## REVISION 1

Title: A preliminary valence-multipole potential energy model: Al-Si-H-O system Matthew C. F. Wander and Barry R. Bickmore

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#### Abstract

Here we test the concept that a potential energy model (force field) based on an expansion of the bond-valence model can use molecular geometry to make a reasonable prediction of the thermodynamic energy. The backbone of the model is a non-standard choice of structural descriptors for the energy decomposition, which relates the energy to particular aspects of the structure. Most force fields use a many-body decomposition to describe structures (with two-, three-, and possibly four-body terms, etc.), whereas ours employs a multipole expansion of the bond valence incident to each atom. This valence multipole model separates the energy associated with each atom into terms related to total bonding (valence monopole), bonding asymmetry (valence dipole), and ellipsoidal deformation (valence quadrupole). All of these are inherently multi-body terms that are calculated by combining two-body terms (bond valences). Provided bond valence sums are satisfied to within 0.2 v.u. of the ideal for all atoms, this model can provide accuracies of $\sim 5$ $\mathrm{kJ} / \mathrm{mol}$ per unique atom in the $\mathrm{Al}-\mathrm{Si}-\mathrm{H}-\mathrm{O}$ system, at least for the equilibrium structures tested here, comparable to most quantum mechanical calculations. More development is needed to produce a fully functional force field suitable for molecular dynamics


simulations, but this work shows that the development of such a force field is likely to be feasible.

## Introduction

Molecular modeling has become increasingly popular in geochemistry and mineralogy, as knowledge of molecular-scale mechanisms and structures has become progressively more important. Quantum mechanical (QM) models are the gold standard for molecular modeling, but can be prohibitively computationally expensive, especially for the larger systems of atoms sometimes needed to adequately represent natural materials and processes. Molecular mechanics (MM) potential energy models, or "force fields," are common, less computationally intensive alternatives, but are subject to a number of difficulties that have often limited their scope and effectiveness.

We suggest that some of these problems can be addressed by restructuring the basic architecture of an MM force field. In this contribution, we report on the construction, optimization, and initial testing of a potential energy model (intended to be a precursor to a fully reactive force field) for the $\mathrm{Al}-\mathrm{Si}-\mathrm{H}-\mathrm{O}$ system, designed around the Valence Multipole Model (VMM) (Bickmore et al., 2013; Shepherd et al., 2016), which is an extension of the Bond-Valence Model (BVM) (Brown, 2002; 2009; 2014). To our knowledge, this is the first example of a potential energy model constructed completely from a bond-valence model of chemistry rather than by using the BVM to augment existing architectures. Early indications are that such models are capable of excellent accuracy, with limited computational expense, at least with respect to estimating thermodynamic energies of equilibrium structures. Considering how often bond valence has been used in quantitative structure-activity relationships (Hiemstra et al., 1989; Sverjensky, 1994; Hiemstra and Van

Riemsdijk, 1996; Hiemstra et al., 1996; Sverjensky and Sahai, 1996; Sahai and Sverjensky, 1997b; a; Sverjensky et al., 1997; Lufaso and Woodward, 2001; Sahai, 2002; Bickmore et al., 2004; Etxebarria et al., 2005; Sverjensky, 2005; Bickmore et al., 2006a; Bickmore et al., 2006b; Perez-Mato et al., 2009; Bickmore, 2014), this is a significant development in itself.

## Theory

To introduce this new approach, we discuss the standard architecture of MM force fields, give a basic explanation of the VMM, and show how a potential energy model based on the VMM would differ from the standard architecture, while allowing for broader applicability and greater accuracy, at a reasonable computational cost.

## Standard MM Force Fields

MM force fields mimic interactions between atoms and molecules by treating them essentially as "balls on springs" (Hinchliffe, 2003). That is, the geometry of a system of atoms is defined in terms of a set of structural descriptors (e.g., interatomic distances and bond angles), ideal values are specified for the descriptors (e.g., preferred bond lengths and angles), and energy cost functions are applied to deviations from the ideal values. The simplest and most often used of these energy cost functions is Hooke's Law for springs (Eqn. 1), in which the spring length is the structural descriptor of interest. Here, $u$ is the potential energy, $k$ is a constant, $x_{0}$ is the ideal value of the structural descriptor of interest, and $x$ is the actual value.

$$
u=\frac{1}{2} k\left(x-x_{0}\right)^{2}
$$

Each of these energy terms includes one or more parameters that can be adjusted to fit the overall model to some set of data, including crystal or molecular structures, thermodynamic data, or even structures and associated energies gleaned from QM calculations (Rappé and Casewit, 1997; Hinchliffe, 2003; Cramer, 2004; Comba et al., 2009). Other common energy cost functions have quartic or sinusoidal forms (Cramer, 2004).

One of the core assumptions of a standard MM force field is "pair-wise additivity" (Rowley, 1994), that every pair-wise energy contribution is completely independent of every other pair wise energy contribution. The geometry of the system is described primarily via pair-wise potential energy terms, $u_{i j}$, based on the distance between a pair of atoms (e.g., Coulomb, Van der Waals, and Morse potentials). The total potential energy of the system $(U)$ is approximated simply by summing the pair-wise terms, as in Eqn. 2.

$$
U=\sum_{i<j} u_{i j}
$$

bodies) as corrections to the lower-order terms, decreasing in importance with the number of bodies involved. This is called many-body decomposition; it means simply that the energy terms are organized by increasing number of bodies (atoms) involved. This can be expressed as an expansion about the pair-wise energies, as in Eqn. 3, where $N$ is the total number of atoms or molecules in the system (Rowley, 1994).

$$
\begin{equation*}
U=\sum_{i<j} u_{i j}+\sum_{i<j<k} \Delta u_{i j k}+\cdots+\sum \Delta u_{1,2,3 \ldots N} \tag{3}
\end{equation*}
$$

Mathematically, this is an excellent choice, because it is a limiting series in which the two-body terms will be most important, and subsequent terms decrease in importance as the number of bodies increases. Chemically, however, these terms are coupled with one another, and this coupling increases for the higher-order terms. As the number of interactions considered increases, so does the number and degree of highly coupled, adjustable model parameters. While this can produce high accuracy results for a particular set of chemical conditions, this can lead to force fields that can be over-fitted to that limited domain, and are woefully inaccurate outside that domain. Furthermore, the computational expense of tracking spatial relationships between increasing numbers of bodies can quickly become prohibitive.

Even with multi-body corrections, force fields based on pair potentials with universal ideal bond lengths and angles for interactions of a given type may not be able to model chemical reactions during which coordination-number changes take place. This drove the need to create reactive force fields, potential energy surfaces for molecules that
were capable of bond dissociation and formation. The methods for creating reactive force fields that can address bond and coordination number changes usually involve extra potential energy terms built on a foundation of more traditional terms (Liang et al., 2013). Thus, the parameterization problem is exacerbated, and the range of utility of these types of models can be further limited.

## Bond-Order Potentials and the Bond-Valence Model

One method used to augment traditional MM force fields is to use bond order as a structural descriptor. Bond order generally refers to the number of electron pairs involved in a given bond; e.g., single bonds involve one electron pair, double bonds involve two, and non-integral bond orders are possible, as well. Particular atoms tend to be most stable when the bond orders of incident bonds sum to some ideal value, which is determined by standard electron counting rules, e.g., the octet rule. There are various methods for calculating bond order, based on bond lengths, bond angles, calculated electron densities, and so on, but the advantage of using bond order as a structural descriptor is that the energy cost comes from deviation of the summed bond orders about each atom from an ideal value; i.e., it is based on the total bonding environment of an atom. Some examples of MM force fields that include bond-order terms, called bond-order potentials (BOPs), are the Tersoff (Tersoff, 1988), Brenner (Brenner, 1990), Finnis-Sinclair (Finnis and Sinclair, 1984), and ReaxFF (van Duin et al., 2003) potentials.

