A FOUNDATIONS ADVANCES

Received 10 February 2025 Accepted 23 May 2025

ISSN 2053-2733

Edited by A. Altomare, Institute of Crystallography - CNR, Bari, Italy

Keywords: anisotropic atomic displacement parameters; ADPs; neural network potentials; molecular dynamics simulations; thermoelectric materials.



research papers

Direct derivation of anisotropic atomic displacement parameters from molecular dynamics simulations in extended solids with substitutional disorder using a neural network potential

Yoyo Hinuma*

Department of Energy and Environment, National Institute of Advanced Industrial Science and Technology (AIST), 1-8-31, Midorigaoka, Ikeda, Osaka 563-8577, Japan. *Correspondence e-mail: y.hinuma@aist.go.jp

Atomic displacement parameters (ADPs) are crystallographic information describing the statistical distribution of atoms around an atom site. Anisotropic ADPs by atom were directly derived from classical molecular dynamics (MD) simulations using a universal machine-learned potential. The (co)valences of atom positions were taken over recordings at different time steps in a single MD simulation. The procedure is demonstrated on extended solids, namely rocksalt structure MgO and three thermoelectric materials, Ag_8SnSe_6 , $Na_2In_2Sn_4$ and BaCu_{1.14}In_{0.86}P₂. Unlike the very frequently used lattice dynamics approach, the MD approach can obtain ADPs in crystals with substitutional disorder and explicitly at finite temperature, but not under conditions where atoms migrate in the crystal. The calculated ADP approaches 0 when the temperature approaches 0, and the ADP is proportional to the temperature when the atom is in a harmonic potential and the sole contribution to the actual non-zero ADP is from the zero-point motion. The zero-point motion contribution can be estimated from the proportionality constant assuming this Einstein model. ADPs from MD simulations could act as a tool complementing experimental efforts to understand the crystal structure including the distribution of atoms around atom sites.

1. Introduction

Atomic displacement parameters (ADPs) are often provided as part of crystallographic structural data and may represent atomic motion, possible static displacive disorder and thermal vibration (Trueblood *et al.*, 1996). In the past, there was discussion of 'thermal vibrations' (Willis & Pryor, 1975), but the International Union of Crystallography now recommends using the term 'ADP' (Trueblood *et al.*, 1996). ADPs are generally anisotropic. Calculation of ADPs is important in particular to model light elements such as H, where obtaining ADPs from X-ray diffraction is difficult, and to provide clues for obtaining a better picture of the actual crystal structure through refinement.

Theoretical derivations of ADPs are typically performed indirectly through lattice dynamics analysis, where the dynamical matrix is obtained and the vibrational, or phonon, frequency of each mode is calculated. Examples of formalisms may be found in the work of Erba *et al.* (2013), Madsen *et al.* (2013), Lane *et al.* (2012).

The lattice dynamics approach is difficult to apply in systems where disorder of elements on a (sub)lattice plays a critical role. Models with large supercells and/or a very short range order on the (sub)lattice are required and the symmetry is different from the experimental model. Ordering may significantly affect the final results in a small supercell with short-range ordering.

Split-site systems are also problematic with lattice dynamics. One example of a split site is a double-well potential with minima at two very close positions. The average position of an atom at this site will be the middle of the two positions at elevated temperatures, while the atom will be at one of the minima at the 0 K limit. Placing the atom at the elevated temperature position leads to an imaginary mode at the Γ point.

