214381122370methylsulfanylmethanethiolC2H6S2215382123046phosphinineC5H5P216384123323fluorosulfanyl thiohypofluoriteF2S2217385123388(methyldisulfanyl)ethaneC3H8S22183861344423-methoxypropanoic acidC4H8O3219387136335dithianeC2H6O2220388136492methylperoxymethaneC2H6O2221389136869dicyanophosphanylformonitrileC3N3P	208	375	87697	2-methylsulfanylethanamine	C3H9NS
210       377       89675       2-amino-N-methylacetamide       C3H8N2O         211       378       94671       disulfanylethane       C2H6S2         212       379       97436       3-aminopropane-1-thiol       C3H9NS         213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123323       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C2H6O2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile       C3N3P	209	376	88211	3-sulfanylpropan-1-ol	C3H8OS
211       378       94671       disulfanylethane       C2H6S2         212       379       97436       3-aminopropane-1-thiol       C3H9NS         213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123323       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C2H6O2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile       C3N3P	210	377	89675	2-amino-N-methylacetamide	C3H8N2O
212       379       97436       3-aminopropane-1-thiol       C3H9NS         213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123323       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C2H6O2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile       C3N3P	211	378	94671	disulfanylethane	C2H6S2
213       380       108196       hydrogen disulfide       H2S2         214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123323       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C2H6O2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile       C3N3P	212	379	97436	3-aminopropane-1-thiol	C3H9NS
214       381       122370       methylsulfanylmethanethiol       C2H6S2         215       382       123046       phosphinine       C5H5P         216       384       123323       fluorosulfanyl thiohypofluorite       F2S2         217       385       123388       (methyldisulfanyl)ethane       C3H8S2         218       386       134442       3-methoxypropanoic acid       C4H8O3         219       387       136335       dithiane       C4H8S2         220       388       136492       methylperoxymethane       C2H6O2         221       389       136869       dicyanophosphanylformonitrile       C3N3P	213	380	108196	hydrogen disulfide	H2S2
215         382         123046         phosphinine         C5H5P           216         384         123323         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane         C4H8S2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile         C3N3P	214	381	122370	methylsulfanylmethanethiol	C2H6S2
216         384         123323         fluorosulfanyl thiohypofluorite         F2S2           217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane         C4H8S2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile         C3N3P	215	382	123046	phosphinine	C5H5P
217         385         123388         (methyldisulfanyl)ethane         C3H8S2           218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane         C4H8S2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile         C3N3P	216	384	123323	fluorosulfanyl thiohypofluorite	F2S2
218         386         134442         3-methoxypropanoic acid         C4H8O3           219         387         136335         dithiane         C4H8S2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile         C3N3P	217	385	123388	(methyldisulfanyl)ethane	C3H8S2
219         387         136335         dithiane         C4H8S2           220         388         136492         methylperoxymethane         C2H6O2           221         389         136869         dicyanophosphanylformonitrile         C3N3P	218	386	134442	3-methoxypropanoic acid	C4H8O3
220388136492methylperoxymethaneC2H6O2221389136869dicyanophosphanylformonitrileC3N3P	219	387	136335	dithiane	C4H8S2
221389136869dicyanophosphanylformonitrileC3N3P	220	388	136492	methylperoxymethane	C2H6O2
	221	389	136869	dicyanophosphanylformonitrile	C3N3P

222	390	137036	carbononitridic fluoride	CFN
223	392	137201	methyl cyanate	C2H3NO
224	393	138210	methoxymethyl formate	C3H6O3
225	394	138743	N-methylpropan-2-imine	C4H9N
226	395	138769	methyl(methylidene)phosphane	C2H5P
227	396	139605	fluoro thiohypofluorite	F2S
228	397	139636	difluorophosphane	F2HP
229	399	140060	2-methoxyacetamide	C3H7NO2
230	400	140180	1,3-dimethoxypropane	C5H12O2
231	401	141161	1,3-bis(methylsulfanyl)propane	C5H12S2
232	402	141892	2-acetamido-N-methylpropanamide	C6H12N2O2
233	403	151411	2-(methylamino)acetamide	C3H8N2O
234	404	170607	3-(methylamino)-3-oxopropanoic acid	C4H7NO3
235	405	192755	N,N'-dimethylpropanediamide	C5H10N2O2
236	406	192802	3-aminopropanamide	C3H8N2O
237	407	202285	2-(methylamino)ethanethiol	C3H9NS
238	408	223579	2-hydroxy-N-methylacetamide	C3H7NO2
239	409	226108	N-(2-formamidoethyl)formamide	C4H8N2O2
240	410	232267	2-formamidoacetamide	C3H6N2O2
241	411	263087	3-methylsulfanylpropanamide	C4H9NOS
242	412	300977	2-methoxy-N-methylethanamine	C4H11NO
243	413	324305	3-ethyl-1H-indole	C10H11N
244	414	350667	N-ethyl-N-methylformamide	C4H9NO
245	415	439506	2-acetamido-N-methylacetamide	C5H10N2O2
246	416	521081	difluoromethanethione	CF2S
247	417	521324	N-ethylpropanamide	C5H11NO
248	418	522059	disulfanylmethane	CH4S2
249	419	524894	methoxymethoxyethane	C4H10O2
250	420	525376	1-(methylsulfanylmethylsulfanyl)propane	C5H12S2
251	421	525377	methylsulfanylmethylsulfanylethane	C4H10S2
252	422	525458	2-methylsulfanylethanethiol	C3H8S2
253	423	525488	3-methylsulfanylpropane-1-thiol	C4H10S2
254	424	1174	uracil	C4H4N2O2
255	425	533889	3-formamidopropanoic acid	C4H7NO3
256	426	547873	2-methylsulfanylacetamide	C3H7NOS
257	427	641811	thioacetone	C3H6S
258	428	642906	N-methyl-3-sulfanylpropanamide	C4H9NOS
259	429	2463138	N-methyl-2-(methylamino)acetamide	C4H10N2O
260	430	3014644	2-methoxyethanethiol	C3H8OS
261	431	4047279	N-methyl-2-sulfanylacetamide	C3H7NOS
262	432	4145140	3-hydroxypropanamide	C3H7NO2
263	433	4431608	1-methoxy-2-methylsulfanylethane	C4H10OS
264	434	5252481	3-methoxypropanamide	C4H9NO2
265	435	6428842	1-(disulfanyl)propane	C3H8S2
266	436	9940735	methoxymethanethiol	C2H6OS
267	437	10011858	2-sulfanylethyl formate	C3H6O2S

268	438	10148986	3-(methylamino)propan-1-ol	C4H11NO
269	439	10153736	5-ethyl-1H-imidazole	C5H8N2
270	440	10877157	3-formyloxypropyl formate	C5H8O4
271	441	12056230	fluorophosphane	FH2P
272	442	12387217	3-hydroxypropyl formate	C4H8O3
273	443	12545136	1,1-difluoropropane	C3H6F2
274	444	12545984	3-methoxy-N-methylpropan-1-amine	C5H13NO
275	445	12548977	N-methyl-3-(methylamino)propanamide	C5H12N2O
276	446	12599323	1-(methoxymethoxy)propane	C5H12O2
277	447	12634510	3-(methylamino)propane-1-thiol	C4H11NS
278	448	12923964	methylsulfanylmethanamine	C2H7NS
279	449	13048467	3-formyloxypropanoic acid	C4H6O4
280	450	13050065	N-(methoxymethyl)formamide	C3H7NO2
281	451	13050070	N-(methylsulfanylmethyl)formamide	C3H7NOS
282	452	13229773	N-(2-sulfanylethyl)formamide	C3H7NOS
283	453	13319001	ethyl methyl hydrogen phosphate	C3H9O4P
284	454	13390905	N-ethyl-N-methylacetamide	C5H11NO
285	455	13553138	N-methyl-2-methylsulfanylacetamide	C4H9NOS
286	456	13561311	N-(2-aminoethyl)formamide	C3H8N2O
287	457	13586013	N-(3-hydroxypropyl)formamide	C4H9NO2
288	458	13637593	methylsulfanylmethanol	C2H6OS
289	459	13682918	thiophen-3-one	C4H4OS
290	460	14481877	2-formamido-N-methylacetamide	C4H8N2O2
291	461	14510872	N'-methylpropanediamide	C4H8N2O2
292	462	14512801	1,1,1-trifluorobutane	C4H7F3
293	463	14872190	2-methoxy-N-methylacetamide	C4H9NO2
294	464	14889074	3-amino-N-methylpropanamide	C4H10N2O
295	465	15089697	hydroxymethyl formate	C2H4O3
296	466	15561472	3-hydroxy-N-methylpropanamide	C4H9NO2
297	467	15678214	methoxy(methylsulfanyl)methane	C3H8OS
298	468	17764882	3-formamidopropanamide	C4H8N2O2
299	469	17778177	methoxymethanamine	C2H7NO
300	470	17932045	methylaminomethyl formate	C3H7NO2
301	471	18178029	N-methyl-3-methylsulfanylpropan-1-amine	C5H13NS
302	472	18387020	N-ethyl-N-methylpropanamide	C6H13NO
303	473	18445434	N-[2-(methylamino)ethyl]formamide	C4H10N2O
304	474	18670831	N-methyl-2-methylsulfanylethanamine	C4H11NS
305	475	18967886	1,1-difluorobutane	C4H8F2
306	476	19017369	formyloxymethyl formate	C3H4O4
307	477	19348483	N-(2-methoxyethyl)formamide	C4H9NO2
308	478	19762762	2-formamidoethyl formate	C4H7NO3
309	479	20025584	3-methoxypropyl formate	C5H10O3
310	480	20396353	N-(3-methylsulfanylpropyl)formamide	C5H11NOS
311	481	20481374	methylsulfanylmethyl formate	C3H6O2S
312	482	20652631	1-methoxy-3-methylsulfanylpropane	C5H12OS
313	483	20979435	1-methoxy-N-methylmethanamine	C3H9NO

314	484	21258259	[2-(methylamino)-2-oxoethyl] formate	C4H7NO3			
315	485	21258280	2-aminoethyl formate C3H7NO2				
316	486	21430458	3-methoxy-N-methylpropanamide	C5H11NO2			
317	487	21444299	N-methyl-1-methylsulfanylmethanamine	C3H9NS			
318	488	21711028	3-methoxypropane-1-thiol	C4H10OS			
319	489	21878697	1,2-thiazolidin-3-one	C3H5NOS			
320	490	22182162	3-(methylamino)propanamide	C4H10N2O			
321	491	22323463	aminomethyl formate	C2H5NO2			
322	492	22928613	2-formyloxyacetic acid	C3H4O4			
323	493	22928648	(3-amino-3-oxopropyl) formate	C4H7NO3			
324	494	22980384	methyl(propan-2-ylidene)phosphane	C4H9P			
325	495	23187733	2-methylsulfanylethyl formate	C4H8O2S			
326	496	23515101	3-formamido-N-methylpropanamide	C5H10N2O2			
327	497	53671850	(2-amino-2-oxoethyl) formate	C3H5NO3			
328	498	54014224	3-aminopropyl formate	C4H9NO2			
329	499	54311466	2-(methylamino)ethyl formate	C4H9NO2			
330	500	54336311	3-methylsulfanylpropyl formate	C5H10O2S			
331	501	55286195	3-(methylamino)propyl formate	C5H11NO2			
332	502	57222571	sulfanylmethyl formate	C2H4O2S			
333	503	57305422	3-sulfanylpropyl formate	C4H8O2S			
334	504	90984882	formamidomethyl formate	C3H5NO3			
335	506	-15	O=COCCC(=O)NC	O=COCCC(=O)NC			
336	507	-14	Cc1c[nH]cn1	Cc1c[nH]cn1			
337	508	-13	CCc1c[nH]cn1	CCc1c[nH]cn1			
338	509	-10	fluorobromocyanophosphine	N#CP(F)Br			
339	512	-5	bis(difluorophosphanyl)thioether	FP(F)SP(F)F			

## Appendix E

#### *Results for molecules selected from Data set 1 (Appendix D, Table D.1)*

#3 Dibromomethane CH2Br2 CID: 3024 Br Br ref molpol -10.86 -7.43 -6.78, avg -8.36 molpol 10.68 7.54 7.28, avg 8.50 molpol 0.18 0.11 0.50, avg 0.14 rms molpol 0.18 Monomer potential fitting RMS: 0.24 ##Dimer results - Fitting to QM datasets## DESRES 3-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.185 0.356 2.9694 288 10 DESRES 3-3, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.447 0.334 1.3912 26 2 Liquid Dibromomethane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 2510.81 2490.70 0.8 38.07 37.45 1.7 6.85 7.23 -5.3 74





#7 Bromomethane CH3Br CID: 6323 Br \_\_\_\_\_ -6.54 -4.72 -4.72, avg -5.33 ref molpol molpol 5.99 4.86 4.86, avg 5.23 0.55 0.14 0.14, avg rms molpol 0.09 Monomer potential fitting RMS: 0.17 ##Dimer results - Fitting to QM datasets## DESRES 7-7, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.282 0.312 1.4662 24 1 R739x5 7-7, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 1.699 1.790 3.249 1.4592 1.781 0.373 1.257 0.8835 1.863 -0.372 0.159 0.5313 1.945 -0.724 -0.408 0.3157 -0.865 -0.760 2.110 0.1047 MAE Std error max error #points #count[err > 1] 0.476 1.4592 5 1 0.659 HB300SPXx10 7-water, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 2.371 1.008 2.312 1.3042 -0.462 2.481 -1.614 1.1518 -2.988 -2.014 -3.588 -2.789 2.592 0.9743 2.703 0.7992 -3.726 -3.085 2.814 0.6415 2.925 -3.602 -3.096 0.5063 -3.343 -2.948 3.036 0.3951 0.1786 0.0470 -2.198 3.369 -2.377 -1.178 3.924 -1.225 -0.398 -0.392 5.034 0.0057 Std error max error #points #count[err > 1] MAE

2

DESRES 7-water, energy values in kcal/mol

0.432

0.600

MAE	Std error	max error	#points	#count[err	> 1]
0.167	0.482	5.2953	294	11	

1.3042 10

R739x5 7-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
2.699	2.075	2.638	0.5632
2.830	1.314	1.635	0.3214
2.961	0.874	1.054	0.1796
3.092	0.620	0.720	0.0997
3.354	0.386	0.415	0.0293

MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.239	0.189	0.5632	5	0

Liquid Bro	momethane	@ 276.	65 K						
Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
1734.92	1721.95	0.8	24.44	-1.00	0.0	7.49	-1.00	0.0	1000