One class of BOPs (Grinberg et al., 2002; Cooper et al., 2003; Grinberg et al., 2004;
Shin et al., 2005; Shin et al., 2007; Shin et al., 2008; Grinberg et al., 2009; Liu et al., 2013a;

Liu et al., 2013b; Takenaka et al., 2013) uses the BVM (Brown, 2002; 2009; 2014) to estimate bond orders. The BVM is essentially a method for relating bond order to bond length. (Note: From this point forward, the terms "bond order" and "bond valence" are used interchangeably.) The principal axiom of the BVM is the valence sum rule (Eqn. 4), which predicts that in a stable structure the sum ( $S_{i}$ ) of the valences (orders) of the bonds $\left(s_{i j}\right)$ incident to atom $i$ from neighboring atoms $j$ must cancel the atomic valence of atom $i$ $\left(V_{i}\right)$. In the traditional forms of the BVM, the bond valences are negative in the direction of cations and positive in the direction of anions.

$$
\sum_{j} s_{i j}+V_{i}=S_{i}+V_{i}=0
$$

The value of $V_{i}$ is usually taken as equivalent to the oxidation number, but important variants exist (O'Keeffe and Brese, 1992; Brown, 2002; 2014; Wander et al., 2015a). The individual bond valences are calculated using an equation relating bond length to bond valence, which is calibrated on known equilibrium structures by applying some bond valence-length relationship and enforcing the valence sum rule. The most commonly used bond valence-length relationship is shown in Eqn. 5, where $R_{i j}$ is the bond length, $R_{0}$ is the length of a single (1 valence unit or v.u.) bond, and $B$ is a constant that dictates the curvature.

$$
\begin{equation*}
s_{i j}=e^{\left(R_{0}-R_{i j}\right) / B} \tag{5}
\end{equation*}
$$

The individual bond valences are computationally comparable to simple pair-wise terms. But if a BOP applies an energy cost function like Eqn. 1 to the deviation of $S_{i}$ from $V_{i}$,
rather than deviation of individual bond valences from ideal values, then we have a true multi-body term that is calculated simply by summing pair-wise terms. This is why BOPs are attractive, i.e., they employ multi-body terms that are relatively computationally inexpensive, and require only two-body parameterization.

## Expanding the Bond-Valence Model

As mentioned above, however, the multi-body terms in BOPs have more or less been treated as corrections to a model framework based on standard many-body terms that assume pair-wise additivity, the independence of the individual bond potentials. Our goal is to discover what it would take to create a potential energy model based, as completely as possible, on the concept of bond valence. This requires some expansion of the BVM, which we have addressed under four headings: 1) introducing directionality via the Valence Multipole Model (VMM), 2) introducing fully covalent interactions, 3) redefining the shape of bond valence-length curves, and 4) optimization of the curves to produce appropriate potential energy surfaces.

The Valence Multipole Model. Bond valence alone addresses only bond lengths, rather than the complete spatial distribution of bonds, and so is incapable of describing all aspects of a structure. The VMM addresses this problem by describing full structures via a multipole expansion of the valence bonds incident to each atom, made possible by treating bond valence as a vector quantity (Harvey et al., 2006; Bickmore et al., 2013). In this way, we can consider both scalar magnitudes of bonding, as well as directionality.

Multipole expansions are commonly used to describe spatial distributions of things like electric charge or mass, using a succession of terms that describe progressively finer
details. Typical multipole terms include the monopole (a scalar describing the total quantity of interest within a defined region), the dipole moment (a vector describing the lopsidedness of the distribution around some point), the quadrupole moment (a rank-2 tensor describing the spherical symmetry of the distribution), and so on (octupole moment, etc.) In the VMM, the bond monopole ( $S_{i}$ ) is the total bonding reaching an atom, the dipole moment is the vector sum of the bonds reaching that atom, and the quadrupole moment is a tensor describing the ellipsoidal distribution of bond valence. The bond dipole can describe non-centrosymmetric distortions of the coordination sphere, while the bond quadrupole moment can describe centrosymmetric distortions. (To be clear, we should emphasize the fact that bond valence does not equate to charge transfer, although this is a common misconception. If that were the case, then a multipole expansion of bond valence would essentially be the same as a multipole expansion of the charge distribution, which is more familiar to scientists. Rather, we are using the same mathematical formalism to describe the spatial distribution of "bonding" incident to an atom, which is physically a more nebulous concept. As explained below, we will likely add a Coulomb term to our model in the future.)

We find it convenient to normalize (Eqn. 6) the individual bond-valence vectors $\vec{s}_{i j}$ to $S_{i}$, resulting in fractional bond-valence vectors $\left(\vec{p}_{i j}\right)$ that are used to calculate the valence dipole $\left(\vec{P}_{i}\right)$ and valence quadrupole $\left(\Theta_{i}\right)$ terms for each atom, as in Eqns. 7-9. Here $N$ is the number of bonds from neighboring atoms $j$ incident to the central atom $i$, and $p_{i j_{\alpha}}$ or $p_{i j_{\beta}}$ represents the magnitude of $\vec{p}_{i j}$ projected onto one of the Cartesian directions, where $\alpha, \beta=x, y$, z. (E.g., $\vec{p}_{i j_{x}}=\vec{x} \bullet \vec{p}_{i j}$, where $\vec{x}$ is the unit vector in the $x$ direction.) $\delta_{\alpha \beta}$ is the Kronecker delta, which is one in the case that direction $\alpha$ equals direction $\beta$, but otherwise
zero. The $\vec{P}_{i}$ and $\Theta_{i}$ values calculated using fractional bond-valence vectors $\left(\vec{p}_{i j}\right)$ thus depend only upon the shape of the bond-valence distribution, and not on the atomic valence of the central atom, or the over- or under-bondedness of the atom (Shepherd et al., 2016).

$$
\vec{p}_{i j}=\left[\begin{array}{l}
p_{i j_{x}} \\
p_{i j_{y}} \\
p_{i j_{z}}
\end{array}\right]=\vec{s}_{i j} / S_{i}
$$

$$
\begin{equation*}
\vec{P}_{i}=\sum_{j} \vec{p}_{i j} \tag{6}
\end{equation*}
$$

$$
\begin{equation*}
\boldsymbol{\Theta}_{i}=\frac{1}{2}\left[\sum_{j=1}^{N} \sum_{\alpha=x, y, z} \sum_{\beta=x, y, z}\left(3 p_{i j_{\alpha}} p_{i j_{\beta}}-\delta_{\alpha \beta}\left\|\vec{p}_{i j}\right\|^{2}\right)\right] \tag{7}
\end{equation*}
$$

$$
\boldsymbol{\Theta}_{i}=\frac{1}{2}\left(\begin{array}{ccc}
\sum_{j=1}^{\mathrm{N}}\left(3\left(p_{i j_{x}}\right)^{2}-\left\|\vec{p}_{i j}\right\|^{2}\right) & 3 \sum_{j=1}^{\mathrm{N}} p_{i j_{x}} p_{i j_{y}} & 3 \sum_{j=1}^{\mathrm{N}} p_{i j_{x}} p_{i j_{z}}  \tag{8}\\
3 \sum_{\mathrm{j}=1}^{\mathrm{N}} p_{i j_{y}} p_{i j_{x}} & \sum_{j=1}^{\mathrm{N}}\left(3\left(p_{i j_{y}}\right)^{2}-\left\|\vec{p}_{i j}\right\|^{2}\right) & 3 \sum_{j=1}^{\mathrm{N}} p_{i j_{y}} p_{i j_{z}} \\
3 \sum_{j=1}^{\mathrm{N}} p_{i j_{z}} p_{i j_{x}} & 3 \sum_{j=1}^{\mathrm{N}} p_{i j_{z}} p_{i j_{y}} & \sum_{j=1}^{\mathrm{N}}\left(3\left(p_{i j_{z}}\right)^{2}-\left\|\vec{p}_{i j}\right\|^{2}\right)
\end{array}\right)
$$

Finally, we discard some of the directional information contained in $\vec{P}_{i}$ and $\boldsymbol{\Theta}_{i}$ to condense them into single scalar values, by calculating their magnitudes (norms). Eqn. 10 shows the equation for the norm of $\vec{P}_{i}$, and Eqn. 11 shows the equation for the Frobenius
norm of $\boldsymbol{\Theta}_{i}$, where $\theta_{m n}$ represents the nine elements of $\boldsymbol{\Theta}_{i}$ in rows $m$ and columns $n$. The Frobenius norm does not depend on the rotation of the axes (Horn and Johnson, 2012; Golub, 2013).

$$
\begin{equation*}
\left\|\overrightarrow{P_{\imath}}\right\|=\sqrt{P_{i_{x}}^{2}+P_{i_{y}}^{2}+P_{i_{z}}^{2}} \tag{10}
\end{equation*}
$$

$$
\left\|\mathbf{\Theta}_{i}\right\|=\sqrt{\sum_{m=1}^{3} \sum_{n=1}^{3}\left|\theta_{m n}\right|^{2}}
$$

As a result, we now have three scalar quantities $\left(S_{i},\left\|\vec{P}_{l}\right\|\right.$, and $\left.\left\|\boldsymbol{\Theta}_{i}\right\|\right)$, capable of describing different aspects of the total bonding environment of each atom in a structure. Previous work (Bickmore et al., 2013; Shepherd et al., 2016) has shown that $\left\|\vec{P}_{l}\right\|$ and $\left\|\mathbf{\Theta}_{i}\right\|$ vary systematically as a function of the bonding environment. Therefore, it should be possible to model how their ideal values change under various circumstances. However, it should be noted that it may be necessary, in some circumstances, to recover some of the directional information lost when taking the Frobenius norm of the quadrupole. For instance, $\left\|\mathbf{@}_{i}\right\|$ does not distinguish between oblate and prolate spheroidal deformation.