In contrast, direct derivation of anisotropic ADPs, assuming a normal (or Gaussian) distribution, from molecular dynamics (MD) simulations is possible even for disordered systems and split-site systems. The averages of displacement vector components from the mean atom position, such as $\langle \Delta \xi^{C}{}_{i} \Delta \xi^{C}{}_{j} \rangle$, are simply the (co)variances of atom positions, for instance $\operatorname{Cov}(\Delta \xi^{C}{}_{i} + \xi^{C}{}_{i}, \Delta \xi^{C}{}_{j} + \xi^{C}{}_{j})$. Here, $\xi^{C}{}_{i}$ and $\Delta \xi^{C}{}_{i}$ are the *i* component of the mean atom position vector and the displacement vector, respectively, in Cartesian coordinates for a given atom. A large number of displacement values for a given crystal can be obtained from MD simulations, and derivation of ADPs from these values is very straightforward. This approach was used to obtain the anisotropic ADPs of ND₃ (Reilly *et al.*, 2007) and benzophenone (Reilly *et al.*, 2013). The ADP of an individual atom and that of an atom site must be clearly distinguished. The (co)variance of positions for a single atom is obtained in the former, while the (co) variance in the latter is taken over positions of multiple atoms that are each affine transformed such that the images of atoms are at almost the same position. The latter is experimentally observed, while the former is readily obtained using MD.

The direct method can, in principle, derive ADPs for any system. One notable exception is when atoms migrate during the simulations and are not trapped around an equilibrium point. The drawback of the direct method is that each MD simulation gives different results and obtaining very reliable values requires a long simulation time and/or a large supercell, which could be computationally expensive using first-principles calculations.

Verifying the accuracy of ADPs is a difficult issue to address. The ADPs in crystal structure refinement absorb systematic errors. Thus, it is highly challenging to obtain accurate ADPs. In X-ray electron-density analysis, ADPs obtained separately from X-ray and neutron diffraction data are typically compared to evaluate the accuracy. An extremely careful study on monoclinic Ni(ND₃)₄(NO₂)₂ showed average differences of ADPs for non-hydrogen atoms on the order of a few 0.0001 Å², or less than 10%, between 9 (1) K X-ray diffraction (XRD) and 13 (1) K neutron diffraction measure-



Figure 1

Experimentally obtained crystal structures of (a, b) Ag₈SnSe₆ (Takahashi *et al.*, 2024), (c) Na₂In₂Sn₄ (Yamada *et al.*, 2023) and (d) BaCu_{1.14}Cu_{0.86}P₂ (Sarkar *et al.*, 2024*b*). The 300 K experimentally obtained anisotropic ADPs for Ag1 and Ag3 are shown in (a), while the 300 K computationally derived ADPs for all Ag are given in (b). (a, b) Gray, dark purple and green circles represent Ag, Sn and Se sites, respectively. (c) Yellow and purple circles represent Na and In/Sn sites, respectively. (d) Green, blue and light purple circles represent the main Ba, Cu/In and P sites, respectively. The small brown circles above and below large green circles are the Ba11 sites of Sarkar *et al.* (2024*b*). This reference claims that the Ba site is triple-split where most of the Ba occupies the main Ba1 site (green circles) but about 18% enters Ba11 sites at 175 K.

 Table 1

 Notations of position and displacement vectors, bases and ADPs.

Basis	Direct lattice $(\mathbf{a}, \mathbf{b}, \mathbf{c})$ or $(\mathbf{a}_1, \mathbf{a}_2, \mathbf{a}_3)$	Direct lattice $(a^*\mathbf{a}, b^*\mathbf{b}, c^*\mathbf{c})$ or $(a^1\mathbf{a}_1, a^2\mathbf{a}_2, a^3\mathbf{a}_3)$	Cartesian basis $(\mathbf{e}_1, \mathbf{e}_2, \mathbf{e}_3)$
Components of r	$x, y, z \text{ or } x^1, x^2, x^3$	$\xi, \eta, \zeta \text{ or } \xi^1, \xi^2, \xi^3$	$\xi^{C}, \eta^{C}, \zeta^{C} \text{ or } \xi^{C}_{1}, \xi^{C}_{2}, \xi^{C}_{3}$
Components of u	Δx , Δy , Δz or Δx^1 , Δx^2 , Δx^3	$\Delta \xi$, $\Delta \eta$, $\Delta \zeta$ or $\Delta \xi^1$, $\Delta \xi^2$, $\Delta \xi^3$	$\Delta \xi^{C}, \Delta \eta^{C}, \Delta \zeta^{C} \text{ or } \Delta \xi^{C}_{1}, \Delta \xi^{C}_{2}, \Delta \xi^{C}_{3}$
Related ADP	$\beta^{ij} = 2\pi^2 \langle \Delta x^i \Delta x^j \rangle$	$U^{ij} = \langle \Delta \xi^i \Delta \xi^j \rangle$	$U_{ij}^{C} = \langle \Delta \xi_{i}^{C} \Delta \xi_{j}^{C} \rangle$
Unit of related ADP	Dimensionless	Length ²	Length ²