#15 Acetonitrile C2H3N CID: 6342
ref molpol -5.72 -3.55 -3.55, avg -4.27
molpol 5.95 4.00 4.00, avg 4.65
rms molpol 0.23 0.45 0.45, avg 0.38
Monomer potential fitting RMS: 0.22
##Dimer results - Fitting to QM datasets##
DESRES\_15-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.189	0.370	2.7454	287	14		

HB375x10\_15-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
1.788	-1.189	-1.635	-0.4465	
1.868	-3.248	-3.262	-0.0139	
1.947	-4.335	-4.108	0.2269	
2.028	-4.800	-4.461	0.3393	
2.108	-4.879	-4.508	0.3708	
2.188	-4.730	-4.374	0.3563	
2.269	-4.454	-4.137	0.3170	
2.512	-3.414	-3.240	0.1740	
2.919	-2.036	-1.998	0.0384	
3.738	-0.824	-0.832	-0.0082	
MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.229	0.154	0.4465	10	0

DESRES\_15-15, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err ]	> 1]
0.479	0.627	2.8131	25	3	

Liquid Acetonitrile @ 298.15 K

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
779.82	776.00	0.5	34.84	33.23	4.9	32.77	35.69	-8.2	20000









#100 Nitrobenzene C6H5NO2 CID: 7416
ref molpol -16.70 -14.37 -7.39, avg -12.82
 molpol 18.03 15.32 7.74, avg 13.70
rms molpol 1.33 0.95 0.35, avg 0.87



Monomer potential fitting RMS: 0.39

Liquid Nitrobenzene @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1134.82 1198.70 -5.3 57.92 55.01 5.3 16.39 34.81 -52.9 1000



#154 Imidazole C3H4N2 CID: 795 ref molpol -8.49 -8.02 -5.04, avg -7.18 molpol 8.51 8.00 5.02, avg 7.18 T. 0.02 0.02, avg rms molpol 0.02 0.00 Monomer potential fitting RMS: 1.00 ##Dimer results - Fitting to QM datasets## DESRES 154-154, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.404 0.511 3.7592 730 88 DESRES 154-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.219 0.410 3.8813 559 19 Liquid Imidazole @ 374.15 K DensityRef-Dens%errHVRef-HV%errDielecRef-D%err#nFrm1030.481030.300.072.91-1.000.00.00-1.000.017





#157 Methyl chloride CH3Cl CID: 6327

ref	molpol	-5.26	-3.82	-3.82,	avg	-4.30
	molpol	4.88	3.95	3.95,	avg	4.26
rms	molpol	0.38	0.13	0.13,	avg	0.04

CI \_\_\_\_\_

Monomer potential fitting RMS: 0.24

##Dimer results - Fitting to QM datasets##

HB300SPXx10 157-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
1.997	0.595	0.463	-0.1325	
2.089	-1.805	-1.542	0.2633	
2.181	-3.072	-2.611	0.4614	
2.272	-3.631	-3.095	0.5356	
2.364	-3.761	-3.225	0.5357	
2.455	-3.645	-3.149	0.4963	
2.547	-3.399	-2.960	0.4391	
2.822	-2.465	-2.203	0.2615	
3.280	-1.313	-1.220	0.0930	
4.196	-0.448	-0.433	0.0149	
MAE	Std orror	may orror	#noints	#count[orr > 1]

MAE	Std error	max error	#points	#count[err >	> 1]
0.323	0.186	0.5357	10	0	

DESRES 157-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.238	0.522	4.1738	289	18	

DESRES 157-157, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.073	0.068	0.2066	24	0	

R739x5\_157-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.305	2.068	2.880	0.8117		
2.414	1.299	1.877	0.5782		
2.523	0.854	1.264	0.4100		
2.633	0.597	0.886	0.2892		
2.852	0.362	0.504	0.1416		
MAE	Std error	max error	#points	#count[err	> 1]
0.446	0.232	0.8117	5	0	

R739x5\_157-157, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.639	1.821	1.822	0.0006
1.712	0.325	0.390	0.0646

1.785	-0.477	-0.398	0.0791			
1.858	-0.867	-0.798	0.0688			
2.006	-1.040	-1.014	0.0263			
MAE	Std error	max error	#poınts	#count[err	>	1]
0.048	0.030	0.0791	5	0		

Liquid Methyl chloride @ 298.15 K

DensityRef-Dens%errHVRef-HV%errDielecRef-D%err#nFrm954.60911.004.819.7518.924.49.749.76-0.23000







#1 Chloroform CHCl3 CID: 6212 CI CI -6.57 -9.09 -9.09, avg ref molpol -8.25 molpol 7.08 9.05 9.05, avg 8.39 0.52 0.04, avg rms molpol 0.04 0.15 Monomer potential fitting RMS: 0.61 ĊI ##Dimer results - Fitting to QM datasets## DESRES 1-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.215 0.389 2.6918 266 13 DESRES 1-1, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.091 0.052 0.2004 25 0 Liquid Chloroform @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1477.95 1479.30 0.1 31.41 31.28 0.4 4.13 4.71 12.2 3000 #1 Chloroform Dimer - DESRES conformations 0.0 -0.5 Energy (kcal/mol) -2 -1.0 0 -4 -1.5 -6 -1 -2.0 -8 -2.5 -7 -10-3.0 -12 -3 -3.5 4.1 4.5 4.9 5.3 4.5 53 45 49 4.1 49 41 53 Water + #1 Chloroform Dimer - randomly generated conformations 8 -1 6 -2 -0.8 Energy (kcal/mol) -3 -1.0-4 -1.2 -5 -1.4 -6 -1.6 -7 -4 -1.8 -6 -8 -2.0 3.2 3.0 32 3.6 3.0 32 3.6 26 2.8 3.4 3.6 3.8 2.6 2.8 3.0 34 3.8 2.6 2.8 3.4 3 8 CM-CM distance (Å) CM-CM distance (Å) CM-CM distance (Å) ---- HIPPO Total ---- HIPPO Electrostatics --\*- HIPPO Dispersion -----HIPPO Induction --- CCSD(T)/SAPT Total ---- SAPT Electrostatics ----- SAPT Dispersion SAPT Induction





#4 Dichloromethane CH2Cl2 CID: 6344 ref molpol -7.93 -5.75 -5.15, avg -6.28 molpol 7.81 5.83 5.51, avg 6.38 rms molpol 0.12 0.08 0.36, avg 0.11 CI C Monomer potential fitting RMS: 0.14 ##Dimer results - Fitting to QM datasets## DESRES 4-4, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.587 0.961 3.9321 25 5 DESRES 4-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.471 4.5385 291 12 0.217 Liquid Dichloromethane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1322.72 1394.30 5.1 28.85 28.82 0.1 8.02 8.82 9.0 5000







#5 Methanal CH20 CID: 712 н ref molpol -2.60 -3.27 -1.91, avg -2.59 molpol 2.68 2.67 2.07, avg 2.47 rms molpol 0.08 0.60 0.16, avg 0.12 0 Н Monomer potential fitting RMS: 0.28 ##Dimer results - Fitting to QM datasets## DESRES 5-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.289 0.498 4.6872 2661 235 DESRES 5-5, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.143 0.413 5.2756 4258 159 Liquid Methanal @ 253.65 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D #nFrm 864.13 810.53 6.6 22.44 23.08 2.8 43.26 -1.00 3000







#6 Methanoic acid CH2O2 CID: 284

ref molpol -4.09 -3.46 -2.40, avg -3.32

molpol 4.03 3.47 2.77, avg 3.42

0 H

Monomer potential fitting RMS: 2.65

0.06

rms molpol

##Dimer results - Fitting to QM datasets##

DESRES 6-water, energy values in kcal/mol

MAEStd error max error #points #count[err > 1]0.6570.9657.32762711624

0.01 0.38, avg 0.11

DESRES 6-6, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.215 0.427 4.7044 1626 64

Liquid Methanoic acid @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1221.93 1214.50 0.6 45.88 19.90 130.6 -1.00 51.10 102.0 -50







#8 Methanamide CH3NO CID: 713 н ref molpol -5.35 -4.03 -3.00, avg -4.13 molpol 5.19 3.97 3.33, avg 4.16 .0 0.07 0.32, avg 0.03 rms molpol 0.16 н Monomer potential fitting RMS: 1.76 Ĥ ##Dimer results - Fitting to QM datasets## DESRES 8-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.496 1.124 12.5480 554 84 DESRES 8-8, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.269 0.414 4.3172 1314 60 Liquid Methanamide @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1.00 1128.80 99.9 1.00 60.57 98.3 -1.00 108.94 100.9 -50







#10 Methanol CH40 CID: 887 ref molpol -3.42 -2.97 -2.91, avg -3.10 molpol 3.44 2.97 2.90, avg 3.10 rms molpol 0.02 0.01 0.01, avg 0.00 H\_0 Monomer potential fitting RMS: 0.94 ##Dimer results - Fitting to QM datasets## R739x5 10-water, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 2.356 2.225 2.847 0.6217 2.330 2.455 1.894 0.4362 1.968 1.652 2.555 0.3156 1.700 2.655 1.465 0.2351 1.186 1.327 2.855 0.1414 Std error max error #points #count[err > 1] MAE 0.350 0.167 0.6217 5 0 HB375x10 10-10, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 1.559 -1.784 -4.483 -2.6993 1.604 -3.925 -6.124 -2.1991

1.649	-5.128	-6.864	-1.7357		
1.694	-5.704	-7.059	-1.3551		
1.739	-5.871	-6.932	-1.0608		
1.784	-5.778	-6.620	-0.8420		
1.829	-5.528	-6.210	-0.6823		
1.966	-4.418	-4.841	-0.4230		
2.195	-2.730	-3.002	-0.2720		
2.656	-1.092	-1.237	-0.1449		
MAE	Std error	max error	#points	#count[err >	> 1]
1.141	0.807	2.6993	10	5	

DESRES 10-10, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.141	0.363	4.4289	1619	51	

R739x5 10-10, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
2.038	2.318	3.149	0.8310			
2.113	1.945	2.540	0.5952			
2.187	1.680	2.123	0.4426			
2.262	1.481	1.822	0.3407			
2.411	1.193	1.413	0.2204			
MAE	Std error	max error	#points	#count[err	>	1]
0.486	0.212	0.8310	5	0		

HB375x10 10-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.755	-1.669	-1.982	-0.3129		
1.815	-3.809	-4.278	-0.4689		
1.832	-1.232	-0.948	0.2844		
1.874	-5.012	-5.448	-0.4356		
1.893	-3.240	-3.224	0.0160		
1.934	-5.590	-5.927	-0.3368		
1.953	-4.368	-4.448	-0.0804		
1.993	-5.761	-5.989	-0.2285		
2.014	-4.914	-5.010	-0.0962		
2.053	-5.673	-5.808	-0.1351		
2.074	-5.081	-5.164	-0.0830		
2.112	-5.429	-5.492	-0.0627		
2.135	-5.009	-5.074	-0.0648		
2.196	-4.794	-4.844	-0.0501		
2.292	-4.339	-4.297	0.0423		
2.379	-3.827	-3.867	-0.0396		
2.592	-2.682	-2.639	0.0426		
2.684	-2.364	-2.425	-0.0611		
3.193	-1.078	-1.085	-0.0068		
3.297	-0.958	-1.015	-0.0569		
MAE	Std error	max error	#points	<pre>#count[err &gt;</pre>	• 1]
0.145	0.141	0.4689	20	0	

DESRES\_10-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.259	0.527	6.0942	2652	183		

Liquid Methanol @ 298.15 K

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	#nFrm
824.78	787.20	4.8	54.17	37.43	44.7	8.14	-1.00	1746












#18 1,2-dichloroethane C2H4Cl2 CID: 11 ref molpol -10.83 -7.03 -6.61, avg -8.16 molpol 10.87 7.41 6.98, avg 8.42 -8.16 CI CI rms molpol 0.04 0.38 0.37, avg 0.26 Monomer potential fitting RMS: 0.22 ##Dimer results - Fitting to QM datasets## DESRES 18-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 288 0.195 0.320 1.9072 11 DESRES 18-18, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.398 0.167 0.6085 24 0 Liquid 1,2-dichloroethane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1215.05 1246.30 2.5 35.43 35.16 0.8 10.60 10.13 4.6 3000





#20 Bromoethane C2H5Br CID: 6332 Br -8.73 -6.56 -6.17, avg ref molpol -7.15 molpol 8.73 6.56 6.19, avg 7.16 0.01 rms molpol 0.00 0.02, avg 0.01 Monomer potential fitting RMS: 0.14 ##Dimer results - Fitting to QM datasets## DESRES 20-20, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.261 0.113 0.3853 25 0 DESRES 20-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 291 0.188 0.276 2.3955 6 Liquid Bromoethane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 0.9 1462.80 1449.30 27.62 27.62 0.0 9.12 9.01 1.2 3000 #20 Bromoethane Dimer - DESRES conformations 1.0 1.0 4 0.8 0.8 Energy (kcal/mol) 2 0.6 0.6 0 0.4 0.4 -2 0.2 0.2 -4⊥ 3.5 0.0↓ 1.0 0.0 4.0 5.0 5.5 6.5 7.0 0.6 0.8 0.2 0.6 0.8 4.5 6.0 0.2 0.4 0.4 1.0 CM-CM distance (Å) CM-CM distance (Å) CM-CM distance (Å) ----- CCSD(T)/CBS Total ----- HIPPO Total









н #23 Ethanamide C2H5NO CID: 178 N -6.69 -6.20 -4.49, avg -5.80 ref molpol Н molpol 6.64 6.15 4.47, avg 5.75 0.05 0.05 0.02, avg rms molpol 0.04 Monomer potential fitting RMS: 1.74 ##Dimer results - Fitting to QM datasets## DESRES 23-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.618 1.351 13.1694 566 89 DESRES 23-23, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 1.425 0.665 21.6443 722 128 HB375x10 23-water, energy values in kcal/mol CM CM (A) Dofe ---

0

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.370	-3.394	4.492	/.8862		
2.437	-5.811	0.013	5.8238		
2.504	-7.184	-2.778	4.4063		
2.571	-7.849	-4.451	3.3975		
2.639	-8.044	-5.386	2.6577		
2.707	-7.933	-5.834	2.0995		
2.774	-7.631	-5.962	1.6693		
2.979	-6.256	-5.399	0.8572		
3.322	-4.049	-3.763	0.2857		
4.014	-1.722	-1.700	0.0221		
MAE	Std error	max error	#points	#count[err	> 11
2.911	2.396	7.8862	10	7	1









#24 N-methylformamide C2H5NO CID: 31254

ref molpol -7.82 molpol 7.80 rms molpol 0.03 -5.47 -4.37, avg -5.89 5.41 0.06 5.87 0.02 4.41, avg 0.04, avg Ν Monomer potential fitting RMS: 1.29 Ĥ ##Dimer results - Fitting to QM datasets## DESRES 24-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.608 4.1591 558 54 0.338 DESRES 24-24, energy values in kcal/mol