Bond Valence for Fully Covalent Bonds. The standard formulation of the BVM effectively addresses ionic and polar-covalent, but not fully covalent (i.e., between atoms of the same element), bonds. The reason for this is that if atomic valence $\left(V_{i}\right)$ is taken as equivalent to the oxidation number, fully covalent (i.e., same-element) bonds must be ignored for calculating the total bond valence. For example, C in diamond has an oxidation
state of zero, but forms four single bonds with its neighbors. Likewise, C in ethane ( $\mathrm{C}_{2} \mathrm{H}_{6}$ ) has an oxidation state of +3 , but still forms four single bonds to the three surrounding H atoms, and the neighboring C. One must simply decide on the correct value of $V_{i}$ for covalent systems. In both of the above cases, it is clearly 4, rather than 0 or 3, as the classic model suggests.

Fully covalent bonds can easily be included in a bond-valence treatment, however, if certain adjustments are made to the model. For instance, if we define atomic valence as the maximum number of single bonds incident to an atom (always a positive number), it would suffice for most typical situations involving minerals. In this case, we would also need to define the bond valence as positive in both directions, and recast the valence sum rule (Eqn. 4) as in Eqn. 12.

$$
\begin{equation*}
\sum_{j} s_{i j}=S_{i} \approx V_{i} \tag{12}
\end{equation*}
$$

O'Keeffe and Brese (1992) showed that a bond-valence approach could be used to describe anion-anion bonds in, for example, persulfides, sulfosalts, and peroxides, but ignored bonds weaker than 0.25 v.u. However, Wander et. al. (2015a) showed, for the Al-$\mathrm{Si}-\mathrm{H}-\mathrm{O}$ and Al-Si-K-O systems, that calculated bond-valence sums could actually be improved by including even very weak anion-anion bonds. Including cation-cation bonds made little difference in these systems, but certainly would in others, particularly in cases with partially and fully reduced metals.

The utility of including fully covalent bonding goes beyond improving bond-valence sums, however. It widens our definition of bonding, allowing for more types of two-body
interactions to be included in our bonds. First, it provides a means, within a strict bondvalence framework, of incorporating attractive and repulsive potentials between co-ions, depending on whether the atoms involved are under- or over-bonded, respectively. It also allows for the incorporation of Van der Waals interactions within the bond-valence framework. Second, if we acknowledge that the energy (i.e., well depth) of a given bond depends on both the bond valence and factors such as the bond character, we can qualitatively predict a very broad range of chemical behavior (Wander et al., 2015a).

Bond Valence-Length Curve Shapes. To define bond valence-length relationships for individual atom pairs, one usually assumes a simple model form similar to Eqn. 5, and then adjusts one or two of the parameters to enforce the valence sum rule (Eqn. 4) within a collection of crystal structures. One potential problem with this is that a given atom pair typically exhibits a fairly narrow range of bond lengths in crystal structures, over which many simple decay functions can reasonably represent the relationship. Wander et al. (2015b) used both molecular and crystal structures, however, to show that over a wider range of bond lengths, simple one- or two-parameter decay functions are not always flexible enough to adequately capture the relationship. This failure is problematic, given that our goal is to produce a valence-based potential energy model for use in molecular dynamics simulations, which would require accurate representation of a wider range of bond valences.

Eqns. 13 and 14 show more flexible forms of the bond valence-length relationship, which we will use here in addition to Eqn. 5 . Eqn. 13 is a weighted, geometric mean of the exponential decay function in Eqn. 5 and a power-law decay function. It has three
parameters: $R_{0}, B$, and $w$, which is a weighting coefficient with possible values between 0 and 1.

$$
\begin{equation*}
s_{i j}=e^{\left(R_{0}-R_{i j}\right) w / B}\left(\frac{R_{0}}{R_{i j}}\right)^{(1-w) / B} \tag{13}
\end{equation*}
$$

Eqn. 14 is a weighted, arithmetic mean of two exponential decay functions, with five parameters, including distinct values of $R_{0}$ and $B$.

$$
\begin{equation*}
s_{i j}=w e^{\left(R_{0,1}-R_{i j}\right) / B_{1}}+(1-w) e^{\left(R_{0,2}-R_{i j}\right) / B_{2}} \tag{14}
\end{equation*}
$$

In Eqns. 5 and 13, $R_{0}$ corresponds to the length of the single bond, but this is not the case for Eqn 14. There is still one and only one $R_{i j}$ value that does correspond to the single bond length, however. In all cases where we have applied Eqn. 14, the curvature break occurs at around $s_{i j}=1$ v.u.

Bond Valence-Length Curve Optimization. Bond valence-length relationships can be estimated based on known structures for which the individual bond valences, or at least the total bond valence incident to each atom, can be unambiguously assigned. In some cases, however, the available structures are too narrowly focused to sufficiently constrain the curve shape. In other cases, a wide distribution of bond lengths is available, but it is difficult or impossible to unambiguously assign bond valence values. This is particularly problematic for optimizing $B$ values in Eqns. 5, 13, and 14, because it can demonstrate enormous flexibility to compensate for poor structural data (e.g., poorly characterized 0-H bond lengths). In such cases, it may be possible to use supplementary methods.

We assume that bond valence is essentially identical to bond order, and use prior work (Badger, 1934; Johnston, 1966) on the relationship between vibrational force
constants and bond order to leverage available vibrational spectroscopic data. Johnston (1966) posited the relationship in Eqn. 15, where $k_{i j}$ is the vibrational force constant for a bond between atoms $i$ and $j$, of order $s_{i j}$, and $k_{1}$ is the vibrational force constant for a single bond of the same type.

$$
\begin{equation*}
s_{i j}=\frac{k_{i j}}{k_{1}} \tag{15}
\end{equation*}
$$

In cases for which we know the vibrational force constants for triple, double and single bonds, they conform closely to a 3:2:1 ratio. Making this assumption that bond valence is essentially equivalent to other bond order estimates allows us to use vibrational data from a much broader array of molecules, including radicals, to constrain the shape of bond valence-length curves. This is particularly important for estimating the $B$ parameters with confidence (Eqns. 5, 13, and 14), because we can now relate this value to the changes in the experimental vibrational force constant with distance. Whether one uses the traditional structural data, or the method we suggest here using experimental vibrational data, one should get the same answer.

## Potential Energy Model

Our expanded bonding model provides structural descriptors and rough estimates, at least, of ideal values for those descriptors under various circumstances. To produce a complete potential energy model, however, we must create energy cost functions for deviations from the ideal values. Here we describe the basic form of our preliminary model, along with the associated energy cost functions.

Energy Decomposition. The essential form of our model is shown in Eqn. 16, where E denotes energy, and the subscripts VM, VD, and VQ denote the valence monopole, dipole,
and quadrupole terms for each atom i. (Again, these are calculated from bond vectors, rather than the distribution of electric charge.) These terms are then summed over all atoms in the system.

$$
\begin{equation*}
E_{\text {Total }}=\sum_{i}\left(E_{V M, i}+E_{V D, i}+E_{V Q, i}\right) \tag{16}
\end{equation*}
$$

As model development progresses, we anticipate that we may need to add other terms, such as Coulomb interactions at long range, dipole-dipole terms on neighboring atoms, and pressure corrections. However, the simple model shown in Eqn. 16 is sufficient to show the utility of the valence-multipole energy decomposition.