ments (Iversen *et al.*, 1996). The ADPs from classical MD simulations suffer some uncertainty from statistical processing in addition to systematic deviations from the true value from the use of approximations and the difference in classical and quantum dynamics.

This paper demonstrates the use of universal machinelearned neural network potential (NNP) MD simulations to obtain the ADP. The calculated ADPs were compared with experimentally reported values for rocksalt structure MgO and three thermoelectric materials, namely argyrodite structure Ag₈SnSe₆ (Takahashi *et al.*, 2024), Na₂In₂Sn₄ (Yamada *et al.*, 2023) with a helical tunnel framework structure, and ThCr₂Si₂-type phosphide BaCu_{1.14}In_{0.86}P₂ (Sarkar *et al.*, 2024*b*). Some have intrinsic substitutional disorder. The crystal structures of the thermoelectric materials are visualized in Fig. 1. The ADPs are especially interesting in the thermoelectric materials because rattling atoms with large ADPs, which may be very anisotropic, could be effective in reducing the thermal conductivity and improving the thermoelectric performance.

2. Formalism

Various symbols are used in the literature to describe ADPs, including **U**, **U**^C, **B** and β , and these have not always been used consistently. Table 1 summarizes the recommendations from a subcommittee on ADP nomenclature from the International Union of Crystallography [from Section 1.3 of Trueblood *et al.* (1996)]. Here, **r** is the mean atom position vector and **u** is the displacement vector from **r**. The basis vector lengths of the reciprocal axes are denoted as a^* , b^* and c^* or a^1 , a^2 and a^3 .

The crystallographic information file (CIF) format uses \mathbf{U} , while the Protein Data Bank (PDB) convention adopts \mathbf{U}^C (Grosse-Kunstleve & Adams, 2002). The \mathbf{U} and \mathbf{U}^C are identical only when the basis vectors are orthogonal to each other. ADPs can be visualized as Oak Ridge Thermal Ellipsoid Plot (*ORTEP*) ellipsoids, where the semi-axes are along the three eigenvectors of \mathbf{U} and the lengths are proportional to the corresponding eigenvalue of \mathbf{U} (Johnson, 1965). Details of the transformation between different ADP definitions are summarized in Appendix A (Section A1).

The following is the proposed procedure to obtain ADPs:

(1) Conduct MD simulations.

(2) Calculate \mathbf{U}^{C} for each atom from positions obtained from MD simulations.

(3) Average \mathbf{U}^{C} for atoms related by translational symmetry.

(4) If necessary, convert to **U**, change the basis vectors of some sites, then average **U** over sites with the same Wyckoff position.

(5) Convert to whatever ADP quantity that is convenient.

The ADPs are already standard deviations of numerous atom positions. Providing a standard deviation, often denoted using parentheses, of a standard deviation (calculated ADP) from a single simulation is mathematically not sound.

Suppose there are 1 million data points from a single MD simulation. The data points can be split into 10 sets with 100 000 data points, and the standard deviation of U obtained from 10 sets of 100 000 data points can be obtained. This standard deviation would be different from 100 sets of 10 000 data points. The standard deviation depends on how the data points are split, and thus it is not a well defined value. However, the U of the 1 million data points is the same as both the average U of 10 sets of 10 000 data points; thus the U obtained from all data points is a well defined value.

The averages and standard deviations of **U** over different runs with different atom orderings, and those of \mathbf{U}/T over different temperatures T are meaningful.