Н

**0**۶

MAE	Std error	max error	#points	#count[err	> 1
0.432	0.795	5.7960	692	89	







#25 Nitroethane C2H5NO2 CID: 6587

ref	molpol	-6.70	-7.81	-4.94,	avg	-6.48
	molpol	7.04	6.12	4.94,	avg	6.03
rms	molpol	0.34	1.69	0.01,	avg	0.45



Monomer potential fitting RMS: 0.36



#26 Methoxymethane C2H60 CID: 8254

ref molpol -5.58 -4.62 -4.49, avg -4.90 molpol 5.62 4.57 4.53, avg 4.91 rms molpol 0.04 0.06 0.04, avg 0.01



Monomer potential fitting RMS: 0.40

##Dimer results - Fitting to QM datasets##

DESRES\_26-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.143	0.331	3.6906	562	17	

DESRES\_26-26, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1
0.130	0.334	3.4603	811	23	

HB375x10 26-water, energy values in kcal/mol

CM-CM (A) 2.027 2.094 2.161 2.228 2.295 2.362 2.428	Reference -1.892 -4.073 -5.297 -5.882 -6.049 -5.950 -5.690	HIPPO res -1.680 -4.235 -5.539 -6.076 -6.153 -5.961 -5.623	Abs diff 0.2120 -0.1622 -0.2420 -0.1944 -0.1040 -0.0114 0.0671		
2.964	-2.789	-2.613	0.1759		
MAE 0.142	Std error 0.072	max error 0.2420	#points	<pre>#count[err &gt; 1] 0</pre>	

Liquid Methoxymethane @ 240.00 K

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
739.99	742.08	0.3	21.73	21.72	0.0	7.97	6.88	15.9	4000







#27 Ethanol C2H60 CID: 702 ref molpol -5.38 -4.78 -4.46, avg -4.87 •\_\_\_\_\_\_H molpol 5.36 4.70 4.45, avg 4.84 rms molpol 0.02 0.09 0.01, avg 0.04 Monomer potential fitting RMS: 0.61 ##Dimer results - Fitting to QM datasets## DESRES 27-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 555 0.229 0.517 4.7960 34 DESRES 27-27, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.150 0.337 4.1448 813 15 Liquid Ethanol @ 298.15 K DensityRef-Dens%errHVRef-HV%errDielecRef-D%err#nFrm799.69784.801.948.3742.3214.312.0024.8551.72000







#29 Methyldisulfanylmethane C2H6S2 CID: 12232

S. -8.95 -9.46, avg -10.35 ref molpol -12.64 molpol 12.60 10.13 rms molpol 0.04 1.18 10.13 9.37, avg 10.70 1.18 0.09, avg 0.35 `S´ Monomer potential fitting RMS: 0.72 ##Dimer results - Fitting to QM datasets## DESRES 29-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.269 0.545 5.8014 564 31 DESRES 29-29, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.247 0.365 3.5495 528 24

Liquid Methyldisulfanylmethane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1066.43 1057.32 0.9 38.44 38.32 0.3 8.00 9.60 16.6 2000







#41 Methyl acetate C3H6O2 CID: 6584 0 -5.36, avg -7.98 -6.88 -6.74 ref molpol 7.97 molpol 6.89 5.37, avg 6.74 0.01 0.01, avg rms molpol 0.01 0.00 Monomer potential fitting RMS: 0.68 ##Dimer results - Fitting to QM datasets## DESRES 41-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.222 0.368 4.5641 563 24 DESRES 41-41, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.434	0.645	4.7079	547	67		

HB375x10 41-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.635	-2.580	-0.836	1.7444		
2.707	-4.765	-3.874	0.8915		
2.780	-5.997	-5.527	0.4701		
2.852	-6.590	-6.312	0.2779		
2.925	-6.760	-6.562	0.1977		
2.998	-6.659	-6.491	0.1683		
3.071	-6.391	-6.233	0.1583		
3.292	-5.185	-5.052	0.1333		
3.663	-3.285	-3.232	0.0531		
4.411	-1.326	-1.362	-0.0357		
MAE	Std error	max error	#points	#count[err	> 1]
0.413	0.504	1.7444	10	1	








#42 1,3-dioxolane C3H6O2 CID: 12586 molpol -7.23 -5.82 -6.30, avg -6.45 molpol 7.18 6.13 6.02, avg 6.44 ref molpol rms molpol 0.05 0.32 0.28, avg 0.00 Monomer potential fitting RMS: 0.62 ##Dimer results - Fitting to QM datasets## DESRES 42-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.273 0.498 5.2339 557 32 DESRES 42-42, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.204 0.290 2.3910 545 15 Liquid 1,3-dioxolane @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1062.13 1064.40 0.2 35.44 35.60 0.4 4.21 -1.00 -521.0 1000









#46 N-methylacetamide C3H7NO CID: 6582

ref molpol -8.83 -7.86 -5.86, avg -7.52 molpol 8.66 7.91 5.96, avg 7.51 rms molpol 0.17 0.05 0.10, avg 0.01 Monomer potential fitting RMS: 0.61 ##Dimer results - Fitting to QM datasets## DESRES\_46-46, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.683	1.189	10.4610	509	81		

H | | N

DESRES\_46-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.696	1.638	15.0406	552	86		

HB375x10 46-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.581	-3.722	-2.801	0.9205		
2.650	-6.107	-5.472	0.6346		
2.719	-7.465	-6.987	0.4778		
2.729	-1.783	0.318	2.1011		
2.789	-8.126	-7.757	0.3688		
2.809	-3.630	-1.654	1.9762		
2.858	-8.321	-8.045	0.2756		
2.889	-4.659	-2.876	1.7832		
2.928	-8.214	-8.022	0.1916		
2.969	-5.146	-3.589	1.5574		
2.998	-7.916	-7.801	0.1146		
3.050	-5.282	-3.957	1.3248		
3.130	-5.199	-4.096	1.1032		
3.209	-6.543	-6.597	-0.0536		
3.210	-4.983	-4.083	0.8998		
3.452	-4.048	-3.607	0.4410		
3.564	-4.302	-4.435	-0.1330		
3.856	-2.641	-2.562	0.0786		
4.283	-1.860	-1.936	-0.0757		
4.665	-1.225	-1.287	-0.0623		
MAE	Std error	max error	#points	#count[err	> 11
0.729	0.673	2.1011	20	6	-

HB375x10 46-46, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
2.140	-4.212	-1.429	2.7826
2.187	-6.582	-3.783	2.7990
2.234	-7.938	-5.466	2.4723
2.282	-8.602	-6.598	2.0040
2.329	-8.801	-7.294	1.5065
2.377	-8.694	-7.655	1.0385
2.424	-8.393	-7.765	0.6278











#51 Propan-1-amine C3H9N CID: 7852 Н -8.37 -6.98 -6.58, avg -7.31 ref molpol 8.27 6.84 6.50, avg 7.20 molpol Н 0.11 0.13 0.07, avg 0.10 rms molpol Monomer potential fitting RMS: 0.41 ##Dimer results - Fitting to QM datasets## DESRES 51-51, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.164 0.262 3.5836 521 6 DESRES 51-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.240 0.429 3.1865 536 32 Liquid Propan-1-amine @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 695.41 711.47 2.3 29.69 30.98 4.2 4.67 5.11 8.6 5000 Water + #51 Propan-1-amine Dimer - randomly generated conformations 6







#53 2-methylpropane C4H10 CID: 6360

ref molpol -7.05 -8.02 -8.02, avg -7.70 7.06 7.69 molpol 8.01 8.01, avg rms molpol 0.01 0.02 0.02, avg 0.01 Monomer potential fitting RMS: 0.21 ##Dimer results - Fitting to QM datasets## DESRES 53-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.165 0.388 4.5014 554 16 DESRES 53-53, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.064 0.121 0.9857 479 Ω Liquid 2-methylpropane @ 243.65 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 623.72 613.53 1.7 21.05 22.35 5.8 1.82 1.85 1.6 6000 Water + #53 2-methylpropane Dimer - randomly generated conformations -0.2 -0.5 -0.3 -1.0-0.2 -0.4 -0.4 (column) -0.5 -0.7 -0.7 -0.7 -0.8 -0.9 -1.5 -0.3 -2.0 -0.4 -2.5 -0.5 -3.0 -1.0 -1.1

-0.6

---- HIPPO Induction

SAPT Induction

# Points (not CM-CM distance)

-3.5

--- CCSD(T)/SAPT Total --- SAPT Electrostatics

--+- HIPPO Total

# Points (not CM-CM distance)

# Points (not CM-CM distance)

HIPPO Electrostatics ----- HIPPO Dispersion

----- SAPT Dispersion





#64 Pyrimidine C4H4N2 CID: 9260

ref molpol -10.33 -9.89 -5.48, avg -8.57 8.67 molpol 10.36 9.92 5.74, avg rms molpol 0.03 0.03 0.26, avg 0.11 Monomer potential fitting RMS: 0.27 ##Dimer results - Fitting to QM datasets## DESRES 64-64, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.561 0.314 6.5949 546 30 DESRES 64-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.227 0.421 4.1906 566 28

Liquid Pyrimidine @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1062.92 1016.40 4.6 49.23 49.81 1.2 20.24 -1.00 -2124.0 3000

≥N







#66 Thiophene C4H4S CID: 8030

ref molpol -10.40 -11.22 -6.59, avg -9.40 molpol 11.07 rms molpol 0.67 9.54 0.13 11.07 6.47, avg 0.15 0.13, avg Monomer potential fitting RMS: 0.16 ##Dimer results - Fitting to QM datasets## R739x5 66-water, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 3.365 2.190 1.999 -0.1911 3.483 1.099 0.822 -0.2772 3.602 0.482 0.181 -0.3013 0.150 3.720 -0.147 -0.2969 3.957 -0.084 -0.346 -0.2618 MAE Std error max error #points #count[err > 1] 0.040 0.3013 5

R739x5 66-66, energy values in kcal/mol

0.266

CM	-CM (A)	Reference	HIPPO res	Abs diff		
2	.709	2.282	2.503	0.2211		
2	.787	0.727	0.788	0.0613		
2	.866	-0.134	-0.131	0.0026		
2	.944	-0.567	-0.587	-0.0199		
3	.101	-0.792	-0.830	-0.0377		
	MAE	Std error	max error	#points	<pre>#count[err &gt;</pre>	1]
	0.069	0.079	0.2211	5	0	
Liquid	Thiopher	ne @ 298.15	K			

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
1043.82	1059.01	1.4	34.71	34.65	0.2	2.40	-1.00	-340.3	1000



0



#67 1h-pyrrole C4H5N CID: 8027 ref molpol -9.33 -8.93 -5.79, avg -8.02 molpol 9.35 8.94 5.48, avg 7.93 0.02 0.01 0.30, avg 0.09 rms molpol Monomer potential fitting RMS: 0.32 ##Dimer results - Fitting to QM datasets##

DESRES\_67-67, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.309	0.553	4.7842	634	36		

HB375x10\_67-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.977	-1.626	-0.587	1.0394		
3.056	-3.575	-2.823	0.7519		
3.134	-4.661	-4.074	0.5869		
3.212	-5.175	-4.691	0.4837		
3.291	-5.319	-4.908	0.4112		
3.369	-5.230	-4.878	0.3525		
3.447	-5.002	-4.701	0.3007		
3.682	-4.017	-3.843	0.1737		
4.073	-2.551	-2.506	0.0453		
4.856	-1.116	-1.135	-0.0192		
MAE	Std error	max error	#points	#count[err 3	> 1]
0.416	0.301	1.0394	10	1	

DESRES 67-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.276	0.549	4.9026	559	34	

Liquid 1h-pyrrole @ 298.15 K

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
979.48	965.30	1.5	53.61	45.15	18.7	9.51	7.92	20.1	1000











#73 Ethoxyethene C4H80 CID: 8023

ref molpol -11.46 -7.66 -6.84, avg -8.65 molpol 11.43 7.67 6.85, avg 8.65 rms molpol 0.03 0.01 0.01, avg 0.01



Monomer potential fitting RMS: 0.17

Liquid Eth	oxyethene	@ 293.	15 K						
Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
713.31	758.90	6.0	27.83	27.84	0.0	6.25	-1.00	-724.7	1000









#80 N,n-dimethylacetamide C4H9NO CID: 31374 ref molpol -10.59 -10.02 -7.13, avg -9.24 10.60 10.00 7.09, avg 9.23 molpol 0.01 0.01 0.02 0.03, avg rms molpol Monomer potential fitting RMS: 1.04 ##Dimer results - Fitting to QM datasets## DESRES 80-80, energy values in kcal/mol

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 1.681
 2.751
 10.9311
 26
 8

DESRES 80-water, energy values in kcal/mol

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.769
 2.533
 31.0263
 561
 78







#82 Pyridine C5H5N CID: 1049
ref molpol -10.70 -11.34 -6.02, avg -9.35
molpol 10.86 10.85 6.17, avg 9.29
rms molpol 0.16 0.49 0.16, avg 0.06
Monomer potential fitting RMS: 0.30
##Dimer results - Fitting to QM datasets##
DESRES\_82-water, energy values in kcal/mol
MAE Std error max error #points #count[err > 1]
0.322 0.657 5.4068 565 53

DESRES\_82-82, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.203	0.410	3.9218	546	19		

HB375x10 82-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
3.128	-2.162	-0.965	1.1972		
3.206	-4.659	-4.251	0.4078		
3.284	-6.103	-6.058	0.0448		
3.361	-6.833	-6.911	-0.0782		
3.439	-7.085	-7.166	-0.0810		
3.517	-7.024	-7.058	-0.0337		
3.595	-6.768	-6.740	0.0284		
3.828	-5.504	-5.344	0.1595		
4.217	-3.454	-3.285	0.1689		
4.995	-1.372	-1.318	0.0537		
MAE	Std error	max error	#points	<pre>#count[err &gt; 1</pre>	L]
0.225	0.341	1.1972	10	1	

R739x5 82-82, energy values in kcal/mol

CM-CM (A) 3.111	Reference 2.403	HIPPO res 2.025	Abs diff -0.3778		
3.198	1.987	1.630	-0.3570		
3.284	1.694	1.374	-0.3196		
3.370	1.473	1.199	-0.2741		
3.543	1.161	0.969	-0.1924		
MAE 0.304	Std error 0.066	max error 0.3778	#points 5	#count[err 0	> 1]

R739x5\_82-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
3.819	2.320	2.679	0.3594
3.951	1.939	2.150	0.2108
4.083	1.669	1.792	0.1235
4.215	1.467	1.540	0.0726
4.479	1.179	1.203	0.0242

MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.158	0.118	0.3594	5	0

Liquid Pyridine @ 298.15 K

Density	Ref-Dens	%err	HV	Ref-HV	%err	Dielec	Ref-D	%err	#nFrm
1008.40	977.80	3.1	45.32	40.15	12.9	16.73	12.98	28.9	1000








#97 1,3-difluorobenzene C6H4F2 CID: 9741

-6.39, avg -10.14 ref molpol -11.84 -12.20 11.94 11.93 10.16 molpol 6.61, avg rms molpol 0.10 0.27 0.22, avg 0.02 Monomer potential fitting RMS: 0.10 F ##Dimer results - Fitting to QM datasets## DESRES 97-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.103 0.135 0.7061 110 0 Liquid 1,3-difluorobenzene @ 298.15 K Density Ref-Dens %err #nFrm HV Ref-HV %err Dielec Ref-D %err 1168.53 1162.02 0.6 58.68 36.58 60.4 -1.00 5.06 119.8 -50 Water + #97 1,3-difluorobenzene Dimer - randomly generated conformations  $^{-1}$ 5 -----0.50 4 -2 -0.75 -3 Energy (kcal/mol) -1.00 2 -4 -1.25 1 -5 -1.50 0 -6 -1.75 -1 -7 -2.00 -2 -8 -2.25 -3 -9 -2.50 -4 -10 -2.75 # Points (not CM-CM distance) # Points (not CM-CM distance) # Points (not CM-CM distance) --+- HIPPO Total ----- HIPPO Electrostatics --\*- HIPPO Dispersion 

--- CCSD(T)/SAPT Total --- SAPT Electrostatics



----- SAPT Dispersion

SAPT Induction



F #99 Fluorobenzene C6H5F CID: 10008 ref molpol -12.09 -11.79 -6.49, avg -10.12 molpol 12.07 11.76 6.65, avg 10.16 rms molpol 0.02 0.03 0.16, avg 0.04 Monomer potential fitting RMS: 0.14 ##Dimer results - Fitting to QM datasets## DESRES 99-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 287 0.237 0.496 4.6684 13 DESRES 99-99, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.162 0.4701 25 0 0.270 Liquid Fluorobenzene @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 1008.26 1019.10 1.1 37.94 34.58 9.7 4.74 5.34 11.2 1000 #nFrm















#152 Dimethyl sulfide C2H6S CID: 1068 -8.27 -7.17 -6.21, avg -7.22 ref molpol 8.23 7.16 6.26, avg 7.22 molpol S' 0.03 0.02 0.00 rms molpol 0.05, avg Monomer potential fitting RMS: 0.62 ##Dimer results - Fitting to QM datasets## DESRES 152-152, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.824 0.369 8.1883 715 66 DESRES 152-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.261 0.450 3.7378 559 37 Liquid Dimethyl sulfide @ 293.15 K HV Ref-HV %err Dielec Ref-D %err #nFrm Density Ref-Dens %err 27.65 18.9 847.29 848.30 0.1 32.88 6.70 6.42 4.1 3000 Water + #152 Dimethyl sulfide Dimer - S101x7 conformations 0.0 3 2  $^{-1}$ -2.5 -2 1 -5.0 Energy (kcal/mol) -3 0 -7.5 -4 -1 -10.0 -5 -2 -6 -12.5 -3 -7 -15.0 -4 -8 -17.5 -5 -9 3.6-20.0 -6 -10 2.8 3.0 3.2 3.4 3 0 32 3.4 3.6 28 3 0 3.2 3.4 3 6 28 CM-CM distance (Å) CM-CM distance (Å) CM-CM distance (Å) ---- HIPPO Total HIPPO Electrostatics ----- HIPPO Dispersion HIPPO Induction --- CCSD(T)/SAPT Total SAPT Electrostatics ---- SAPT Dispersion SAPT Induction





#153 Ethene C2H4 CID: 6325 ref molpol -3.67 -3.30 -5.03, avg -4.00 molpol 3.52 4.12 5.00, avg 4.22 0.15 0.82 0.03, avg 0.22 rms molpol Monomer potential fitting RMS: 0.18 ##Dimer results - Fitting to QM datasets## DESRES 153-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.491 0.781 4.7408 2679 456 R739x5 153-153, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 1.615 2.385 2.774 0.3885 1.682 1.242 1.198 -0.0443 1.750 0.538 0.273 -0.2648 -0.242 -0.3638 0.122 1.819 -0.227 -0.3862 1.957 -0.613 Std error max error #points #count[err > 1] MAE 0.290 0.131 0.3885 5 0 R739x5 153-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.840	2.229	3.347	1.1184		
1.926	1.476	2.206	0.7301		
2.012	1.011	1.492	0.4809		
2.098	0.726	1.047	0.3206		
2.271	0.445	0.594	0.1488		
MAE	Std orror	may arrar	#pointo	#count [orr	< 11
MAE	Sta error	max error	#points	#counclerr	> _]
0.560	0.339	1.1184	5	1	

DESRES 153-153, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.328	0.523	3.3714	1627	164	

HB375x10 153-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.718	0.583	1.940	1.3567
1.794	-1.048	-0.213	0.8354
1.869	-1.954	-1.415	0.5391
1.945	-2.389	-2.021	0.3678
2.021	-2.529	-2.263	0.2660
2.096	-2.490	-2.289	0.2009
2.172	-2.349	-2.194	0.1548
2.399	-1.738	-1.667	0.0715
2.777	-0.919	-0.912	0.0069

289









#155 Indole C8H7N CID: 798

ref molpol -20.48 -15.62 -8.87, avg -14.99 molpol 20.09 15.31 8.78, avg 14.73 rms molpol 0.39 0.32 0.09, avg 0.26

Monomer potential fitting RMS: 0.17

##Dimer results - Fitting to QM datasets##

DESRES 155-water, energy values in kcal/mol

---- HIPPO Total

---- CCSD(T)/SAPT Total



----- HIPPO Electrostatics

---- SAPT Electrostatics



----- HIPPO Dispersion

----- SAPT Dispersion

---- HIPPO Induction

SAPT Induction

-



#156 Methyl amine CH5N CID: 6329

ref molpol -3.53 -3.64 -4.16, avg -3.77 molpol 3.55 3.56 4.12, avg 3.74 rms molpol 0.02 0.08 0.04, avg 0.04

Monomer potential fitting RMS: 0.12

##Dimer results - Fitting to QM datasets##

R739x5 156-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
2.362	2.333	2.691	0.3580			
2.467	1.960	2.192	0.2324			
2.572	1.685	1.842	0.1567			
2.677	1.473	1.582	0.1093			
2.888	1.161	1.219	0.0584			
MAE	Std error	max error	#points	#count[err	> 1	1]
0.183	0.105	0.3580	5	0		

R739x5\_156-156, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.142	2.482	2.659	0.1770		
2.227	2.045	2.141	0.0961		
2.313	1.723	1.779	0.0561		
2.398	1.478	1.513	0.0348		
2.571	1.126	1.143	0.0174		
MAE	Std error	max error	#points	#count[err	> 11
0.076	0.057	0.1770	5	0	-

HB375x10 156-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.705	-2.777	0.664	3.4408		
1.765	-5.228	-3.429	1.7991		
1.824	-6.624	-5.744	0.8804		
1.883	-7.303	-6.907	0.3956		
1.943	-7.504	-7.343	0.1611		
2.002	-7.395	-7.330	0.0652		
2.062	-7.094	-7.052	0.0423		
2.241	-5.715	-5.620	0.0949		
2.541	-3.535	-3.404	0.1312		
3.141	-1.351	-1.300	0.0506		
MAE	Std error	max error	#points	#count[err	> 1]
0.706	1.053	3.4408	10	2	

DESRES 156-156, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.095	0.262	3.5873	1306	21	



DESRES 156-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.212	0.508	7.3904	564	22		

HB375x10 156-156, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.515	-0.621	1.405	2.0259		
1.569	-2.527	-0.990	1.5366		
1.624	-3.573	-2.418	1.1549		
1.679	-4.057	-3.197	0.8598		
1.734	-4.182	-3.549	0.6330		
1.789	-4.085	-3.626	0.4586		
1.844	-3.860	-3.534	0.3259		
2.009	-2.932	-2.837	0.0952		
2.285	-1.641	-1.664	-0.0227		
2.837	-0.544	-0.575	-0.0313		
MAE	Std error	max error	#points	#count[err	> 1]
0.714	0.645	2.0259	10	3	

Liquid Methyl amine @ 298.15 K

Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 701.34 656.00 6.9 27.21 23.37 16.4 8.26 16.55 50.1 3000









#157 Methyl chloride CH3Cl CID: 6327 -5.26 -3.82 ref molpol -3.82, avg -4.30 molpol 4.88 3.95 3.95, avg 4.26 0.13, avg 0.38 0.13 0.04 rms molpol Monomer potential fitting RMS: 0.24 ##Dimer results - Fitting to QM datasets## HB300SPXx10 157-water, energy values in kcal/mol CM-CM (A) Reference HIPPO res Abs diff 1.997 0.595 0.497 -0.0978 

 2.089
 -1.805
 -1.515
 0.2904

 2.181
 -3.072
 -2.589
 0.4826

 2.272
 -3.631
 -3.079
 0.5522

 2.364
 -3.761
 -3.212
 0.5487

 2.455
 -3.645
 -3.138
 0.5066

2.547	-3.399	-2.952	0.4473
2.822	-2.465	-2.199	0.2658
3.280	-1.313	-1.218	0.0946
4.196	-0.448	-0.433	0.0152

MAE	Std error	max error	#points	#count[err	>	1]
0.330	0.195	0.5522	10	0		

DESRES 157-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1	1]
0.237	0.517	4.1283	289	16		

DESRES 157-157, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.084	0.081	0.2467	24	0	

R739x5 157-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
2.305	2.068	2.891	0.8232			
2.414	1.299	1.886	0.5870			
2.523	0.854	1.271	0.4167			
2.633	0.597	0.891	0.2944			
2.852	0.362	0.507	0.1448			
MAE	Std error	max error	#points	#count[err	>	1]
0.453	0.235	0.8232	5	0		

R739x5 157-157, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.639	1.821	1.891	0.0702
1.712	0.325	0.444	0.1187
1.785	-0.477	-0.356	0.1213
1.858	-0.867	-0.765	0.1020
2.006	-1.040	-0.993	0.0473



Liquid Methyl chloride @ 298.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 953.35 911.00 4.6 18.90 18.92 0.1 10.06 9.76 3.1 3000











#164 Methane CH4 CID: 297

ref molpol -2.43 -2.43 -2.43, avg -2.43 molpol 2.65 2.65 2.65, avg 2.65 rms molpol 0.21 0.22 0.22, avg 0.22



Monomer potential fitting RMS: 0.06

##Dimer results - Fitting to QM datasets##

DESRES 164-164, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.194	0.341	4.4902	4276	202	

R739x5\_164-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
1.330	1.782	5.083	3.3011	
1.388	0.870	3.208	2.3375	
1.447	0.331	1.987	1.6560	
1.450	2.217	4.275	2.0576	
1.496	1.117	2.285	1.1681	
1.505	0.028	1.203	1.1753	
1.541	0.385	1.035	0.6502	
1.587	-0.087	0.268	0.3553	
1.623	-0.203	0.389	0.5915	
1.677	-0.545	-0.440	0.1050	
MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
1.340	0.951	3.3011	10	6

R739x5 164-164, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
1.498	1.673	3.554	1.8811	
1.559	0.655	1.982	1.3272	
1.621	0.062	0.991	0.9288	
1.654	1.930	2.062	0.1321	
1.682	-0.262	0.377	0.6389	
1.703	1.069	0.974	-0.0952	
1.752	0.485	0.283	-0.2019	
1.800	0.098	-0.142	-0.2401	
1.804	-0.481	-0.205	0.2757	
1.877	2.856	1.329	-1.5271	
1.898	-0.295	-0.523	-0.2276	
1.917	2.019	0.430	-1.5890	
1.956	1.392	-0.117	-1.5088	
1.996	0.925	-0.432	-1.3571	
2.075	0.333	-0.667	-0.9996	
MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.862	0.614	1.8811	15	6

HB375x10 164-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
1.426	0.336	0.228	-0.1076	
1.480	-0.374	-0.464	-0.0903	
1.535	-0.753	-0.814	-0.0608	
1.590	-0.923	-0.958	-0.0345	
1.645	-0.967	-0.982	-0.0150	
1.700	-0.938	-0.941	-0.0029	
1.755	-0.871	-0.867	0.0039	
1.920	-0.611	-0.607	0.0043	
2.194	-0.297	-0.301	-0.0036	
2.743	-0.078	-0.082	-0.0045	
MAE	Std error	max error	#points	<pre>#count[err &gt;</pre>
0.033	0.038	0.1076	10	0

DESRES\_164-water, energy values in kcal/mol



1]

- CCSD(T) Total --+- HIPPO Total






#165 Ammonia H3N CID: 222

ref molpol -2.26 -2.01 -2.01, avg -2.09 molpol 2.22 2.22 2.22, avg 2.22 rms molpol 0.04 0.21 0.21, avg 0.13

Monomer potential fitting RMS: 0.10

##Dimer results - Fitting to QM datasets##

DESRES 165-165, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.159	0.428	5.0302	4261	185	

HB375x10\_165-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.246	-2.138	-2.008	0.1299		
1.294	-4.430	-4.907	-0.4767		
1.342	-5.739	-6.417	-0.6783		
1.389	-6.382	-7.056	-0.6741		
1.437	-6.585	-7.161	-0.5756		
1.484	-6.502	-6.949	-0.4474		
1.532	-6.242	-6.562	-0.3205		
1.674	-5.033	-5.082	-0.0493		
1.912	-3.124	-3.043	0.0805		
2.388	-1.222	-1.184	0.0380		
MAE	Std error	max error	#points	#count[err	> 1]
0.347	0.245	0.6783	10	0	

DESRES 165-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.252	0.492	5.0265	2667	169	

R739x5 165-water, energy values in kcal/mol

CM - CM (A)	Reference	HIPPO res	Abs diff		
CH CH (A)	Kererence	millo les	ADS UIII		
1.764	2.207	2.344	0.1374		
1.849	1.883	1.963	0.0801		
1.934	1.635	1.682	0.0471		
2.019	1.437	1.466	0.0286		
2.188	1.138	1.147	0.0089		
MAE	Std error	max error	#points	#count[err	> 1]
0.060	0.045	0.1374	5	0	

HB375x10 165-165, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.421	-0.097	-0.927	-0.8301
1.478	-1.694	-2.161	-0.4668
1.534	-2.585	-2.833	-0.2478
1.590	-3.016	-3.136	-0.1198