Valence Monopole Energy. The valence monopole energy for each atom $i$ (Eqn. 17) is a function of the total incident bond valence $\left(S_{i}\right)$ and the atomic valence $\left(V_{i}\right)$. It is scaled to the a quantity ( $D_{E 1, i}$ ) analogous to the well depth term in a Morse function, and includes an exponent $\left(\alpha_{\mathrm{i}}\right)$. This form is valid only if $S_{i} \approx V_{i}$, but it is not known how close they need to be.

$$
\begin{equation*}
E_{V M, i}=\frac{1}{2} V_{i} D_{E 1, i}\left(\left(\frac{s_{i}}{V_{i}}\right)^{\alpha_{i}}-1\right)^{2} \tag{17}
\end{equation*}
$$

As shown in Eqn. 18, the value of $\alpha_{i}$ is related to the softness parameters $(B)$ in the bond valence-length relationships used (Eqns. 5, 13, 14), and both the force constant ( $k_{1}$ ) and well depth $\left(D_{E 1, i}\right)$ for a single bond of the type incident to the atom.

$$
\alpha_{i}=B_{i} \sqrt{\frac{k_{1, i}}{2 D_{E 1, i}}}
$$

In all cases, the subscript $i$ in Eqns. 16-18 denotes a particular atom, so terms that would normally be associated with a particular bond must somehow be averaged over all
the bonds incident to the atom in question. For each atom $i$, we use a simple weighted arithmetic mean over all the incident bonds $i j$, to compute the $k_{1, i}$ and $D_{E 1, i}$ (Eqns. 19-20).

$$
\begin{equation*}
k_{1, i}=\left(\frac{1}{S_{i}} \sum_{j} s_{i j} k_{1, i j}\right) \tag{19}
\end{equation*}
$$

For the $B_{i}$ value, we instead do a weighted arithmetic average of $1 / B_{i j}$ (Eqn. 21).

$$
\begin{equation*}
\frac{1}{B_{i}}=\left(\frac{1}{S_{i}} \sum_{j} \frac{s_{i j}}{B_{i j}}\right) \tag{21}
\end{equation*}
$$

However, this could not be applied directly in cases where the double exponential form (Eqn. 14) was used for the bond valence-length relationship. In such cases, however, we treat the two exponential terms as describing two separate bonds between the same two atoms, in which case Eqn. 21 still applies.

What remains, at this point, is to describe how $D_{E}$ values for individual bonds are estimated. $D_{E}$ values for bonds involving each atom pair are represented by a polynomial function of $s_{i j}$ (Eqn. 22), except in the case of H-O bonds, for which Eqn. 23 is applied. In these equations, $a, b, c$, etc., denote fitted constants.

$$
\begin{equation*}
D_{E, i j}=a s_{i j}+b s_{i j}^{2}+\cdots \tag{22}
\end{equation*}
$$

$$
D_{E, i j}=a s_{i j}^{1 / 2}+b s_{i j}^{c}
$$

Valence Dipole Energy. For the valence dipole term, we used a simple harmonic energy penalty function (Eqn. 24), where $k_{V D, i}$ is a type of spring constant. This form is unusual, because the units of $k_{V D, i}$ are not the typical energy/distance ${ }^{2}$, but rather energy/valence ${ }^{2}$.
$E_{V D, i}=k_{V D, i}\left(\left\|\vec{P}_{\imath}\right\|-\left\|\vec{P}_{\imath}\right\|_{\text {Ideal }}\right)^{2}$
It is because of this unit difference that we have chosen the designation "spring constant" rather than the more traditional "force constant" for both the valence dipole and quadrupole moment restraint equations.

The key to this term lies in the determination of the ideal value. In many cases, especially normal cations not subject to lone-pair or Second-Order Jahn-Teller effects, and bonded to a single type of anion, $\left\|\vec{P}_{\imath}\right\|_{\text {Ideal }}=0$ v.u. In the Al-Si-H-O system, only O (due to lone-pair effects) and $H$ (due to its small size and asymmetric bonding) had to be treated differently. For such elements there is likely to be not one, but multiple values of $\left\|\overrightarrow{P_{l}}\right\|_{\text {Ideal }}$, each of which corresponds to a particular arrangement of bonds. These will depend on both the coordination number and the identity of the bound atoms.

We have only a very limited ability to guess what ideal values might be. In general, they will depend strongly on the coordination number and the row number of the bound atoms. In many cases transitions between the known points are impossible to determine.

As the coordination number increases past four, it is expected that oxygen will act as a spherical anion, and $\left\|\vec{P}_{l}\right\|_{\text {Ideal }}$ should approach zero (Bickmore et al., 2013).

## Quadrupole Valence

We assumed a similar energy cost function for the valence quadrupole terms (Eqn. 25).

$$
E_{V Q}=k_{V Q, i}\left(\left\|\boldsymbol{\Theta}_{i}\right\|-\left\|\boldsymbol{\Theta}_{i}\right\|_{\text {Ideal }}\right)^{2}
$$

We found that valence quadrupole terms were not needed for the $\mathrm{Al}-\mathrm{Si}-\mathrm{H}-\mathrm{O}$ system, so we mention them here only to note that we made the attempt. However, we are certain that valence quadrupole terms will be needed for transition metals subject to centrosymmetric First-Order Jahn-Teller distortions (Shepherd et al., 2016), and many actinide ions (e.g., uranyl).

## METHODS

Given the basic form of the potential energy model, optimizing the model for the Al-Si-H-O system involved 1) constructing appropriate sets of data for calibrating and testing the model, and 2) the optimization procedure itself.

## Data Sets

To calibrate the model, we needed both structural and thermodynamic data for a wide range of species, but finding such data proved to be a substantial difficulty. Even in
cases where structural data was available, it was often not of sufficient quality. The VMM is an extremely sensitive model, and errors in bond lengths as small as $0.02 \AA$ can cause significant problems. Therefore, we used the most recent, suitable structural data available, and only used structures determined by neutron diffraction where $H$ was present. Similarly, thermodynamic data were not always available.

We employed three data sets, including both molecules and crystals in the Al-Si-H-O system: one for calibration of $\mathrm{Al}-\mathrm{O}, \mathrm{Si}-\mathrm{O}, \mathrm{H}-\mathrm{O}, \mathrm{H}-\mathrm{H}$, and $\mathrm{O}-\mathrm{O}$ interactions, another for calibration of $\mathrm{Al}-\mathrm{Al}, \mathrm{Si}-\mathrm{Si}, \mathrm{Al}-\mathrm{Si}, \mathrm{Al}-\mathrm{H}$, and $\mathrm{Si}-\mathrm{H}$ interactions, and a smaller set for checking the results of the first set. Thermodynamic data for the data sets was obtained from the online NIST JANAF thermochemical tables (http://kinetics.nist.gov/janaf/), or from Robie and Hemingway (1995).

The set used for calibrating Al-O, Si-O, $\mathrm{H}-\mathrm{O}, \mathrm{H}-\mathrm{H}$, and $\mathrm{O}-\mathrm{O}$ interactions was welltempered, spanning a very large range of likely bond configurations. It included the fully dissociated atoms $\left(\mathrm{Al}_{(\mathrm{g})}, \mathrm{H}_{(\mathrm{g})}, \mathrm{Si}_{(\mathrm{g}}\right.$, and $\left.\mathrm{O}_{(\mathrm{g})}\right), \mathrm{SiO}_{2(\mathrm{~g})}, \mathrm{HOAlO}_{(\mathrm{g})}$, several $\mathrm{SiO}_{2(\mathrm{~s})}$ polymorphs (quartz, cristobalite, coesite, and stishovite), $\alpha-\mathrm{Al}_{2} \mathrm{O}_{3(\mathrm{~s})}$ (corundum), and the $\mathrm{Al}_{2} \mathrm{SiO}_{5 \text { (s) }}$ polymorphs (kyanite, andalusite, and sillimanite).(Busing and Levy, 1965; Cox et al., 1973; Hill, 1981; Bish, 1993; Downs and Palmer, 1994; Heaney and Post, 2001; Dera et al., 2003; Balan et al., 2008) In all cases Al was in the +3 oxidation state and Si in +4 .

The set used for calibrating $\mathrm{Al}-\mathrm{Al}, \mathrm{Si}-\mathrm{Si}, \mathrm{Al}-\mathrm{Si}, \mathrm{Al}-\mathrm{H}$, and $\mathrm{Si}-\mathrm{H}$ interactions included $\mathrm{Al}_{(\mathrm{s})}, \mathrm{Si}_{(\mathrm{s})}, \mathrm{Al}_{2(\mathrm{~g})}, \mathrm{Si}_{2(\mathrm{~g})}, \mathrm{AlH}_{3(\mathrm{~s})}, \mathrm{AlH}_{3(\mathrm{~g})}, \mathrm{HAlO}_{(\mathrm{g})}$, and $\mathrm{SiH}_{4(\mathrm{~g})}$. In all these systems Al and Si were either partially or fully reduced. In addition, we included $\mathrm{Al}_{2} \mathrm{H}_{6(\mathrm{~g})}{ }^{*}$ and $\mathrm{Si}_{2} \mathrm{H}_{6(\mathrm{~g})}{ }^{*}$, for which we did not have complete thermodynamic data. Therefore, we performed optimizations and frequency calculations at the CCSD/cc-pVTZ level of theory in Gaussian 09, and
computed thermodynamic values from reaction calculations involving other members of the various sets.