3. Methodology

3.1. MD procedure

MD simulations were conducted using the commercially available *Matlantis* package from Preferred Networks with their universal PreFerred Potential (PFP) (Takamoto *et al.*, 2022) version 7.0.0, a NNP trained on the Perdew–Burke– Ernzerhof (PBE) generalized gradient approximation (GGA) to density functional theory (DFT) (Perdew *et al.*, 1996). Diverse compounds consisting of any of all 96 elements lighter than Cm inclusive may be modeled using the same potential.

Adopting a potential model instead of first-principles calculations results in accumulation of atom positions at a pace that is orders of magnitude faster. Too much computational resource is necessary when using first-principles calculations to obtain a sufficient amount of atom position information for derivation of ADPs with reasonable precision. On the other hand, classical force fields or potentials are only available for a limited number of systems, and fine-tuning classical force fields or potentials for each crystal in consideration requires a high level of expertise. Additionally, much time is necessary for fitting and verification. Using an off-theshelf universal potential applicable to a wide variety of systems is a very practical approach, at least as a first attempt to newly explore a crystal. Various universal machine-learning NNPs have been proposed in recent years (Jacobs *et al.*, 2025). The PFP with the *Matlantis* package was chosen partly because it has a long history with continuous updates by dedicated researchers. The developers trained the potential on a proprietary data set exceeding 60 million configurations using the *VASP* code (Kresse & Furthmüller, 1996; Kresse & Joubert, 1999). It is not overfitted to a particular published data set such as the Materials Project. The PFP is available as a 'take it or leave it' potential; the user cannot modify it.

The canonical, or constant number of atoms, volume and temperature (NVT), ensemble was used with a Nosé–Hoover thermostat (Nosé, 1984; Hoover, 1985). The objective of this paper is to demonstrate direct derivation of ADPs from MD simulations using a reasonable energy and force calculator, and fine-tuning the NNP for individual compounds is outside the scope.

Structural and calculation details of the considered crystals are described below.

3.2. MgO simulations

The experimental ADPs of MgO were compared with theoretical values obtained using the proposed procedure. MgO takes the rocksalt structure with space-group type $Fm\overline{3}m$ (No. 225). The Mg and O occupy one Wyckoff position each (4*a* and 4*b*), both without variable parameters. The ADPs are isotropic.

The MgO conventional unit cell contains four Mg and four O atoms. The computational lattice parameter at 0 K is 4.2567 Å, which was used for MD simulations. Supercells of the conventional cell with sizes $3 \times 3 \times 3$, $4 \times 4 \times 4$, $5 \times 5 \times 5$, $6 \times 6 \times 6$ and $7 \times 7 \times 7$ were obtained and used.

The effect of the lattice expansion on the ADPs was also studied. The lattice parameter at 300 K is 0.15% larger than at 20–100 K, according to the experimental volume per mol data of White & Anderson (1966). Therefore, additional calculations were conducted on $5 \times 5 \times 5$ supercells where the lattice parameter was increased by 0.15%.

MD simulations were conducted with a time step of 2 fs, and the number of steps was 50000 (100 ps). Positions were recorded every 100 steps, but the positions for the first 10000 steps (20 ps, 100 position recordings, hereafter equilibration steps) were discarded to account for initial shifting of atoms to attain equilibration. The temperature T was varied between 50 and 500 K in 50 K intervals.