1.647	-3.153	-3.202	-0.0493			
1.703	-3.107	-3.122	-0.0154			
1.760	-2.955	-2.957	-0.0019			
1.929	-2.278	-2.286	-0.0084			
2.212	-1.306	-1.335	-0.0293			
2.777	-0.460	-0.481	-0.0210			
MAE	Std error	max error	#points	#count[err	>	1]
0.179	0.258	0.8301	10	0		

R739x5\_165-165, energy values in kcal/mol

Reference	HIPPO res	Abs diff			
2.237	2.128	-0.1086			
1.887	1.799	-0.0884			
1.617	1.546	-0.0713			
1.401	1.344	-0.0572			
1.075	1.039	-0.0363			
Std error	max error	#points	#count[err	>	11
0.025	0.1086	"poince 5	0	-	- 1
	Reference 2.237 1.887 1.617 1.401 1.075 Std error 0.025	Reference         HIPPO res           2.237         2.128           1.887         1.799           1.617         1.546           1.401         1.344           1.075         1.039           Std error         max error           0.025         0.1086	Reference         HIPPO res         Abs diff           2.237         2.128         -0.1086           1.887         1.799         -0.0884           1.617         1.546         -0.0713           1.401         1.344         -0.0572           1.075         1.039         -0.0363           Std error         max error         #points           0.025         0.1086         5	Reference       HIPPO res       Abs diff         2.237       2.128       -0.1086         1.887       1.799       -0.0884         1.617       1.546       -0.0713         1.401       1.344       -0.0572         1.075       1.039       -0.0363         Std error       max error       #points       #count[err         0.025       0.1086       5       0	Reference       HIPPO res       Abs diff         2.237       2.128       -0.1086         1.887       1.799       -0.0884         1.617       1.546       -0.0713         1.401       1.344       -0.0572         1.075       1.039       -0.0363         Std error       max error       #points       #count[err > 0.025         0.1086       5       0









#171 Sulfane H2S CID: 402



ref	molpol	3.56	3.58	3.65,	avg	3.60
	molpol	3.30	3.46	3.53,	avg	3.43
rms	molpol	0.27	0.12	0.12,	avg	0.17

Monomer potential fitting RMS: 0.23

##Dimer results - Fitting to QM datasets##

R739x5 171-171, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
1.666	2.256	1.919	-0.3368		
1.746	1.046	0.910	-0.1359		
1.826	0.383	0.373	-0.0097		
1.907	0.042	0.102	0.0597		
2.068	-0.169	-0.070	0.0986		
MAE	Std error	max error	#points	#count[err	> 1]
0.128	0.112	0.3368	5	0	-

DESRES 171-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.191	0.528	10.1426	2773	107		

DESRES 171-171, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err 3	> 1]
0.099	0.302	5.1787	4379	70	

R739x5\_171-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
2.012	2.109	2.298	0.1894			
2.108	1.226	1.337	0.1107			
2.204	0.727	0.792	0.0650			
2.301	0.455	0.489	0.0341			
2.493	0.245	0.240	-0.0048			
MAE	Std error	max error	#points	#count[err	>	1]
0.081	0.065	0.1894	5	0		

HB300SPXx10 171-171, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.748	1.467	3.993	2.5265
1.816	-0.070	1.356	1.4261
1.885	-0.948	-0.128	0.8200
1.953	-1.398	-0.908	0.4900
2.022	-1.580	-1.267	0.3125
2.090	-1.600	-1.383	0.2165
2.158	-1.526	-1.365	0.1612
2.364	-1.120	-1.033	0.0871
2.706	-0.563	-0.530	0.0333
3.390	-0.157	-0.155	0.0020

Std error max error #points #count[err > 1] MAE 0.608 0.763 2.5265 10 2 Liquid Sulfane @ 281.20 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 828.43 816.00 1.5 15.15 15.90 4.7 5.53 -1.00 -653.0 2000 171 failed to run analysis Saving: True 241 Loading previous prmdict: newprms14.pickle ['dispersion', 'repulsion', 'chgtrn'] CCSD(T) DIMERS SAPT DIMERS #241 2-methoxyethanol C3H8O2 CID: 8019 ref molpol -6.89 -8.80 0.00, avg -5.23 molpol 6.88 5.41 5.22, avg 5.84 rms molpol 0.01 3.40 5.22, avg 0.61 Monomer potential fitting RMS: 0.58 ##Dimer results - Fitting to QM datasets## DESRES 241-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.481 3.0579 121 8 0.300 Liquid 2-methoxyethanol @ 293.15 K Density Ref-Dens %err HV Ref-HV %err Dielec Ref-D %err #nFrm 840.99 964.70 12.8 45.14 40.85 10.5 7.74 -1.00 -874.4 1000



## Results for molecules from Data set 2 (Appendix D, Table D.2)

#169 Hydrogen Bromide (HBr) CID: 260

ref rms	molpol molpol molpol	3.69 2.56 1.10	3.42 2.39 1.03	3.42, 2.39, 1.03,	avg avg avg	3.51 2.45 1.06		H —— Br		
Mono	omer potent	cial fitt	ing RMS	: 0.36						
##Dimer results - Fitting to QM datasets##										
HB3(	00SPXx10_16	59-169, e	energy v	alues	in kcal,	/mol				
	CM-CM (A)	Referenc	e HIPP	0 res	Abs di	Ef				
	1.763	1.309	0.	33Z CAC	-0.977.					
	1.829	-0.320	-0.	646	-0.325	1 -				
	1.896	-1.219	-⊥.	278	-0.0595	) -				
	1.962	-1.656	-1.	656	-0.0000	)				
	2.028	-1.808	-1.	849	-0.0413	3				
	2.095	-1.794	-1.	913	-0.1193	3				
	2.161	-1.687	-1.	890	-0.2025	5				
	2.360	-1.209	-1.	564	-0.354	7				
	2.692	-0.597	-0.	924	-0.3273	L				
	3.356	-0.167	-0.	297	-0.1295	5				
	MAE	Std ern	for max	error	#point	ts #co	ount[err	> 1]		
	0.254	0.270	0.	9771	10		0			

HB300SPXx10\_169-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff	
2.432	-1.541	-0.927	0.6137	
2.510	-3.125	-2.874	0.2506	
2.587	-4.072	-3.962	0.1101	
2.664	-4.573	-4.493	0.0795	
2.741	-4.766	-4.673	0.0929	
2.818	-4.751	-4.635	0.1161	
2.895	-4.601	-4.466	0.1347	
3.127	-3.787	-3.652	0.1346	
3.513	-2.396	-2.346	0.0504	
4.284	-0.948	-0.977	-0.0292	
MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.161	0.161	0.6137	10	0



#173 Propanal (C3H6O) CID: 527 ref molpol 5.95 7.36 4.98, avg molpol 6.00 5.32 4.50, avg 6.10 Н 5.27 rms molpol 0.01 2.03 0.48, avg 0.83 Monomer potential fitting RMS: 0.26 **≥**0 ##Dimer results - Fitting to QM datasets## DESRES\_173-173, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.555 1.516 17.6181 696 87 DESRES\_173-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.319	0.565	5.7335	531	37		





#178 Hydrogen Cyanide CID: 768

3.30 2.06 2.06, avg ref molpol 2.48 N 1.73 molpol 2.08 1.73, avg 1.85 rms molpol 1.22 0.33 0.33, avg 0.63 Monomer potential fitting RMS: 0.09 ##Dimer results - Fitting to QM datasets## R739x5 178-178, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.118 0.063 0.1930 5 0 DESRES 178-178, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.108 0.063 0.1807 24 0 DESRES 178-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.210 0.460 4.0144 284 17 R739x5 178-water, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 1.790 0.369 2.3515 5 5





#181 Methanethiol (CH4S) CID: 878

ref molpol 4.93 6.25 4.93, avg 5.37 molpol 4.66 4.95 4.66, avg 4.76 rms molpol 0.27 1.30 0.27, avg 0.61



Monomer potential fitting RMS: 0.47

##Dimer results - Fitting to QM datasets##

R739x5 181-181, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff		
2.077	2.346	0.718	-1.6283		
2.157	1.185	0.171	-1.0141		
2.237	0.546	-0.085	-0.6307		
2.316	0.215	-0.183	-0.3975		
2.476	-0.001	-0.176	-0.1754		
MAE	Std error	max error	#points	#count[err	> 1]
0.769	0.511	1.6283	5	2	

DESRES 181-181, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err 3	> 1]
0.147	0.299	3.6706	1265	29	

R739x5 181-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
2.572	2.168	2.283	0.1149			
2.681	1.450	1.573	0.1235			
2.791	1.037	1.152	0.1153			
2.901	0.800	0.900	0.0996			
3.120	0.585	0.646	0.0607			
MAE	Std error	max error	#points	#count[err	>	1]
0.103	0.022	0.1235	5	0		

DESRES 181-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.181	0.346	2.6450	625	27		

HB300SPXx10 181-181, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.583	1.289	1.855	0.5656
1.648	-0.961	-0.383	0.5775
1.713	-2.206	-1.686	0.5205
1.778	-2.800	-2.376	0.4244
1.844	-2.984	-2.673	0.3114
1.910	-2.925	-2.724	0.2010
1.976	-2.731	-2.628	0.1026
2.175	-1.917	-2.006	-0.0886
2.510	-0.899	-1.046	-0.1470
3.187	-0.213	-0.275	-0.0623

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MAE	Std error	max error	#points	#count[err	> 1]
0.300	0.196	0.5775	10	0	

HB300SPXx10\_181-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
1.999	0.446	2.189	1.7425
2.087	-2.131	-0.844	1.2874
2.175	-3.539	-2.531	1.0079
2.264	-4.197	-3.371	0.8256
2.352	-4.385	-3.690	0.6949
2.440	-4.292	-3.698	0.5936
2.528	-4.041	-3.532	0.5095
2.793	-2.999	-2.681	0.3182
3.234	-1.617	-1.480	0.1372
4.117	-0.531	-0.501	0.0302





----- HIPPO Electrostatics

---- SAPT Electrostatics

---- HIPPO Total

---- CCSD(T)/CBS Total

CM-CM (Å)

--\*- HIPPO Dispersion

----- SAPT Dispersion

HIPPO Induction

SAPT Induction

3.8





#190 2-Sulfanylethanol (C2H6OS) CID: 1567

ref molpol 9.52 7.21 6.81, avg 7.85 molpol 9.55 7.09 6.48, avg 7.70 rms molpol 0.03 0.12 0.33, avg 0.15



Monomer potential fitting RMS: 0.23

##Dimer results - Fitting to QM datasets##

DESRES 190-water, energy values in kcal/mol



#194 1,4-Dichlorobenzene CID: 4685

ref molpol 13.88 20.91 0.00, avg 11.60 molpol 14.05 12.43 7.66, avg 11.38 rms molpol 0.17 8.48 7.66, avg 0.22

Monomer potential fitting RMS: 0.15

##Dimer results - Fitting to QM datasets##

DESRES 194-water, energy values in kcal/mol



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#196 2-Aminoethanethiol CID: 6058

ref molpol 10.48 7.82 7.46, avg 8.59 molpol 10.53 7.84 7.17, avg 8.51 rms molpol 0.05 0.02 0.29, avg 0.08



Monomer potential fitting RMS: 0.31

##Dimer results - Fitting to QM datasets##

DESRES 196-water, energy values in kcal/mol



#200 Ethane CID: 6324

ref molpol 3.96 3.93 4.50, avg 4.14 molpol 3.02 3.02 3.24, avg 3.09 rms molpol 0.94 0.94 1.26, avg 1.05

Monomer potential fitting RMS: 0.11

##Dimer results - Fitting to QM datasets ##

DESRES 200-200, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.107 0.174 1.9625 1171 9

DESRES\_200-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err >	> 1]
0.090	0.214	2.5847	557	7	





#203 Propane CID: 6334 molpol 5.77 molpol 5.18 6.45 5.45, avg 5.89 5.81 4.94, avg 5.31 ref molpol 5.89 0.59 0.64 0.51, avg 0.58 rms molpol Monomer potential fitting RMS: 0.22 ##Dimer results - Fitting to QM datasets## DESRES\_203-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.133 0.273 2.0186 558 16

DESRES\_203-203, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.229	0.267	1.5365	725	13	





#204 Propyne CID: 6335

H\_C\_C\_ ref molpol 7.25 4.21 4.21, avg 5.22 4.25 3.23 3.23, avg molpol 3.57 0.97, avg rms molpol 3.00 0.97 1.65 Monomer potential fitting RMS: 0.13 ##Dimer results - Fitting to QM datasets## DESRES 204-204, energy values in kcal/mol Std error max error #points #count[err > 1] MAE

0.113 0.3343 26 0.190 0

DESRES 204-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1	]
0.142	0.200	1.1262	289	1		



	HIPPO Total	 HIPPO Electrostatics	 HIPPO Dispersion		HIPPO Induction
-	<ul> <li>CCSD(T)/CBS Total</li> </ul>	 SAPT0 Electrostatics	 SAPT0 Dispersion	-	SAPT0 Induction



#205 Iodoethane CID: 6340 8.21 ref molpol 11.20 7.82, avg 9.08 10.97 8.35 molpol 7.97, avg 9.10 rms molpol 0.24 0.14 0.15, avg 0.02



Monomer potential fitting RMS: 0.22

##Dimer results - Fitting to QM datasets##

DESRES 205-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1	_ ]
0.108	0.160	1.0900	150	1		



#207 Ethanethiol CID: 6343 molpol 8.40 molpol 8.42 6.69 ref molpol 6.38, avg 7.16 S 6.61 6.06, avg 7.03 ٠H rms molpol 0.02 0.08 6.32, avg 0.13 Monomer potential fitting RMS: 0.11 ##Dimer results - Fitting to QM datasets## DESRES 207-207, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.286 0.360 2.3349 723 39

DESRES\_207-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.204	0.361	3.3356	564	21		





#209 1,1-Difluoroethane CID: 6368

4.09 4.30 4.47, avg ref molpol 4.29 **F**. 4.23 molpol 4.09 4.53, avg 4.28 0.00 0.07 0.06, avg rms molpol 0.00 Monomer potential fitting RMS: 0.45 ##Dimer results - Fitting to QM datasets## DESRES 209-209, energy values in kcal/mol ~ · · 1 . . п

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MAE	Std error	max error	#points	#count[err	> 1]
0.239	0.115	0.4251	23	0	

DESRES\_209-water, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.145 0.244 1.6071 284 6




#210 Fluoroform CID: 6373 ,F molpol 2.57 molpol 2.60 F. 2.78 ref molpol 2.78, avg 2.71 2.77 2.77, avg 2.71 rms molpol 0.03 0.01 0.01, avg 0.01 Monomer potential fitting RMS: 0.20 ##Dimer results - Fitting to QM datasets## DESRES\_210-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.114 0.148 0.9967 262 0