The check set contained several species, against which we checked the calibrated model for the fully oxidized Al and Si parameters. Some species were expected to give good results: $\mathrm{Al}(\mathrm{OH})_{3}$ (bayerite), AlOOH (boehmite), $\mathrm{Al}_{4} \mathrm{Si}_{4} \mathrm{O}_{10}(\mathrm{OH})_{8}$ (kaolinite), and $\mathrm{SiO}_{2}$ (tridymite, moganite, and seifertite). However, we had no expectations about how the model would perform for others, for various reasons: e.g., radicals like $\mathrm{AlO} \bullet, \mathrm{AlOO}^{\bullet}, \mathrm{HO}_{2} \bullet$, and $\mathrm{H}_{3} \mathrm{O}^{+}$, or $\mathrm{SiO}_{2}$ ( $\beta$-quartz at 848 K ). (Newnham and de Haan, 1962; Dollase, 1965; Rothbauer et al., 1967; Wardle and Brindley, 1972; Saalfeld and Wedde, 1974; Dollase and Baur, 1976; d'Amour et al., 1978; Finger and Hazen, 1978; Hill, 1979; Levien et al., 1980; Levien and Prewitt, 1981; Joswig and Drits, 1986; Taylor et al., 1986; Spackman et al., 1987; Hazen et al., 1989; Ross et al., 1990; Glinnemann et al., 1992; Miehe and Graetsch, 1992; Boisen et al., 1994; Smyth et al., 1995; Daniels and Wunder, 1996; Comodi et al., 1997; Clark et al., 1998; Schmidt et al., 1998; Dera et al., 2002; Balan et al., 2006; Ikuta et al., 2007; Antao et al., 2008; Demichelis et al., 2008) However, we did not have enough species with $\mathrm{Al}-\mathrm{Al}, \mathrm{Si}-\mathrm{Si}, \mathrm{Al}-\mathrm{Si}, \mathrm{Al}-\mathrm{H}$, and $\mathrm{Si}-\mathrm{H}$ bonds to include any of those in the check set.

Tempering. The first calibration set was specifically selected to be tempered with respect to bond valence variations, meaning that, as far as possible, species were chosen to cover the complete range of likely bond valences, while avoiding too frequent inclusion of any particular narrow range. Since we were attempting to fit $D_{E}$ vs. $s_{i j}$, curves as exactly as possible, it was necessary to select at least one molecule or crystal with bond valences similar to the most probable values, but heavily favoring one narrow range (e.g., most Si-O bonds are $\sim 1$ v.u.) might worsen the fit in other regions of the curve. For example, Si forms
bonds with 0 of 2 v.u., $\sim 1$ v.u., and $\sim 2 / 3$ v.u., so we included at least one bond in each of these ranges. Al-O bonds occur over an even wider range, with values around $1 / 3,1 / 2,3 / 5,3 / 4$, 1, and 2 v.u. H-O bonds were particularly difficult, because almost all of them are close to 1 v.u. This places great emphasis on the effects of small deviations from unity and very heavy emphasis on the few data points we have away from 1 v.u., such as the gas-phase water dimer hydrogen bond.

In addition, we expected a valence dipole term on oxygen to be significant for tetrahedrally-coordinated Si in silicates. Therefore, we used a carefully balanced selection of those, favoring the most stable minerals (under ambient conditions).

This level of attention to this issue was entirely warranted, because our model is likely to perform relatively poorly if applied to systems that have bonding configurations significantly different from those in the calibration set, even if they are bracketed by the set. For example, we have no Si-O bonds of $\sim 1.5$ v.u. in the set. Given that the form of our $D_{E}$ vs. $s_{i j}$, curves (Eqns. 22-23) is potentially quite flexible, the model might produce a large error in such a scenario. The reason is straightforward: a small error in $D_{E}$ is cumulative over all the bonds in the system, and so will produce total errors on the order of 5-10x higher than those of an individual bond.

Another reason to restrict ourselves to small sets is due to the exponential form of the bond valence length relationships (Eqns. 5, 13, and 14). This causes a systematic error that affects all bond-valence fitting procedures. The details of this source of error are discussed in the online Supplemental Information, since it is likely only of interest to a select group of methodologists.

## Fitting procedure

We used a three-stage fitting procedure to optimize the potential energy model. The first stage involved fitting the bond valence-length curves (Eqns. 5, 13, 14), as described above. This was done either using vibrational spectroscopy data, where bond lengths could be related to bond order based on measured force constants, or the more traditional approach of optimizing the fitting parameters to enforce the valence sum rule (Eqn. 12).

We could only use vibrational spectroscopy data for $\mathrm{H}-\mathrm{H}, \mathrm{O}-\mathrm{O}$, and $\mathrm{O}-\mathrm{H}$ atom pairs, because they were the only sets with enough data for bonds of different lengths. For $\mathrm{H}-\mathrm{H}$ we had $\mathrm{H}_{2}$, and $\mathrm{H}_{2}{ }^{+}$(experimental data from the NIST Computational Chemistry Comparison and Benchmark Database at http://cccbdb.nist.gov. Hereafter referenced as CCCBDB). For $\mathrm{O}-\mathrm{O}$ we had $\mathrm{O}_{2}{ }^{+}, \mathrm{O}_{2}$, and $\mathrm{O}_{2}{ }^{-}$(CCCBDB). For $\mathrm{H}-\mathrm{O}$ we had $\mathrm{H}_{2} \mathrm{O}, \mathrm{H}_{2} \mathrm{O}_{2}, \mathrm{OH}, \mathrm{OH}^{-}$, $\mathrm{OH}^{+}, \mathrm{H}_{3} \mathrm{O}^{+}$(CCCBDB), and the $\left(\mathrm{H}_{2} \mathrm{O}\right)_{2}$ gas phase dimer (Kalescky et al., 2012). For this approach, it is possible to use charged species, provided they clearly follow the same trend as the others. For example, ozone shows substantial force relaxation due to the impossibility of satisfying all valences (without forming triangular ozone, which is unstable). This is quite common among strained molecules. Unfortunately, it is not yet possible to use larger molecules like $\mathrm{H}_{2} \mathrm{O}_{2}$ in this procedure, because the vibrational modes are too closely coupled.

The second approach to the bond valence-length fitting scheme was much more similar to the classic procedure (Brown and Altermatt, 1985), except that we used bond lengths from both molecular and crystal structures. Cutoff distances for calculating bond valence corresponded approximately to the minimum in the radial distribution function
between first and second shell coordination. In this case we also had to utilize other parameter sets, specifically OO and OH for both AlO and SiO and SiO for AlO fitting. The SiO set was $\mathrm{SiO}_{2(\mathrm{~g})}, \mathrm{HSiO}_{2}^{-}{ }_{(\mathrm{g})}, \mathrm{SiOH}_{4(\mathrm{~g})}$, quartz, and stishovite; and the AlO set was: $\mathrm{AlO}^{-}{ }_{(\mathrm{g})}, \mathrm{HAlO}_{(\mathrm{g})}$, $\mathrm{Al}(\mathrm{OH})_{3(\mathrm{~g})}$, sillmanite, andalucite, and corundum. This approach requires a separate known reference point to establish the $k_{1}$ value (Eqn. 15), such as the vibrational force constant of a small molecule like $\mathrm{AlO}_{(\mathrm{g})}$.

In both procedures (classic and force matching), we began by fitting Eqn. 5 to the data, and if the curvature of the fit was inadequate, we then progressed to Eqns. 13 and 14. For the Al-Si bonding we could find no data, so we used a mixing approximation. Our choice was the arithmetic mean for $R_{0}$ and the geometric mean for $k_{1} / B$.

Ideally, the second stage of the procedure would involve optimizing $D_{E}$ vs. $s_{i j}$, curves (Eqns. 22-23) to match the structural and thermodynamic data. But given that the thermodynamic data was not corrected for zero-point energies, in practice we were limited to optimizing $D_{0}$ vs. $s_{i j}$, curves. The $k_{1}$ values were fixed at the time of the bond-valence parameter fitting, and a constrained optimization was performed simultaneously over the $D_{0}$ values for all atom pairs.

In the third stage, we re-optimized all the $D_{0}$ vs. $s_{i j}$, curves, sequentially including the subsequent terms of the potential energy model (valence dipole and quadrupole terms). The results of the first optimization were used as initial estimates for the second optimization, and so on.