3.3. Ag₈SnSe₆ simulations

The unit cell of Ag_8SnSe_6 contains 30 atoms and its spacegroup type is $Pmn2_1$ (No. 31). The experimental lattice parameters at 300 K are a = 7.91440, b = 7.82954 and c =11.05912 Å, which were used for MD simulations. The Ag atoms rattle and are of interest in this study. There are five symmetrically different Ag sites. The Wyckoff positions of sites Ag1, Ag2 and Ag3 are 4b, and those of Ag4 and Ag5 are 2a (Takahashi *et al.*, 2024). $2 \times 2 \times 2$ and $3 \times 3 \times 3$ supercells were built for MD simulations of Ag₈SnSe₆. The time step was 2 fs, and the number of steps was 155000 and 60000, respectively (310 and 120 ps, respectively). Positions were recorded every 100 steps, but the positions for the first 20000 steps (40 ps, 200 position recordings) were discarded as equilibration steps. The number of Na position data is the same in the two calculations ($16 \times 2 \times 2 \times 2$ Ag atoms \times 1350 position recordings and $16 \times 3 \times 3 \times 3$ Ag atoms \times 400 position recordings). The temperature *T* was varied between 50 and 300 K in 50 K intervals.

The **U** for each Ag atom in a MD simulation was obtained by taking the (co)variances of atom positions from position recordings. The symmetrically equivalent coordinate triplets for 4*a* sites are (x, y, z), (-x + 1/2, -y, z + 1/2), (x + 1/2, -y, -z + 1/2) and (-x, y, z). The **U** for the second, third and fourth types of atoms can be transformed to **U** for the first type, which is reported in this paper, using a matrix **R** [equation (16)] which is a diagonal matrix with diagonal components (-1, -1, 1), (1, -1, 1) and (-1, 1, 1), respectively. For 2*a* sites with equivalent coordinate triplets (0, y, z)and (0, -y, z + 1/2), the diagonal matrix **R** of the latter has diagonal components (1, -1, 1). The final **U** value of each Wyckoff position of Ag was derived by averaging the **U**, for each atom, over all atoms in all simulations.

3.4. Na₂In₂Sn₄ simulations

The unit cell of Na₂In₂Sn₄ contains 16 atoms and its spacegroup type is $P2_12_12_1$ (No. 19). The experimental lattice parameters at 300 K are a = 6.3091, b = 6.5632 and c =11.3917 Å, which were used for MD simulations. There are four 4*a* sites, where one is fully occupied by Na and the other three are shared by In and Sn with a 1:2 ratio. Na has high anisotropy and rattles in this compound (Yamada *et al.*, 2023).

For Na₂In₂Sn₄, $4 \times 4 \times 2$ supercells were built containing 128 Na sites and 384 In/Sn sites. Ten supercells, where 128 In and 256 Sn atoms were randomly assigned to the 384 In/Sn sites, were built as initial structures. The time step was 2 fs, positions were recorded every 100 steps, and 55000 steps (110 ps, 500 position recordings) were considered. The first 5000 steps (10 ps, 50 position recordings) were discarded as equilibration steps. The temperature *T* was varied between 50 and 300 K in 50 K intervals.

The final **U** was obtained similarly as in Ag₈SnSe₆. The symmetrically equivalent coordinate triplets for 4*a* sites are (x, y, z), (-x + 1/2, -y, z + 1/2), (-x, y + 1/2, -z + 1/2) and (x + 1/2, -y + 1/2, -z). The **U** for the second, third and fourth types of atoms can be transformed to **U** for the first type, which is reported in this paper, using a matrix **R** [equation (16)] which is a diagonal matrix with diagonal components (-1, -1, 1), (-1, 1, -1), and (1, -1, -1), respectively.

3.5. BaCu_{1.14}In_{0.86}P₂ simulations

The unit cell of BaCu_{1.14}In_{0.86}P₂ contains 10 atoms and its space-group type is *I*4/*mmm* (No. 139). The experimental lattice parameters at 175 K are a = b = 4.0073 and c = 13.451 Å,

which were used for MD calculations. Cu and In share a 4*d* site and P occupies a 4*e* site. Ba mainly resides at the 2*a* site, but the Ba site is reported as triple-split: 82% of Ba is at the 2*a* site, while 18% of Ba are at a 4*e* site very close to the 2*a* site (at $z = \pm 0.02$ compared with z = 0 at the 2*a* site).