DESRES\_210-210, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.037	0.022	0.0643	23	0		



#214 2,2-Dimethylbutane CID: 6403

ref molpol 11.83 10.80 10.76, avg 11.13 molpol 11.83 10.78 10.77, avg 11.13 rms molpol 0.00 0.02 0.02, avg 0.00

Monomer potential fitting RMS: 0.42

##Dimer results - Fitting to QM datasets##

DESRES\_214-water, energy values in kcal/mol



 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.133
 0.249
 2.9400
 529
 7



#215 Hexafluoroethane CID: 6431

ref	molpol	4.71	4.77	4.77,	avg	4.75
	molpol	4.72	4.40	4.40,	avg	4.51
rms	molpol		0.01		0.37	

Monomer potential fitting RMS: 0.31

##Dimer results - Fitting to QM datasets##

DESRES 215-215, energy values in kcal/mol

MAE	Std error	max error	#points	<pre>#count[err &gt;</pre>	> 1]
0.251	0.137	0.4238	24	0	

DESRES\_215-water, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.153 0.276 2.4043 260 4







#217 2-Methylbutane CID: 6556 9.41 10.37, avg 9.42 10.38, avg 8.47 ref molpol 9.42 molpol 8.46 9.42 0.01 0.01 0.01, avg rms molpol 0.00 Monomer potential fitting RMS: 0.62 ##Dimer results - Fitting to QM datasets## DESRES\_217-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.127 0.149 1.3292 537 1

DESRES\_217-217, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.054	0.072	0.3424	150	0	



#219 Butan-2-one CID: 6569 0.00, avg ref molpol 8.12 8.95 5.69 molpol 8.14 8.14 5.71, avg 7.33 0.02 0.81 5.71, avg 1.64 rms molpol Monomer potential fitting RMS: 3.94 ##Dimer results - Fitting to QM datasets## DESRES\_219-219, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.435 0.447 2.4732 453 56

DESRES\_219-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.271	0.330	2.7983	529	27		





#221 Propanamide CID: 6578 7.738.820.00, avg5.527.747.745.64, avg7.04 ref molpol н molpol 0.01 1.08 5.64, avg 1.52 rms molpol н Monomer potential fitting RMS: 0.31 ##Dimer results - Fitting to QM datasets## DESRES 221-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.398 0.597 5.8420 540 71 DESRES\_221-221, energy values in kcal/mol

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.475
 0.632
 4.7435
 521
 58



18.28 15.90 0.00, avg 11.39 ref molpol molpol 18.22 15.85 8.67, avg 14.25 0.04 rms molpol 0.06 8.67, avg 2.86 CI Monomer potential fitting RMS: 0.28 ##Dimer results - Fitting to QM datasets## DESRES 223-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.181 0.413 2.9929 114 5 8 0 0 6  $^{-1}$ Energy (kcal/mol) -2 -2 4 -4 -3

2 -6 -4 0 -8 -5 1111 -2 -10-6 5 6 8 10 6 10 9 10 6 0 0 5 -1 Energy (kcal/mol) 4  $^{-1}$ -2 3 -2 -3 2 -4 -3 1 -5 -4 0 -6 -1 -7 -5 5 6 9 7 8 7 8 5 6 7 Ŕ 6 7 2 0.5 6 0.0 1 Energy (kcal/mol) 5 -0.5 0 -1.0 4 -1 3 -1.5 -2 2 -2.0 -3 1 -2.5 -4 0 -3.0 -1 -5 -3.5 10 10 10 0 8 0 -1 Energy (kcal/mol) 6 -2 -2 4 -4 -3 -4 2 -6 -5 0 -8 -6 -2 -10-7 4 5 8 2 0 0 6 Energy (kcal/mol) -2 -2 4 -4 -4 2 -6 -6 0 -8 -8 -2 -10 -10 -12 -12 -4 à 7 4 6 CM-CM (Å) CM-CM (Å) CM-CM (Å) ----- HIPPO Total ----- HIPPO Electrostatics ----- HIPPO Dispersion
 ---- CCSD(T)/CBS Total ----- SAPTO Electrostatics ----- SAPTO Dispersion ------HIPPO Induction ---- SAPT0 Induction



DESRES\_223-water

#223 1,2-Dichlorobenzene C6H4Cl2 CID: 7239

#224 Pentan-3-one C5H100 CID: 7288

ref molpol 11.15 9.61 0.00, avg 6.92 molpol 11.09 9.56 6.69, avg 9.11 rms molpol 0.06 0.05 6.69, avg 2.19 Monomer potential fitting RMS: 0.87 ##Dimer results - Fitting to QM datasets## DESRES\_224-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.241	0.346	2.9407	531	21		



#225 Methylcyclopentane C6H12 CID: 7296

ref molpol 11.62 10.47 9.23, avg 10.44
molpol 11.51 10.40 9.17, avg 10.36
rms molpol 0.11 0.08 0.07, avg 0.08
Monomer potential fitting RMS: 0.23
##Dimer results - Fitting to QM datasets##
DESRES\_225-water, energy values in kcal/mol

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.134
 0.155
 0.9964
 535
 0





## #228 Butane C4H10 CID: 7843

ref	molpol	7.33	8.86	0.00,	avg	5.40		/	$\sim$
	molpol	7.33	6.27	5.85,	avg	6.48		$\langle \rangle$	
rms	molpol	0.01	2.59	5.85,	avg	1.08		$\sim$	
Mono	mer poten	tial fit	ting RMS	: 0.63					
##Di	mer resul	ts - Fit	ting to (	QM data	asets##				
		<u>_</u>			- / -				
DESR	ES_228-22	8, energ	y values	in KCa	al/mol				
	МЛГ	std or	ror may	orror	#noint	ta #0011	t [orr	< 11	
	MAE 0 400			2700	#poin	LS #COUL	22	/ 1]	
	0.400	0.35	Ζ Ζ.	5/00	4/3		23		
חדפס	EC 228-112	tor one		oc in 1	kaal/ma	1			
JUDOR		cer, ene	ryy varu	es III I	KCar/IIIO.	L			

MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>	
0.166	0.298	2.8088	556	16	





#233 1,3,5-Trichlorobenzene C6H3Cl3 CID: 7950

ref molpol 20.22 20.22 0.00, avg 13.48 molpol 20.19 20.19 10.65, avg 17.01 rms molpol 0.03 0.03 10.65, avg 3.53

Monomer potential fitting RMS: 0.16

##Dimer results - Fitting to QM datasets##

DESRES\_233-water, energy values in kcal/mol





#236 Butanenitrile C4H7N CID: 8008

ref	molpol	6.94	10.12	0.00,	avg	5.69
	molpol	6.93	6.07	5.82,	avg	6.27
rms	molpol	0.01	4.05	5.82,	avq	0.58



Monomer potential fitting RMS: 0.50

##Dimer results - Fitting to QM datasets##

DESRES 236-water, energy values in kcal/mol



#240 2-Methoxyethanamine C3H9NO CID: 8018

ref molpol 9.57 7.56 7.08, avg 8.07 molpol 9.59 7.52 7.10, avg 8.07 rms molpol 0.01 0.03 0.03, avg 0.00



Monomer potential fitting RMS: 0.46

##Dimer results - Fitting to QM datasets##

DESRES 240-water, energy values in kcal/mol



#242 Ethyl Formate C3H6O2 CID: 8025

ref molpol 9.04 6.44 0.00, avg 5.16 molpol 9.02 6.38 5.40, avg 6.93 rms molpol 0.02 0.06 5.40, avg 1.77



Monomer potential fitting RMS: 0.27

##Dimer results - Fitting to QM datasets##

DESRES\_242-water, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.197 0.276 2.7101 533 13

DESRES\_242-242, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.259	0.384	3.0052	516	21		





#244 N,N'-Dimethylethane-1,2-diamine C4H12N2 CID: 8070

ref molpol 12.81 9.90 9.01, avg 10.57 molpol 13.07 9.17 8.95, avg 10.40 rms molpol 0.26 0.74 0.06, avg 0.18

Monomer potential fitting RMS: 0.71

##Dimer results - Fitting to QM datasets##

DESRES\_244-water, energy values in kcal/mol





#245 1,2-Dimethoxyethane C4H1002 CID: 8071

ref molpol 8.37 11.42 0.00, avg 6.60 molpol 8.40 6.20 6.04, avg 6.88 rms molpol 0.03 5.22 6.04, avg 0.28



Monomer potential fitting RMS: 0.37

##Dimer results - Fitting to QM datasets##

DESRES 245-water, energy values in kcal/mol



#248 Cyclohexane C6H12 CID: 8078

ref molpol 9.38 10.80 10.80, avg 10.32 molpol 9.27 10.84 10.84, avg 10.32 rms molpol 0.10 0.04 0.04, avg 0.01



##Dimer results - Fitting to QM datasets##

DESRES\_248-water, energy values in kcal/mol

 MAE
 Std error max error #points #count[err > 1]

 0.120
 0.210
 1.6906
 560
 11



#251 Propene C3H6 CID: 8252

ref	molpol	7.18	5.44	0.00,	avg	4.21	~	
	molpol	6.95	5.65	4.56,	avg	5.72		
rms	molpol	0.22	0.20	4.56,	avg	1.51		$\searrow$
Mono	omer potent	ial fitt	ing RMS	: 0.28				Ň
##D:	imer result	ts - Fitt	ing to	QM data	asets##			
DESI	RES_251-wat	er, ener	gy valu	es in 1	kcal/mol	L		
	MAE 0.124	Std err 0.169	or max	error 5976	#point 559	s #count	[err > 3	1]
DESI	RES_251-251	, energy	values	in kca	al/mol			
	MAE 0.170	Std err 0.217	or max	error 3078	#point 814	ts #count 1	[err > 1	1]

/

379





#255 Tetrahydropyran C5H100 CID: 8894

ref molpol 8.47 9.33 10.03, avg 9.27 8.43 9.34 molpol 10.06, avg 9.28 0.04 0.01 rms molpol 0.04, avg 0.00 Monomer potential fitting RMS: 0.41 ##Dimer results - Fitting to QM datasets## 0 DESRES 255-255, energy values in kcal/mol MAE

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.120
 0.138
 0.5610
 176
 0

DESRES\_255-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.204	0.363	2.5899	555	29		




#256 3-Aminopropan-1-ol C3H9NO CID: 9086

ref molpol 9.36 7.61 7.02, avg 8.00 molpol 9.37 7.58 7.06, avg 8.00 rms molpol 0.01 0.04 0.04, avg 0.00



Monomer potential fitting RMS: 0.58

##Dimer results - Fitting to QM datasets##

DESRES 256-water, energy values in kcal/mol



#257 Pyrazine C4H4N2 CID: 9261 Ν ref molpol 10.88 9.56 0.00, avg 6.81 molpol 10.82 9.58 5.91, avg 8.77 rms molpol 0.06 0.02 5.91, avg 1.96 Monomer potential fitting RMS: 0.14 ##Dimer results - Fitting to QM datasets## DESRES\_257-water, energy values in kcal/mol MAE

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.226
 0.404
 3.5802
 567
 29

DESRES\_257-257, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.315	0.326	1.7692	548	27		





#259 Fluoroethane C2H5F CID: 9620

4.19 4.50 0.00, avg 2.90 F ref molpol 4.20 3.70 3.52, avg molpol 3.81 3.52, avg rms molpol 0.01 0.80 0.91 Monomer potential fitting RMS: 0.09 ##Dimer results - Fitting to QM datasets## DESRES 259-water, energy values in kcal/mol Std error max error #points #count[err > 1] MAE 0.088 0.7435 0.076 287 0 DESRES 259-259, energy values in kcal/mol







#261 Pentafluorobenzene C6HF5 CID: 9696

12.29 12.61 0.00, avg 8.30 ref molpol molpol 12.38 12.38 6.92, avg 10.56 0.09 0.23 rms molpol 6.92, avg 2.26

Monomer potential fitting RMS: 0.30

##Dimer results - Fitting to QM datasets## DESRES 261-water, energy values in kcal/mol



MAE Std error max error #points #count[err > 1] 0.106 0.109 0.4455 110 0 DESRES\_261-water 6 0 0 5 -1 Energy (kcal/mol) 4 -1 3 -2 2 -3 -2 1 -4 0 -3 -5 -1 -2 -6 -4 6 0 0 5 -1 Energy (kcal/mol) 4 -1 -2 3 -3 -2 2 -4 1 -3 -5 0 -4 -6 -1 -2 -7 -5 8 1 0.0 0 6 Energy (kcal/mol) -0.5 -1 4 -2 -1.0 -3 2 -1.5 -4 0 -2.0 -5 -2 -6 -2.5 6 8 0 0 6 Energy (kcal/mol) -2 -2 -4 -4 4 -6 -6 2 -8 -8 0 -10-10 -2 -12 -12 3 5 8 2 0 0 6 -1 Energy (kcal/mol) -2 -2 4 -4 -3 2 -6 -4 0

> HIPPO Electrostatics ---- HIPPO Dispersion ---- HIPPO Total HIPPO Induction -------- CCSD(T)/CBS Total --- SAPTO Electrostatics ---- SAPT0 Dispersion \_ SAPT0 Induction

6

5

-8

10

9

8

-2

4

5

6

CM-CM (Å)

-10 4

CM-CM (Å)

8

ģ

-5

-6

10

4

9

CM-CM (Å)

10



#262 1,3,5-Trifluorobenzene C6H3F3 CID: 9745

12.13

12.12

0.02

0.00, avg

6.75, avg

8.09

10.33

2.24

12.13

12.12

0.02

ref molpol

molpol

<sup>→</sup> CCSD(T)/CBS Total → SAPTO Electrostatics → SAPTO Dispersion -SAPT0 Induction

#263 Hexafluorobenzene C6F6 CID: 9805

ref	molpol	12.64	12.64	0.00,	avg	8.43
	molpol	12.60	12.60	6.96,	avg	10.72
rms	molpol	0.03	0.03	6.96.	avq	2.30

Monomer potential fitting RMS: 0.32

##Dimer results - Fitting to QM datasets##
DESRES 263-water, energy values in kcal/mol





#264 1,1,1-Trifluoroethane C2H3F3 CID: 9868 F 4.28 4.48 0.00, avg 2.92 ref molpol molpol 4.27 4.04 4.04, avg 4.12 0.01 0.44 4.04, avg 1.20 rms molpol Monomer potential fitting RMS: 0.15 ##Dimer results - Fitting to QM datasets## DESRES 264-water, energy values in kcal/mol . . щ, ~ · · 1 1]

MAE	Std error	max error	#poınts	#count[err >
0.121	0.244	2.2156	259	4

DESRES\_264-264, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.241 0.130 0.4094 25 0