## RESULTS AND DISCUSSION

The form of the valence multipole energy decomposition is unique, and and has not been designed from one specific theoretical framework. Instead, the only theoretical basis for our model is simply the standard electron counting rules that undergird the BVM, while the rest of the model is based on conjecture and empirical fitting. Our results, nevertheless, show that, although the mathematical form of the model is very simple compared to existing reactive force fields, it demonstrates the capability to reasonably capture the chemical energy of the system. Moreover, the simplicity of the model allows us, in some cases, to rationalize the model in terms of theoretical expectations.

In this section, we report the results of the model optimization, including parameter values and overall accuracy, and discuss possible connections with theory. Finally, we discuss probable necessary refinements of the model.

## Model Optimization

Table 1 shows the fitted parameters for the bond valence-length relationships (Eqns. 5, 13, 14). These results conform to the expectation that more metallic and ionic bonds require mathematically more complex relationships (Eqns. 13 and 14) to capture the high curvature around $s_{i j}=1 \mathrm{v} . \mathrm{u}$. This can be rationalized in terms of the transition between $\sigma$ - and $\pi$-bonding (Wander et al., 2015b).

The $D_{0}$ vs. $s_{i j}$ curves were first optimized with only monopole terms (see Table 2 and Figure 1a), and then with both monopole and dipole terms (see Table 3 and Figure 1b). The graphs in Figures 1a and 1b are quite similar, as we would expect if the monopole term were indeed dominant. This also seems consistent with the long-standing usefulness of bond- and group-additivity methods for estimating thermodynamic properties of
molecules (Benson and Buss, 1958; Fliszár, 2008). It should also be noted that the valenceenergy relationships derived here do not jibe with those one might predict based on any number of BVM-based quantitative structure-activity relationships (Bickmore, 2014)

The curves in Figure 1b show a periodic quality. The most ionic bonds (Al-O, Si-O, H0 ) rise quickly as a function of $s_{i j}$ and then drop off as the bond valence surpasses 1 v.u., while the more covalent bonds ( $\mathrm{H}-\mathrm{H}$ and $\mathrm{O}-\mathrm{O}$ ) are much slower to rise, but then gain strength rapidly as the covalent bonding becomes more significant. This is consistent with the fact that ionic atom pairs favor a greater number of low-valence bonds, while more covalent pairs favor a smaller number of high-valence bonds (Brown and Skowron, 1990; Brown, 2002).

Compared to other covalent bonds, HH bonds at fractional bond orders are quite strong. This is probably due to the fact that hydrogen has no core electrons and any substantial polarization can lead to a bare proton. Furthermore, because there are no nonbonding electrons there is a substantially reduced, if not eliminated, reorganization energy, which would further reduce the bonding energy.

Another particularly strong bond, which is unfortunately not visible on the scale of our graph is the O-H hydrogen bond. Despite being only a small fraction of a single bond, it still has an energy of $\sim 24 \mathrm{~kJ} / \mathrm{mol}$. The only way to explain this is to suggest that the OH hydrogen bond is substantially more ionic than the OH molecular bond.

The fact that these curves lend themselves to physical interpretation, despite the fact that they are purely empirical fits, with no a priori considerations about the form, suggests an underlying physical basis. This seems promising in terms of the ability to expand the model's predictive capability.

When we included dipole terms, we used $\left\|\overrightarrow{P_{H}}\right\|_{\text {Ideal }}=0.95$ v.u. for H bound to 0 , and a $k_{V D}$ value of $85.4 \mathrm{~kJ} \cdot \mathrm{~mol}^{-1} \bullet$ v.u- ${ }^{-2}($ Eqn. 24$)$, and considered it unlikely to have a significant contribution to the energy, otherwise. To avoid multiplication of fitting parameters, we did not attempt to fit dipole terms for Si and Al . We have no chemical justification for their inclusion, and we considered these terms unlikely to make a substantial difference in the predicted energies of minerals.

Table 4 shows a relevant selection of likely 0 bonding configurations used to calculate $\left\|\overrightarrow{P_{O}}\right\|_{\text {Ideal }}$, with $k_{V D}=284.3 \mathrm{~kJ} \cdot \mathrm{~mol}^{-1} \bullet$ v.u-2 $($ Eqn. 24$)$. The results generally conform to the expectation that higher-valence, and more covalent bonds, cause more distortion in the coordination shells of anions with lone pairs (Gillespie and Hargittai, 1991; Gillespie and Johnson, 1997; Bickmore et al., 2013).

The results of the final energy optimization are reported in Tables 5 and 6 for the calibration and check sets, respectively. The standard deviation of the energy error on the calibration sets was $0.8 \mathrm{~kJ} / \mathrm{mol}$ per unique atom (see also Figure 4a.)

At first glance, the check set results (Figure 4b) are not as accurate as we might like. However, most of these are not typical or ideal systems. The first half are entirely composed of systems in which the valence sum rule cannot even be approximately satisfied. The second half actually does quite well with two exceptions, and both exceptions have the same basic problem over estimation of the dipole term on H , which we will explain below. Otherwise, the results are excellent, with the standard deviation error per atom of about $5 \mathrm{~kJ} / \mathrm{mol}$.

The model clearly fails when applied to molecules with significantly unsatisfied valence. We need to understand the effect on force constants when Bond Valence sums
cannot be satisfied. The classic example is ozone whose BV sums are closer to 1.5 and 2.5 v.u., rather than the expected 2 . This deviation causes a proportionate weakening between the predicted $(1000 \mathrm{~N} / \mathrm{m})$ and actual ( $570 \mathrm{~N} / \mathrm{m}$ ) force constant. Until we can address this, we are limited to systems where the BV sums are nearly satisfied. Since this problem is only likely to occur in the gas phase, or with certain radicals, the level of limitation is not too severe. Some part of this may be unsolvable, as the very assumptions that underlie our BV potential assume saturated or near saturated valence. In this case, single molecule force fields could be created if sufficient need warranted it. However, we suspect that there is a fundamental relationship between force constants and bond-valence saturation that will yield to analysis over time.

Two of the crystals had substantial per-atom errors on the order of $100 \mathrm{~kJ} / \mathrm{mol}$, boehmite $(\gamma-\mathrm{AlOOH})$ and bayerite $\left(\beta-\mathrm{Al}(\mathrm{OH})_{3}\right)$. Both exhibited substantial underbonding of H of $20 \%$ or more. This leads to strong underestimation of the H-bond dipole and, correspondingly, a large positive deviation in energy. The geometric difference here is actually quite tiny, perhaps $0.02 \AA$, so it may be that there are errors in the structure determinations. It may also be that the valence dipole potential energy surface for H is asymmetric, which is something we can explore in future implementations of the model.

Finally, Tables 8 and 9 report the results from the reduced calibration set. Table 8 shows the $D_{0}$ vs. $s_{i j}$ curves and Table 9 shows the energy results. There is no way to confirm these values as we have no additional experimental data.

## IMPLICATIONS

Our results show that it is possible to use an energy decomposition based on a valence multipole expansion to determine reasonable system energies, with chemically useful accuracy. As long as deviations in the bond-valence sums are less than about 0.2 v.u., this model should produce results with errors of only $5 \mathrm{~kJ} / \mathrm{mol}$ per unique atom. This is a remarkable result for any black-box model, on par with comparable quantum mechanical approaches. Also, the model should have similar accuracy when applied to either molecules or crystals.

While the results are promising, some work still remains to fully implement this type of model for use in molecular modeling. The first issue is that model calibration requires enough bonds for every pair of atoms, covering a wide enough range of bond orders, which presents a challenge when considering the range of available experimental data. We will clearly need to move into computational sources for our data collection. Fortunately, since our parameterization relies largely on small molecules, it will be possible to use high-level ab initio approaches like coupled-cluster techniques. Even with this level of theory, however, the requisite accuracy is not a given, particularly for metallic systems.

We also anticipate the necessity of making adjustments in the shapes of the $D_{0}$ vs. $s_{i j}$ curves, especially at high $s_{i j}$ values, to accommodate non-equilibrium configurations encountered in molecular dynamics simulations, as well as high-pressure phases. Additionally, changes to the bond energy expression are also likely to better match changes in energy far away from equilibrium geometries and better reproduce dissociation curves.

Finally, all the interactions discussed so far only deal with very short-range interactions. To model systems in which long-range interactions play a larger role (e.g.,
aqueous solutions), we will have to consider Coulombic interactions, at least outside of the bond cutoffs.