 $6 \times 6 \times 2$ supercells were used for MD simulations, which contain 144, 164, 124 and 288 Ba, Cu, In and P atoms, respectively, or 72(BaCu_{1.139}In_{0.861}P₂). Ten supercells were prepared as initial structures. The Cu and In atoms were randomly assigned to the 288 Cu/In sites. All Ba were initially positioned at the center of the triple-split sites, namely the 2*a* site, assuming that Ba can move to the 4*e* site, as necessary, during the initial equilibration steps. The time step was 2 fs, positions were recorded every 100 steps, and 55000 steps (110 ps, 500 position recordings) were considered. The first 5000 steps (10 ps, 50 position recordings) were discarded as equilibration steps. The temperature *T* was varied between 25 and 300 K in 25 K intervals.

The final **U** was obtained similarly as in Ag₈SnSe₆. The *I*4/*mmm* symmetry forces $U^{11} = U^{22}$ and $U^{23} = U^{13} = U^{12} = 0$, although this is not exactly attained with statistical handling of atom positions. The quantities $(U^{11} + U^{22})/2$ (simply denoted as U^{11} for brevity), U^{33} and the isotropic $U_{\rm iso} = (U^{11} + U^{22} + U^{33})/3$ were evaluated in this study.



Figure 2

ADP U_{iso} versus temperature T of (a) Mg and (b) O in MgO. The linear regressions pass through the origin. The dashed lines represent U_{iso} of the $5 \times 5 \times 5$ supercell corrected with the Einstein model. The Lp+0.15% points are from the $5 \times 5 \times 5$ supercell with the lattice parameter increased by 0.15% to account for the lattice expansion at 300 K.

3.6. Similarity of ADPs

An obvious way to discuss the similarities of isotropic ADPs is simply by comparing the U values. However, comparing anisotropic **U** with different principal axis directions is not straightforward, especially in degenerate cases where the principal axes can be taken differently (an extreme case is isotropic **U**).

According to Whitten & Spackman (2006), a measure of the overlap between probability density functions from two ADPs, U_1 and U_2 , is

$$R_{12} = \frac{2^{3/2} (\det \mathbf{U}_1^{-1} \mathbf{U}_2^{-1})^{1/4}}{\left[\det(\mathbf{U}_1^{-1} + \mathbf{U}_2^{-1})\right]^{1/2}}$$
(1)

and the similarity index is defined as

$$S_{12} = 100(1 - R_{12}). \tag{2}$$

For isotropic **U** with U_{iso1} and U_{iso2} ,

$$R_{12} = \left(\frac{2}{U_{\rm iso1} + U_{\rm iso2}}\sqrt{U_{\rm iso1}U_{\rm iso2}}\right)^{3/2},\tag{3}$$

which is the ratio of the geometric to arithmetic mean raised to the power of 3/2.

4. Results and discussion

The computational ADPs are those of individual atoms (ADP by atom) unless noted otherwise, while the experimental ADPs are as-reported values of ADP by site.

4.1. MgO

Fig. 2 shows the $U_{\rm iso}$ versus T for Mg and O (the subscript 'iso' is dropped for brevity hereon in this section). The lines are linear regressions of $U \propto T$, and this trend is found over all temperature ranges and for all supercells.

The convergence of U_{iso} with respect to sampling time may be judged by plotting the U_{iso} over certain time periods in a long MD run. There are 500 position recordings from the 50000 step (100 ps) MD simulations, and the 10 U_{iso} obtained from the 50(n - 1) + 1-th to 50n-th position recordings are plotted for $1 \le n \le 10$ in Fig. 3. The U_{iso} is converged when



Figure 3

 $U_{\rm iso}$ for MgO based on the 50(n-1) + 1-th to 50*n*-th position recordings within the 500 position recordings from a MD simulation.

the U_{iso} is roughly the same value over different *n*. The U_{iso} for n = 1 is clearly larger than those from other *n*, and the n = 1 and 2 results are discarded as 'still in equilibration and not converged with respect to sampling time'.