#265 1,1,2-Trifluoroethane C2H3F3 CID: 9890

4.12 4.59 4.39, avg 4.37 ref molpol 4.34 molpol 4.14 4.60, avg 4.36 0.02 0.25 0.22, avg rms molpol 0.01 Monomer potential fitting RMS: 0.39 ##Dimer results - Fitting to QM datasets##



DESRES 265-water, energy values in kcal/mol



#266 1-Fluoropropane C3H7F CID: 9998 5.78 6.61 0.00, avg F. ref molpol 4.13 molpol 5.80 5.02 4.76, avg 5.19 0.02 1.59 4.76, avg rms molpol 1.06 Monomer potential fitting RMS: 0.16 ##Dimer results - Fitting to QM datasets## DESRES 266-266, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.188 0.096 0.3064 25 0

DESRES 266-water, energy values in kcal/mol





#279 2-Methylbut-2-ene C5H10 CID: 10553 ref molpol 11.13 9.36 0.00, avg 6.83 molpol 11.10 9.35 6.79, avg 9.08 rms molpol 0.03 0.01 6.79, avg 2.25 Monomer potential fitting RMS: 0.35 ##Dimer results - Fitting to QM datasets## DESRES\_279-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.158 0.240 1.7633 555 13

DESRES\_279-279, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.248	0.298	1.5275	481	18		





#281 1-Chloropropane C3H7Cl CID: 10899 CL ref molpol 7.17 9.80 0.00, avg 5.66 molpol 7.19 5.88 5.54, avg 6.20 0.02 3.92 5.54, avg rms molpol 0.54 Monomer potential fitting RMS: 0.19 ##Dimer results - Fitting to QM datasets## DESRES 281-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1]

MAE Std error max error #points #count[err > 1 0.169 0.344 2.9245 261 9

DESRES 281-281, energy values in kcal/mol





#284 1,3-Dichlorobenzene C6H4Cl2 CID: 10943

ref	molpol	15.47	19.20	0.00,	avg	11.56
	molpol	15.49	15.49	8.07,	avg	13.02
rms	molpol	0.02	3.71	8.07,	avg	1.46

Monomer potential fitting RMS: 0.34

##Dimer results - Fitting to QM datasets##

DESRES\_284-water, energy values in kcal/mol





SAPT0 Induction

#287 1-Methoxypropane C4H100 CID: 11182

ref molpol10.097.890.00, avg5.99molpol10.107.216.78, avg8.03rms molpol0.010.686.78, avg2.04



Monomer potential fitting RMS: 0.37

##Dimer results - Fitting to QM datasets##

DESRES\_287-water, energy values in kcal/mol

 MAE
 Std error
 max error
 #points
 #count[err > 1]

 0.267
 0.554
 3.9176
 553
 41

DESRES\_287-287, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1
0.316	0.338	1.8016	482	27		





#290 2,3-Dimethylbut-2-ene C6H12 CID: 11250 ref molpol 12.79 11.70 0.00, avg 8.16 molpol 12.63 11.83 7.84, avg 10.76 rms molpol 0.16 0.12 7.84, avg 2.60 Monomer potential fitting RMS: 0.34 ##Dimer results - Fitting to QM datasets## DESRES\_290-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.184 0.269 1.7783 568 17





#294 Pentachlorobenzene C6HCl5 CID: 11855

#298 N,N-Diethylformamide C5H11NO CID: 12051

ref molpol 12.42 11.67 8.92, avg 11.00 molpol 12.50 11.63 9.02, avg 11.05 rms molpol 0.09 0.04 0.09, avg 0.05

Monomer potential fitting RMS: 0.82

##Dimer results - Fitting to QM datasets##

DESRES\_298-water, energy values in kcal/mol



MAEStd error max error #points #count[err > 1]0.2050.2681.699353615



#301 1,2-Difluoroethane C2H4F2 CID: 12223 4.57 4.28 0.00, avg 2.95 F. ref molpol molpol 4.58 4.00 3.72, avg 4.10 0.28 3.72, avg rms molpol 0.02 1.15 E Monomer potential fitting RMS: 0.13 ##Dimer results - Fitting to QM datasets## DESRES 301-301, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.078 0.086 0.2708 24 0

DESRES 301-water, energy values in kcal/mol

-4

-6

÷

4

CM-CM (Å)

-10.0

-12.5

-15.0

-17.5 -20.0

MAE Std error max error #points #count[err > 1] 287 0.151 0.232 1.6602 3 2.5 6 0 ----0.0 -1 -2.5 Energy (kcal/mol) -5.0 -2 -7.5 -3

CM-CM (Å)

-4

-5

-6

-7

HIPPO Induction

DESRES\_301-301

CM-CM (Å)





#304 2-Methylpent-2-ene C6H12 CID: 12243 13.73 ref molpol 10.89 0.00, avg 8.21 9.87 molpol 10.89 7.22, avg 9.33 rms molpol 0.01 3.86 7.22, avg 1.12 Monomer potential fitting RMS: 0.40 ##Dimer results - Fitting to QM datasets## DESRES\_304-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1
0.153	0.188	1.3876	531	3	



#305 2-Methoxyacetic Acid C3H6O3 CID: 12251

ref molpol 7.66 9.08 0.00, avg 5.58 molpol 7.74 6.83 5.42, avg 6.66 rms molpol 0.08 2.25 5.42, avg 1.09



Monomer potential fitting RMS: 0.55

##Dimer results - Fitting to QM datasets##

DESRES 305-water, energy values in kcal/mol



#306 N-Ethylacetamide C4H9NO CID: 12253

H 9.40 ref molpol 11.26 0.00, avg 6.89 molpol 9.43 7.83 6.28, avg 7.85 0.03 3.43 6.28, avg 0.96 rms molpol Monomer potential fitting RMS: 0.35 ##Dimer results - Fitting to QM datasets## DESRES\_306-water, energy values in kcal/mol

 MAE
 Std error max error #points #count[err > 1]

 0.269
 0.404
 2.6871
 536
 34


#307 Pent-1-yne C5H8 CID: 12309

H\_\_\_\_C\_\_\_\_C\_\_\_\_ ref molpol 7.69 11.87 0.00, avg 6.52 molpol 7.74 5.88 5.56, avg 6.39 rms molpol 0.05 5.99 5.56, avg 0.13 Monomer potential fitting RMS: 0.47 ##Dimer results - Fitting to QM datasets## DESRES 307-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1]

MAL	Stu error	max error	#points	#counclerr	1
0.083	0.130	0.6744	113	0	





#308 Pent-2-yne C5H8 CID: 12310

ref molpol 12.45 7.62 0.00, avg 6.69 molpol 12.34 7.57 7.02, avg 8.98 rms molpol 0.11 0.05 7.02, avg 2.29



Monomer potential fitting RMS: 0.30

##Dimer results - Fitting to QM datasets##

DESRES 308-water, energy values in kcal/mol



#310 N-Ethylformamide C3H7NO CID: 12319 7.19 0.00, avg 5.75 ref molpol 10.05 7.64 molpol 10.06 7.00 5.87, avg rms molpol 0.01 0.19 5.87, avg 1.90 0 < Monomer potential fitting RMS: 0.23 ##Dimer results - Fitting to QM datasets## DESRES 310-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.223 0.414 2.5941 528 28 DESRES\_310-310, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.278	0.391	3.0650	474	28		





#313 1,1,1,2-Tetrachloroethane C2H2Cl4 CID: 12418

ref molpol 13.27 10.80 0.00, avg 8.02 molpol 13.25 10.49 10.14, avg 11.29 rms molpol 0.02 0.32 10.14, avg 3.27

Monomer potential fitting RMS: 0.37

##Dimer results - Fitting to QM datasets##

DESRES\_313-water, energy values in kcal/mol



CI CI CI #315 N,n-diethylacetamide C6H13NO CID: 12703
ref molpol -10.51 -13.07 -14.64, avg -12.74
molpol 10.48 13.12 14.62, avg 12.74
rms molpol 0.03 0.05 0.02, avg 0.00
Monomer potential fitting RMS: 0.72
##Dimer results - Fitting to QM datasets##
DESRES\_315-water, energy values in kcal/mol
MAE Std error max error #points #count[err > 1]
0.271 0.426 2.4432 534 42



#317 2-Sulfanylacetamide C2H5NOS CID: 12961

ref molpol 10.83 8.58 0.00, avg 6.47 molpol 10.89 8.80 6.89, avg 8.86 rms molpol 0.06 0.22 6.89, avg 2.39

Monomer potential fitting RMS: 0.97

##Dimer results - Fitting to QM datasets##

DESRES 317-water, energy values in kcal/mol





#319 1,1,1,2-Tetrafluoroethane C2H2F4 CID: 13129

ref molpol 4.62 4.44 0.00, avg 3.02 molpol 4.62 4.11 3.90, avg 4.21 rms molpol 0.00 0.34 3.90, avg 1.19

Monomer potential fitting RMS: 0.20

##Dimer results - Fitting to QM datasets##

DESRES\_319-water, energy values in kcal/mol



F F F

Н 8.36 ref molpol 10.81 8.20, avg 9.12 8.39 molpol 10.79 8.19, avg 9.12 0.02 0.03 0.00 rms molpol 0.01, avg Monomer potential fitting RMS: 0.52 ##Dimer results - Fitting to QM datasets## ò DESRES 321-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1]0.350 0.378 1.7454 145 13 DESRES\_321-water 4 0 0 -----Energy (kcal/mol) -2 2 -5 -4 0 -10 -6 -2 -15 -8 -4 -20 -10 -6 -25 -12 à 5 ġ ÷ à 6 ÷ à 5 6 5.0 0 0 2.5 Energy (kcal/mol) -5 0.0 -10 -10 -2.5 -15 -5.0 -20 -20 -7.5 -30 -25 -10.0-12.5 -40 -30 8 0 0 6 Energy (kcal/mol) -2 -1 4 -4 -2 -6 2 -3 -8 0 -4 -10 -2 -12 -5 5 6 9 5 6 7 8 8 6 8 ģ 6 0 0 Energy (kcal/mol) 4 -5 -2 2 -10-4 0 -15 -6 -2 -20 -8 -25 -10 0 5 0 Energy (kcal/mol) -20 -10 -20 -40 -30 -60 -15 -40 3 6 5 8 5 8 0 Energy (kcal/mol) 0 6 -2 4 -4 -5 2 -6 -10 0 -8 -15 -2 -10-4 -20 -12 4 5 6 CM-CM (Å) CM-CM (Å) CM-CM (Å) ----- HIPPO Dispersion ----- SAPTO Dispersion --+- HIPPO Total HIPPO Induction - CCSD(T)/CBS Total ---- SAPTO Electrostatics SAPT0 Induction

#321 Dimethyl Hydrogen Phosphate C2H7O4P CID: 13134

#322 5-Methyl-1h-imidazole C4H6N2 CID: 13195

ref rms	molpol molpol molpol	11.18 11.03 0.14	9.53 9.32 0.21	6.38, 5.88, 0.50,	avg avg avg	9.03 8.75 0.29		N
Monc	omer poter	ntial fitt	ing RMS:	: 0.69	-	/	N	
##Di DESF	mer resul RES 322-32	lts - Fitt 22, energy	ing to Ç v values	QM data in kca	asets##		H	
	MAE 0.542	Std ern 0.610	or max	error L648	#point 489	s #coun	t[err > 1 97	]
DESF	RES_322-wa	ater, ener	gy value	es in }	cal/mol			

MAE	Std error	max error	#points	<pre>#count[err &gt; 1]</pre>
0.373	0.641	3.4983	558	63





#328 1-(Methyldisulfanyl)propane C4H10S2 CID: 16592

ref molpol 17.95 11.82 12.61, avg 14.12 molpol 17.92 12.73 11.83, avg 14.16 rms molpol 0.03 0.91 0.78, avg 0.04

Monomer potential fitting RMS: 3.20

##Dimer results - Fitting to QM datasets##

DESRES\_328-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.562	0.755	3.5792	503	100		



#330 1-Fluorobutane C4H9F CID: 16908

ref molpol 7.41 8.85 0.00, avg 5. molpol 7.42 6.10 5.78, avg 6. rms molpol 0.02 2.76 5.78, avg 1.



Monomer potential fitting RMS: 0.56

##Dimer results - Fitting to QM datasets##

DESRES 330-water, energy values in kcal/mol



#333 N-Propylformamide C4H9NO CID: 22686

7.07 ref molpol 12.54 8.68 0.00, avg molpol 12.57 8.41 7.24, avg 9.41 0.03 0.26 7.24, avg 2.33 rms molpol Monomer potential fitting RMS: 1.09 ##Dimer results - Fitting to QM datasets## DESRES 333-water, energy values in kcal/mol

> MAE Std error max error #points #count[err > 1] 0.120 0.096 0.3582 46 0



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#334 1,2-Bis(methylsulfanyl)ethane C4H10S2 CID: 23110

ref molpol 18.59 12.83 0.00, avg 10.47 molpol 18.61 12.49 10.98, avg 14.03 rms molpol 0.02 0.34 10.98, avg 3.55



Monomer potential fitting RMS: 0.42

##Dimer results - Fitting to QM datasets##

DESRES 334-water, energy values in kcal/mol



#336 Trichlorophosphane Cl3P CID: 24387

ref molpol8.3111.1511.15, avg10.20molpol8.6611.1211.12, avg10.30rms molpol0.350.030.03, avg0.10

Monomer potential fitting RMS: 0.27

##Dimer results - Fitting to QM datasets##

HB300SPXx10 336-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
2.489	1.179	0.794	-0.3850
2.606	-0.466	-0.535	-0.0693
2.724	-1.360	-1.297	0.0626
2.843	-1.784	-1.689	0.0954
2.961	-1.922	-1.843	0.0789
3.081	-1.896	-1.852	0.0441
3.200	-1.781	-1.776	0.0054
3.561	-1.295	-1.364	-0.0693
4.166	-0.684	-0.762	-0.0781
5.385	-0.231	-0.258	-0.0274
			Hara a di sa ka a

MAE	Std error	max error	#points	#count[err ]	> 1]
0.092	0.101	0.3850	10	0	





#341 1,1,1-Trichloropropane C3H5Cl3 CID: 24622

ref molpol 10.97 12.40 0.00, avg 7.79 molpol 11.01 10.44 9.95, avg 10.47 rms molpol 0.04 1.96 9.95, avg 2.68

Monomer potential fitting RMS: 0.45

##Dimer results - Fitting to QM datasets##

DESRES\_341-water, energy values in kcal/mol





#346 4-Ethylphenol C8H100 CID: 31242
ref molpol 19.15 14.84 10.15, avg 14.71
molpol 19.18 14.86 9.38, avg 14.47
rms molpol 0.03 0.01 0.76, avg 0.24
Monomer potential fitting RMS: 0.27
##Dimer results - Fitting to QM datasets##
DESRES\_346-water, energy values in kcal/mol
MAE Std error max error #points #count[err > 1]