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Table 1. Optimized bond-valence parameters.

| Atom 1 | Atom 1 Valence | Atom 2 | Atom 2 Valence | Form | $\begin{aligned} & R_{0,1} \\ & (\AA) \end{aligned}$ | $\begin{gathered} \boldsymbol{B}_{1} \\ (\AA) \end{gathered}$ | $\begin{aligned} & R_{0,2} \\ & (\AA) \end{aligned}$ | $\begin{gathered} B_{2} \\ (\AA) \end{gathered}$ | $\begin{aligned} & \boldsymbol{R}_{\text {cut }} \\ & (\AA) \end{aligned}$ | $\boldsymbol{w}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| O | 2 | Al | 3 | Eqn. 14 | 1.7005 | 0.0924 | 2.2096 | 0.9990 | 3 | 0.5179 |
| O | 2 | Si | 4 | Eqn. 14 | 1.5531 | 0.0575 | 2.3547 | 0.9612 | 3 | 0.5065 |
| O | 2 | H | 1 | Eqn. 13 | 0.9530 | 0.1950 | 0 | 0 | 6 | 0.4835 |
| O | 2 | O | 2 | Eqn. 5 | 1.4560 | 0.3579 | 0 | 0 | 6 | 1 |
| Al | 3 | A1 | 3 | Eqn. 5 | 0 | 0 | 0 | 0 | 6 | 1 |
| H | 1 | Al | 3 | Eqn. 5 | 0 | 0 | 0 | 0 | 3 | 1 |
| Si | 4 | Al | 3 | Eqn. 5 | 0 | 0 | 0 | 0 | 6 | 1 |
| H | 1 | H | 1 | Eqn. 5 | 0.7919 | 0.5259 | 0 | 0 | 2 | 1 |
| H | 1 | Si | 4 | Eqn. 5 | 0 | 0 | 0 | 0 | 3 | 1 |
| Si | 4 | Si | 4 | Eqn. 5 | 0 | 0 | 0 | 0 | 6 | 1 |
| Al | 3 | H | 1 | Eqn. 5 | 0 | 0 | 0 | 0 | 3 | 1 |
| Al | 3 | Si | 4 | Eqn. 5 | 0 | 0 | 0 | 0 | 6 | 1 |
| Si | 4 | H | 1 | Eqn. 5 | 0 | 0 | 0 | 0 | 3 | 1 |

Table 2. $D_{0}$ vs. $s_{i j}$ parameters resulting from valence monopole-only energy optimization on the tempered set. Force constants were taken from experimental data and not refit.

| Atom 1 | Atom 2 | Force Const <br> ${\mathbf{( k J \mathbf { m o l } ^ { - 1 } \AA ^ { - 2 }} \mathbf{)}}$ <br> Form | $\boldsymbol{a}$ | $\boldsymbol{b}$ | $\boldsymbol{c}$ | $\boldsymbol{d}$ |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| O | Al | 1777.3150 | Eqn. 22 | 851.8089 | -1192.1804 | 1224.6636 | -383.0072 |
| O | Si | 2762.9621 | Eqn. 22 | 527.0360 | -22.0542 | -47.0318 | 0 |
| O | H | 4656.4438 | Eqn. 23 | 216.6120 | 247.5746 | 4.1099 | 0 |
| O | O | 3607.2626 | Eqn. 22 | 38.4168 | 25.6211 | 35.4555 | 0 |
| Al | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| H | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| H | H | 3464.6712 | Eqn. 22 | 265.6922 | 166.5006 | -25.6530 | 0 |
| H | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Al | H | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Al | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | H | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |


| Atom 1 | Atom 2 | Force Const (kJ•mol ${ }^{-1} \AA^{-2}$ ) | Form | $a$ | b | c | d |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| O | Al | 1777.3150 | Eqn. 22 | 739.2846 | -834.8911 | 868.1735 | -277.3448 |
| O | Si | 2762.9621 | Eqn. 22 | 481.3612 | 32.0345 | -62.7606 | 0 |
| O | H | 4656.4438 | Eqn. 23 | 160.3074 | 315.0453 | 1.4734 | 0 |
| O | O | 3607.2626 | Eqn. 22 | 170.4692 | -91.7876 | 61.1265 | 0 |
| Al | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| H | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | Al | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| H | H | 3464.6712 | Eqn. 22 | 0.0074 | 963.5303 | -556.9658 | 0 |
| H | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Al | H | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Al | Si | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |
| Si | H | 0 | Eqn. 22 | 0 | 0 | 0 | 0 |

Table 3. $D_{0}$ vs. $s_{i j}$ parameters resulting from valence dipole energy optimization on the tempered set. Force constants were taken from experimental data and not refit.

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| $\mathbf{N}_{\mathbf{c}}$ | Ligands | Ideal Angle(s) |
| :---: | :---: | :---: |
| 0 | None | $\mathrm{N} / \mathrm{A}\left(\mathrm{VVS}_{\text {ideal }}=0\right)$ |
| 1 | Any | $\mathrm{N} / \mathrm{A}\left(\mathrm{VVS}_{\text {ideal }}=\mathrm{S}_{1}\right)$ |
| 2 | H | $104.5^{\circ}$ |
| 2 | $\mathrm{Al}_{2}$, or $\mathrm{Al} \& \mathrm{Si}$ | $180^{\circ}$ |
| 2 | $\mathrm{Si}_{2}$ | $145.5^{\circ}$ |
| 2 | $\mathrm{Al}, \mathrm{H}$ | $130.8^{\circ}$ |
| 2 | $\mathrm{Si}, \mathrm{H}$ | $118.7^{\circ}$ |
| 3 | All Al or Si | $131^{\circ}, 131^{\circ}, 98^{\circ}$ |
| 3 | H | $111.3^{\circ}(\mathrm{x} 3)$ |
| 4 | Any (Generally only Al$)$ | $\sim 109^{\circ}\left(\left\\|\vec{P}_{l}\right\\|_{\text {Ideal }}=0.05\right.$ v.u. $)$ |
| $5+$ | Any (None in set $)$ | $\left(\left\\|\vec{P}_{l}\right\\|_{\text {Ideal }}=0\right.$ v.u. $)$ |

Table 5. Energy fitting results from the oxidized tempered set. The experimental energies ( $E_{\text {exp }}$ ) were corrected ( $\Delta E_{\text {corr }}$ ) from their tabulated values to reflect a free-atom standard state. The experimental energies are then compared to the calculated energies when monopole ( $E_{\text {mono }}$ ), dipole ( $E_{d i}$ ), and quadrupole ( $E_{q u a d}$ ) terms were included, to calculate the misfit values ( $\Delta E_{\text {mono }}, \Delta E_{d i}, \Delta E_{\text {quad }}$ ). All values are reported in $\mathrm{kJ} / \mathrm{mol}$.

| Molecule/Crystal | $\Delta E_{\text {corr }}$ | $\boldsymbol{E}_{\text {exp }}$ | $E_{\text {mono }}$ | $\boldsymbol{E}_{\text {di }}$ | $E_{\text {quad }}$ | $\Delta E_{\text {mono }}$ | $\Delta E_{\text {di }}$ | $\Delta E_{\text {quad }}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\left(\mathrm{H}_{2} \mathrm{O}\right)_{2(\mathrm{~g})}$ | 1276.578 | -483.16 | -480.63 | -482.71 | -482.71 | -3.36 | -0.21 | -0.21 |
| $\mathrm{Al}_{(\mathrm{g})}$ | 289.068 | 289.07 | 289.07 | 289.07 | 289.07 | 0.00 | 0.00 | 0.00 |
| $\mathrm{AlOOH}_{(\mathrm{g})}$ | 955.817 | -447.01 | -447.01 | -447.01 | -447.01 | 0.00 | 0.00 | 0.00 |
| Andalusite | 2142.346 | -2441.80 | -2441.60 | -2442.00 | -2442.00 | -0.58 | 0.15 | 0.15 |
| Coesite | 869.001 | -852.30 | -855.68 | -854.66 | -854.66 | 2.79 | 1.95 | 1.95 |
| Corundum | 1273.345204 | -1582.30 | -1580.72 | -1582.93 | -1582.93 | -3.73 | 0.55 | 0.55 |
| Cristobalite | 869.001 | -854.60 | -855.19 | -856.39 | -856.39 | -1.37 | 1.00 | 1.00 |
| $\left.\mathrm{H}_{2}{ }^{+} \mathrm{g}\right)$ | 1726.521 | 1491.18 | 1491.19 | 1491.19 | 1491.19 | -0.02 | 0.00 | 0.00 |
| $\mathrm{H}_{2(\mathrm{~g})}$ | 406.552 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 | 0.00 |
| $\mathrm{H}_{2} \mathrm{O}_{(\mathrm{g})}$ | 638.289 | -228.58 | -233.63 | -229.50 | -229.50 | 6.70 | 0.45 | 0.45 |
| $\mathrm{H}_{2} \mathrm{O}_{2(\mathrm{~g})}$ | 870.026 | -105.44 | -105.16 | -105.36 | -105.36 | -0.38 | -0.08 | -0.08 |
| $\mathrm{H}_{(\mathrm{g})}$ | 203.276 | 203.28 | 203.28 | 203.28 | 203.28 | 0.00 | 0.00 | 0.00 |
| Kyanite | 2142.346 | -2443.10 | -2444.44 | -2442.26 | -2442.26 | 3.62 | -0.68 | -0.68 |
| $\left.\mathrm{O}^{+}{ }^{+} \mathrm{g}\right)$ | 1784.905 | 1139.99 | 1140.09 | 1140.02 | 1140.02 | -0.14 | -0.02 | -0.02 |
| $\mathrm{O}_{2(\mathrm{~g})}$ | 463.473 | 0.00 | -0.20 | -0.06 | -0.06 | 0.28 | 0.05 | 0.05 |
| $\mathrm{O}_{(\mathrm{g})}$ | 231.737 | 231.74 | 231.74 | 231.74 | 231.74 | 0.00 | 0.00 | 0.00 |
| Quartz | 869.001 | -865.30 | -860.43 | -861.65 | -861.65 | -3.80 | -2.51 | -2.51 |
| $\mathrm{Si}_{(\mathrm{g})}$ | 405.528 | 405.53 | 405.53 | 405.53 | 405.53 | 0.00 | 0.00 | 0.00 |
| Sillimanite | 2142.346 | -2439.10 | -2439.15 | -2439.03 | -2439.03 | 0.16 | -0.05 | -0.05 |