Fig. 4 plots U/T versus T. Ideally, the proportionality factor should be the same over the entire temperature and over all supercells with the same lattice parameters. U/T for $T \le 150$ K calculations tend to be larger than for $T \ge 200$ K calculations in supercells other than $3 \times 3 \times 3$; thus the U/T averaged over $T \ge 200$ K points are considered from now on. There is a 11% difference between U/T of $3 \times 3 \times 3$ and $7 \times 7 \times 7$ supercells for both Mg and O, while this difference decreases to 2% between $5 \times 5 \times 5$ and $7 \times 7 \times 7$ supercells for both Mg and O. Therefore, the $5 \times 5 \times 5$ supercell is reasonably converged with regard to size.

The standard deviation of U/T normalized by the average U/T over the seven points between 200 and 500 K is discussed next. With the exception of 5% for Mg and O in the $5 \times 5 \times 5$ supercell, the value is less than 3% for both Mg and O in the other four supercell sizes. Increasing the lattice parameter of the $5 \times 5 \times 5$ supercell by 0.15% results in a ~1% increase in the U/T; thus, considering thermal expansion does not result in a substantial difference in U, especially near room temperature.

Experimental determination of ADPs of both Mg and O is possible using XRD partly because their atomic numbers, Z, are close to each other (Z = 12 and 8 for Mg and O, respec-



Figure 4

ADP U_{iso} divided by temperature T versus T for (a) Mg and (b) O in MgO. The horizontal lines are the average value. The Lp+0.15% points are from the 5 × 5 × 5 supercell with the lattice parameter increased by 0.15% to account for the lattice expansion at 300 K. The horizontal lines for 6 × 6 × 6 and 5 × 5 × 5 Lp+0.15% almost overlap.

tively). The reported values of U from XRD or electron diffraction at room temperature are 0.0038–0.0040 and 0.0042–0.0046 Å² for Mg and O, respectively (Lawrence, 1973; Sasaki *et al.*, 1979; Tsirelson *et al.*, 1998).

The fitted values of 0.0037 and 0.0034 Å² for Mg and O, respectively, at 298 K with the $5 \times 5 \times 5$ supercell (the same value is obtained with or without lattice parameter expansion of 0.15%) slightly underestimate experimental values. However, applying a correction accounting for zero-point motion based on the Einstein model increases U to 0.0042 Å² for both Mg and O, with or without lattice parameter expansion (the correction is discussed in detail in Section 4.5). This



Figure 5

(a, b) Computational and (c) experimental **U** values of Ag₈InSe₆. The displayed quantities and their symbols are the same as experimental data [shown in (c)] by Yamada *et al.* (2023). Linear regressions pass through the origin. A point in (a) of Ag3 U_3 at 0.17 is not shown in this vertical scale.

Table 2	
U of Ag in Ag ₈ SnSe ₆ at 200 K from 3	\times 3 \times 3 supercell MD simulations.

The unit is $Å^2$.

	U^{11}	U^{22}	U^{33}	U^{23}	U^{13}	U^{12}	U_3	U_2	U_1	U_{3}/U_{1}	$U_{\rm iso}$
Ag1	0.024	0.023	0.029	0.008	0.006	0.010	0.041	0.022	0.013	3.2	0.025
Ag2	0.025	0.028	0.038	-0.004	0.006	-0.001	0.042	0.026	0.022	1.9	0.030
Ag3	0.041	0.065	0.047	0.004	-0.025	0.009	0.072	0.065	0.017	4.3	0.051
Ag4	0.031	0.028	0.019	-0.004	0.000	0.000	0.031	0.029	0.018	1.7	0.026
Ag5	0.037	0.023	0.013	0.005	0.000	0.000	0.037	0.025	0.012	3.2	0.025

corrected value for O is much closer to the experimental results.