15

0.327 3.3462 530

0.220

442



#347 1,4-Dioxane C4H8O2 CID: 31275

ref molpol 9.25 7.53 7.93, avg 8.24 8.16 9.21 7.26, avg molpol 8.00 0.67, avg 0.05 rms molpol 0.48 0.08 Monomer potential fitting RMS: 0.25 ##Dimer results - Fitting to QM datasets## DESRES 347-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.311 2.2679 565 0.166 20 DESRES 347-347, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.292	0.353	2.8809	477	21	



0





#350 Methoxymethanol C2H6O2 CID: 62540

ref molpol 5.24 6.69 0.00, avg 3.98 molpol 5.25 3.97 3.75, avg 4.32 rms molpol 0.00 2.73 3.75, avg 0.34



Monomer potential fitting RMS: 1.28

##Dimer results - Fitting to QM datasets##

DESRES 350-water, energy values in kcal/mol



#351 N,N'-Dimethylpropane-1,3-diamine C5H14N2 CID: 66978

ref molpol 15.24 11.54 10.45, avg 12.41 molpol 15.26 10.74 10.55, avg 12.19 rms molpol 0.03 0.80 0.10, avg 0.22



Monomer potential fitting RMS: 0.82

##Dimer results - Fitting to QM datasets##

DESRES 351-water, energy values in kcal/mol







#354 3-Hydroxypropanoic Acid C3H6O3 CID: 68152

ref molpol 7.65 8.79 0.00, avg 5.48 molpol 7.73 7.63 5.37, avg 6.91 rms molpol 0.09 1.16 5.37, avg 1.43

Monomer potential fitting RMS: 0.72

##Dimer results - Fitting to QM datasets##

DESRES\_354-water, energy values in kcal/mol



#357 2-Aminoacetamide C2H6N2O CID: 69020

ref molpol 8.40 7.25 5.66, avg 7.10 8.40 molpol 7.25 5.66, avg 7.10 0.00 0.01 0.00, avg 0.00 rms molpol

Monomer potential fitting RMS: 1.47

##Dimer results - Fitting to QM datasets##

DESRES 357-water, energy values in kcal/mol



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#358 2-Hydroxyacetamide C2H5NO2 CID: 69021

ref molpol 7.61 6.89 0.00, avg 4.83 7.59 molpol 6.85 4.87, avg 6.44 0.02 0.04 4.87, avg rms molpol 1.60 Monomer potential fitting RMS: 0.48 ##Dimer results - Fitting to QM datasets##

DESRES 358-water, energy values in kcal/mol



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#360 N-(2-Hydroxyethyl)formamide C3H7NO2 CID: 69657

ref molpol 11.20 7.74 0.00, avg molpol 11.22 7.53 5.96, avg rms molpol 0.02 0.21 5.96, avg



Monomer potential fitting RMS: 0.29

##Dimer results - Fitting to QM datasets##

DESRES 360-water, energy values in kcal/mol



#363 3-Methoxypropan-1-ol C4H1002 CID: 74116

ref molpol 8.45 11.21 0.00, avg 6.55 molpol 8.46 5.99 5.58, avg 6.68 rms molpol 0.01 5.22 5.58, avg 0.12



Monomer potential fitting RMS: 0.34

##Dimer results - Fitting to QM datasets##

DESRES 363-water, energy values in kcal/mol


#364 3-Amino-3-oxopropanoic Acid C3H5NO3 CID: 75367

ref molpol 10.05 9.16 0.00, avg molpol 10.03 9.13 6.01, avg 0.02 0.03 6.01, avg rms molpol



Monomer potential fitting RMS: 1.05

##Dimer results - Fitting to QM datasets##

DESRES 364-water, energy values in kcal/mol



#365 2-Methylsulfanylacetic Acid C3H6O2S CID: 75551

ref molpol9.7712.120.00, avg7.30molpol9.859.846.25, avg8.65rms molpol0.082.276.25, avg1.35

Monomer potential fitting RMS: 3.01

##Dimer results - Fitting to QM datasets##

DESRES 365-water, energy values in kcal/mol



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457

#366 2-Formamidoacetic Acid C3H5NO3 CID: 75606

ref molpol 11.45 8.44 0.00, avg molpol 11.43 8.41 6.17, avg rms molpol 0.02 0.03 6.17, avg



Monomer potential fitting RMS: 0.47

##Dimer results - Fitting to QM datasets##

DESRES\_366-water, energy values in kcal/mol



#367 3-(Methylamino)propanoic Acid C4H9NO2 CID: 75891

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ref molpol 12.07 9.86 7.91, avg -9.94 molpol 12.06 9.86 7.92, avg 9.95 rms molpol 0.01 0.01 0.01, avg 0.00

Monomer potential fitting RMS: 0.87  $\,$ 

##Dimer results - Fitting to QM datasets##

DESRES\_367-water, energy values in kcal/mol



459

#368 3-Methylsulfanylpropan-1-amine C4H11NS CID: 77743

ref molpol 15.44 11.35 10.13, avg 12.31 molpol 15.46 11.35 10.10, avg 12.30 rms molpol 0.02 0.00 0.02, avg 0.00



Monomer potential fitting RMS: 2.23

##Dimer results - Fitting to QM datasets##

DESRES 368-water, energy values in kcal/mol



#369 2-Methylsulfanylethanol C3H8OS CID: 78925

ref molpol 11.97 9.19 0.00, avg 7.05 molpol 11.96 9.09 7.77, avg 9.61 rms molpol 0.01 0.10 7.77, avg 2.55



Monomer potential fitting RMS: 0.79

##Dimer results - Fitting to QM datasets##

DESRES 369-water, energy values in kcal/mol



#375 2-Methylsulfanylethanamine C3H9NS CID: 87697

ref molpol 12.83 9.85 8.69, avg 10.46 molpol 12.83 9.86 8.68, avg 10.46 rms molpol 0.00 0.01 0.01, avg 0.00



Monomer potential fitting RMS: 0.96

##Dimer results - Fitting to QM datasets##

DESRES 375-water, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	> 1]
0.087	0.125	0.8515	75	0	



#378 Disulfanylethane C2H6S2 CID: 94671 ref molpol 13.49 9.28 8.32, avg 10.36 H. molpol 13.47 9.25 8.37, avg 10.37 rms molpol 0.02 0.03 0.05, avg 0.00 Monomer potential fitting RMS: 3.18 ##Dimer results - Fitting to QM datasets## DESRES\_378-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1] 0.433 0.607 7.3099 559 62

DESRES\_378-378, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
0.448	0.521	2.6163	562	91		





#379 3-Aminopropane-1-thiol C3H9NS CID: 97436

ref molpol 12.80 9.51 8.91, avg 10.41 molpol 12.80 9.53 8.90, avg 10.41 rms molpol 0.01 0.02 0.01, avg 0.00



Monomer potential fitting RMS: 5.67

##Dimer results - Fitting to QM datasets##

DESRES 379-water, energy values in kcal/mol



#381 Methylsulfanylmethanethiol C2H6S2 CID: 122370

ref molpol 13.14 9.31 0.00, avg 7.48 molpol 13.11 9.23 8.14, avg 10.16 rms molpol 0.03 0.08 8.14, avg 2.68



Monomer potential fitting RMS: 0.51

##Dimer results - Fitting to QM datasets##

DESRES 381-water, energy values in kcal/mol







#387 Dithiane C4H8S2 CID: 136335
ref molpol 10.86 13.60 14.13, avg 12.86
molpol 10.75 13.64 14.17, avg 12.85
rms molpol 0.11 0.05 0.04, avg 0.01
Monomer potential fitting RMS: 1.69
##Dimer results - Fitting to QM datasets##
DESRES\_387-water, energy values in kcal/mol
MAE Std error max error #points #count[err > 1]

 MAE
 Std error
 max error
 #points
 #count[err > 1

 0.358
 0.594
 8.5945
 564
 50

DESRES\_387-387, energy values in kcal/mol

MAE	Std error	max error	#points	#count[err	>	1]
1.446	0.777	3.5730	26	20		





#399 2-Methoxyacetamide C3H7NO2 CID: 140060

#400 1,3-Dimethoxypropane C5H12O2 CID: 140180

ref molpol 13.86 9.95 0.00, avg 7.94 molpol 13.87 8.66 8.09, avg 10.20 rms molpol 0.01 1.30 8.09, avg 2.27



Monomer potential fitting RMS: 1.38

##Dimer results - Fitting to QM datasets##

DESRES 400-water, energy values in kcal/mol



#402 2-Acetamido-N-methylpropanamide C6H12N2O2 CID: 141892

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17.81 14.15 11.30, avg 14.42 ref molpol molpol 17.81 14.15 11.30, avg 14.42 0.01 0.01 rms molpol 0.00, avg 0.00 Monomer potential fitting RMS: 3.08 ##Dimer results - Fitting to QM datasets##

DESRES 402-water, energy values in kcal/mol



#406 3-aminopropanamide C3H8N2O CID: 192802

ref molpol 10.44 9.13 7.07, avg 8.88 molpol 10.45 9.12 7.07, avg 8.88 rms molpol 0.01 0.01 0.00, avg 0.00

Monomer potential fitting RMS: 0.36

##Dimer results - Fitting to QM datasets##

DESRES 406-water, energy values in kcal/mol



 #409 N-(2-Formamidoethyl)formamide C4H8N2O2 CID: 226108

ref molpol 16.42 10.06 0.00, avg 8.83 molpol 16.41 9.96 7.82, avg 11.40 rms molpol 0.01 0.10 7.82, avg 2.57



Monomer potential fitting RMS: 0.29

##Dimer results - Fitting to QM datasets##

DESRES 409-water, energy values in kcal/mol



#410 2-Formamidoacetamide C3H6N2O2 CID: 232267

ref molpol 12.61 9.12 0.00, avg 7.24 molpol 12.58 9.10 6.49, avg 9.39 rms molpol 0.02 0.02 6.49, avg 2.15

Monomer potential fitting RMS: 1.00

##Dimer results - Fitting to QM datasets##

DESRES 410-water, energy values in kcal/mol



#411 3-Methylsulfanylpropanamide C4H9NOS CID: 263087

15.83 12.14 0.00, avg 9.32 ref molpol molpol 15.80 12.12 8.36, avg 12.09 0.02 rms molpol 0.03 8.36, avg 2.77 Monomer potential fitting RMS: 1.75

32 09 77 H

##Dimer results - Fitting to QM datasets##

DESRES 411-water, energy values in kcal/mol



#412 2-Methoxy-N-methylethanamine C4H11NO CID: 300977

ref molpol 12.12 9.14 8.49, avg 9.92 molpol 12.16 8.71 8.58, avg 9.82 rms molpol 0.04 0.43 0.09, avg 0.10



Monomer potential fitting RMS: 0.61

##Dimer results - Fitting to QM datasets##

DESRES 412-water, energy values in kcal/mol



#414 N-Ethyl-N-methylformamide C4H9NO CID: 350667 Н 0.00, avg 9.25 6.93 ref molpol 11.54 molpol 11.52 9.21 6.50, avg 9.08 rms molpol 0.02 0.05 6.50, avg 2.14 0 Monomer potential fitting RMS: 0.75 ##Dimer results - Fitting to QM datasets## DESRES\_414-water, energy values in kcal/mol MAE Std error max error #points #count[err > 1]

536

26

0.331 2.9084

0.266

480



#419 Methoxymethoxyethane C4H1002 CID: 524894

ref	molpol	11.48	8.42	0.00,	avg	6.63				
	molpol	11.49	7.33	6.78,	avg	8.53	$\sim$			/
rms	molpol	0.01	1.09	6.78,	avg	1.90		<b>`</b> ₀∕	0	
Mon	omer pote	ntial fit	ting RMS	s: 0.90				-	Ŭ	
##D	imer resu	lts - Fit	ting to	QM data	asets##					
DESI	RES_419-w	ater, ene:	rgy valı	ues in ]	kcal/mol					
	MAE	Std er:	ror max	x error	#point	s #co	unt[err	> 1]		
	0.251	0.333	1 2	.4398	535		23			
DESI	RES_419-4	19, energy	y value:	s in kca	al/mol					

MAE	Std error	max error	#points	#count[err	> 1	1
0.402	0.451	2.3430	147	18		



#420 1-(Methylsulfanylmethylsulfanyl)propane C5H12S2 CID: 525376 ref molpol 21.36 14.36 0.00, avg 11.91 molpol 21.37 11.62, avg 15.47 13.43 `s^ S rms molpol 0.02 0.93 11.62, avg 3.57 Monomer potential fitting RMS: 2.42 ##Dimer results - Fitting to QM datasets## DESRES 420-water, energy values in kcal/mol

MAE Std error max error #points #count[err > 1] 0.192 0.260 2.1482 531 11



#421 Methylsulfanylmethylsulfanylethane C4H10S2 CID: 525377

ref	molpol	18.75	12.69	0.00,	avg	10.48	$\sim$ $\sim$	/
	molpol	18.78	12.12	10.42,	avg	13.77		
rms	molpol	0.03	0.57	10.42,	avg	3.29	5	·S·
Mono ##D: DESI	omer poter imer resu RES_421-wa	ntial fi lts - Fi ater, en	tting RM tting to ergy val	IS: 1.66 ) QM data .ues in }	asets cal/r	≠# nol		

MAE	Std error	max error	#points	#count[err	> 1]
0.168	0.232	2.0398	539	5	



#427 Thioacetone C3H6S CID: 641811

ref	molpol	11.30	8.66	6.75,	avg	8.91
	molpol	10.37	8.86	7.09,	avg	8.77
rms	molpol	0.93	0.20	0.34,	avg	0.14

Monomer potential fitting RMS: 0.54

##Dimer results - Fitting to QM datasets##

R739x5\_427-water, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff			
3.337	1.985	3.049	1.0644			
3.450	1.107	1.738	0.6314			
3.563	0.632	1.004	0.3718			
3.676	0.396	0.610	0.2139			
3.902	0.263	0.319	0.0562			
MAE	Std error	max error	#points	#count[err	>	1]
0.468	0.354	1.0644	5	1		

s

R739x5 427-427, energy values in kcal/mol

CM-CM (A)	Reference	HIPPO res	Abs diff
2.766	2.230	2.219	-0.0110
2.841	0.945	0.529	-0.4160
2.916	0.244	-0.328	-0.5715
2.990	-0.102	-0.707	-0.6045
3.140	-0.267	-0.802	-0.5348

MAE	Std error	max error	#points	#count[err >	> 1]
0.428	0.218	0.6045	5	0	