| $\mathrm{SiO}_{2(\mathrm{~g})}$ | 869.001 | -306.92 | -306.94 | -306.90 | -306.90 | 0.06 | -0.02 | -0.02 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Stishovite | 869.001 | -802.80 | -802.54 | -803.01 | -803.01 | -0.78 | 0.15 | 0.15 |
| Diaspore | 955.817 | -922.70 | -923.40 | -922.87 | -922.87 | 0.94 | 0.08 | 0.08 |
| Standard Deviation |  |  |  |  |  | 1.86 | 1.08 | 1.08 |

Table 6. Energy fitting results from the check set. The experimental energies ( $E_{\text {exp }}$ ) were corrected ( $\Delta E_{\text {corr }}$ ) from their tabulated values to reflect a free-atom standard state. The experimental energies are then compared to the calculated energies when monopole ( $E_{\text {mono }}$ ) and dipole ( $E_{d i}$ ) terms were included, to calculate the misfit values ( $\Delta E_{\text {mono }}$ and $\Delta E_{d i}$ ). The misfit values were then normalized to the number of unique atoms ( $N_{\text {unique }}$ ).

| Molecule/ Crystal | $\Delta E_{\text {corr }}$ | $\boldsymbol{E}_{\text {exp }}$ | $E_{\text {mono }}$ | $\boldsymbol{E}_{\boldsymbol{d i}}$ | $\Delta E_{\text {mono }}$ | $\Delta E_{d i}$ | $N_{\text {unique }}$ | $\begin{aligned} & \Delta E_{\text {monol }} \\ & N_{\text {unique }} \\ & \hline \end{aligned}$ | $\begin{aligned} & \Delta E_{\text {di/ }} / \\ & N_{\text {unique }} \end{aligned}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\mathrm{AlO}_{(\mathrm{g})}$ | 520.804 | 40.803 | -363.98 | -409.96 | -404.78 | -450.76 | 2 | -202.39 | -225.38 |
| $\mathrm{AlOO}_{(\mathrm{g})}$ | 752.541 | -91.677 | -984.63 | -1006.08 | -892.96 | -914.40 | 3 | -297.65 | -304.80 |
| $\mathrm{H}_{3} \mathrm{O}^{+}(\mathrm{g})$ | 329.303 | 198.125 | -717.79 | -759.64 | -915.91 | -957.76 | 3 | -305.30 | -319.25 |
| $\mathrm{HOO}_{(\mathrm{g})}$ | 666.749 | 14.431 | 30.20 | 26.49 | 15.77 | 12.06 | 4 | 3.94 | 3.01 |
| St. Dev. |  |  |  |  | 444.5 | 455.2 |  | 144.0 | 148.9 |
|  |  |  |  |  |  |  |  |  |  |
| $\beta$-Quartz | 869.001 | -856.153 | -826.00 | -824.99 | 30.15 | 31.17 | 4 | 7.54 | 7.79 |
| Boehmite | 955.817 | -915.900 | -922.21 | -392.41 | -6.31 | 523.49 | 3 | -2.10 | 174.50 |
| Kaolinite | 4287.926 | -3797.500 | -3778.20 | -3870.40 | 19.30 | -72.90 | 17 | 1.14 | -4.29 |
| Moganite | 869.001 | -851.300 | -860.03 | -861.27 | -8.73 | -9.97 | 3 | -2.91 | -3.32 |
| Seifertite | 869.001 | -794.000 | -808.50 | -809.18 | -14.50 | -15.18 | 3 | -4.83 | -5.06 |
| Trydmite | 869.001 | -853.800 | -848.59 | -848.95 | 5.21 | 4.85 | 3 | 1.74 | 1.62 |
| Bayerite | 1594.106 | -1153.000 | -1238.28 | -1228.54 | -85.28 | -75.54 | 7 | -12.18 | -10.79 |
| St. Dev. |  |  |  |  | 37.4 | 210.2 |  | 6.1 | 67.1 |

Table 7. $D_{0}$ vs. $s_{i j}$ parameters for the reduced calibration set.

| Atom 1 | Atom 2 | $\boldsymbol{a}$ | $\boldsymbol{b}$ |
| :--- | :--- | ---: | ---: |
| Al | Al | 205.8767738 | -52.59772999 |
| H | Al | 154.231069 | -21.10143446 |
| Si | Al | 100.76 | -17.598 |
| H | H | 1422.742954 | -1919.768723 |
| H | Si | 144.0735109 | 0 |
| Si | Si | 254.0441443 | -53.80073857 |

Table 8. Energy fitting results from the reduced calibration set. The experimental energies ( $E_{\text {exp }}$ ) were corrected ( $\Delta E_{\text {corr }}$ ) from their tabulated values to reflect a freeatom standard state. The experimental energies are then compared to the calculated energies when monopole ( $E_{\text {mono }}$ ) terms were included, to calculate the misfit values ( $\Delta E_{\text {mono }}$ ).

| Crystal/Molecule | $\boldsymbol{\Delta} \boldsymbol{E}_{\text {corr }}$ | $\boldsymbol{E}_{\text {exp }}$ | $\boldsymbol{E}_{\text {mono }}$ | $\boldsymbol{\Delta} \boldsymbol{E}_{\text {mono }}$ |
| :--- | :---: | :---: | :---: | :---: |
| $\mathrm{Al}_{(\mathrm{g})}$ | 289.068 | 0 | 0.000 | 0.000 |
| $\mathrm{Al}_{2(\mathrm{~g})}$ | 578.135 | 434.251 | 434.251 | 0.000 |
| $\mathrm{AlH}_{3(\mathrm{~g})}$ | 898.896 | 96.619 | 96.619 | 0.000 |
| $\mathrm{Si}_{2(\mathrm{~g})}$ | 811.056 | 532.654 | 532.647 | -0.007 |
| $\mathrm{Si}_{2} \mathrm{H}_{6(\mathrm{~g})}$ | 2030.713 | 105.7365 | 99.597 | -6.139 |
| $\mathrm{SiH}_{4(\mathrm{~g})}$ | 1218.633 | 56.827 | 66.047 | 9.220 |
| $\mathrm{Si}_{(\mathrm{g})}$ | 405.528 | 0 | 3.054 | 3.054 |
| St. Dev. |  |  |  | $\mathbf{4 . 2 6 5}$ |



Figure 1. $D_{0}$ vs. $s_{i j}$ curves obtained from a) the monopole-only optimization, and b) the dipole optimization. The curves show clear periodicity, with ionic bonds rising
more sharply at longer distances (lower bond valence), and multiple bonds favored for covalent bonds.


Figure 2. Comparison between experimental energy and calculated energy in the a) tempered calibration set and b) the check set. The symbols for the calibration set differentiate between crystals and molecules, and show the results for both the monopole-only optimization and the dipole optimization. The symbols for the check
set differentiate between species with fully saturated atomic valences, and those
with unsaturated valences. The quality of the results is on par with the best quantum mechanical approaches, and exceeds those currently available for crystals.


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