4.2. Ag₈InSe₆

Figs. 5(*a*), 5(*b*) show the ADPs for Ag obtained from $2 \times 2 \times 2$ and $3 \times 3 \times 3$ supercells, respectively. The isotropic ADP (U_{iso}) is given for Ag2, Ag3 and Ag5 while the three eigenvalues of the ADP are provided, as $U_1 < U_2 < U_3$, to be consistent with Fig. 3 of Takahashi *et al.* (2024), which is reproduced as Fig. 5(*c*) with the same symbols and scales as in Figs. 5(*a*), 5(*b*). The $2 \times 2 \times 2$ and $3 \times 3 \times 3$ supercell results are very similar except for 300 K, suggesting good convergence, and have roughly the same values as the experimental results in Fig. 5(*c*). However, there are minor differences. Ag3 U_1 and U_2 approach 0 as temperature $T \rightarrow 0$ in calculations, but this is not the case in experiment.

The calculated $2 \times 2 \times 2$ supercell, $3 \times 3 \times 3$ supercell and experimental results in Fig. 5 show qualitatively similar trends, but the exact values can differ by more than 0.01 Å², which could be considered a very large value. Computational values can be refined by adding more data points by increasing the simulation time. The ADPs from the two supercells in Fig. 5 are different by less than 10% except for Ag3 U_3 at 300 K, and the systematic difference between calculations and experiments cannot be addressed by calculating more data points. Developing and/or using an energy and forces calculator other than PFP may result in a better agreement, but this is outside the scope of this study.

The principal semi-axis lengths of the ellipsoid, which are the three eigenvalues of the matrix **U**, help explain the shape of the ellipsoid. The calculated U values are $U_1 < U_2 << U_3$ and $U_1 \ll U_2 \ll U_3$ in Ag1 and Ag3, respectively, resulting in cigarlike (prolate) and saucer-like (oblate) ellipsoids, respectively, as expected from experimental results. The computational Ag ADPs at 300 K based on the $3 \times 3 \times 3$ supercell are shown in Fig. 1(b). The shapes of the Ag1 and Ag3 ellipsoids are consistent with the experimentally obtained ellipsoids in Fig. 1(a). The calculated Ag1 U_1 , Ag1 U_2 , Ag3 U_2 and Ag5 U_{iso} are proportional to temperature over the entire temperature range shown, as is indicated in the linear fit that passes through the origin in Figs. 5(a), 5(b). Other calculated U values appear to approach $\mathbf{U} \rightarrow 0$ in the limit $T \rightarrow 0$ with the clear exception of Ag3 U_3 . The Ag3 U_3 value for 50 K is surprisingly larger than the 100 K value in both $2 \times 2 \times 2$ and $3 \times 3 \times 3$ supercells.

The Ag1 and Ag3 sites are almost threefold trigonal planar coordinated. The experimental Ag–Se distances for Ag1 are 2.653, 2.659 and 2.707 Å, while those for Ag3 are 2.541, 2.687 and 2.774 Å. The chemical pressure from the very short Ag3–Se distance of 2.541 Å strongly motivates Ag to rattle in the direction out of the coordination plane (Takahashi *et al.*, 2024), which can effectively result in a split site. This rattling mechanism caused by 'retreat from stress' is found in tetrahedrites and tennantites (Cu,Zn)₁₂(Sb,As)₄S₁₃ (Suekuni *et al.*, 2018). The chemical pressure is much weaker for Ag1; thus Ag1 can be a non-split site while a similarly coordinated Ag3 may be a split site in the direction almost normal to the threefold coordination plane. Experimentally, none of U_1 , U_2 and U_3 of Ag3 approach $U \rightarrow 0$ in the limit $T \rightarrow 0$, which is also a hint of site splitting.

Fig. 6 is a schematic of a double-split site for qualitative discussion on the temperature (T) dependence of U by atom. The energy is proportional to T. At very low $T(T_1)$, the atom is trapped in one of the wells, resulting in a small U. The U is very large at higher $T(T_2)$ which allows atoms to move between the wells, for example by thermal fluctuation or tunneling, but is sufficiently low that atoms still reside in one of the wells. This is because the atom is typically located far from the average position between the wells. Further increasing T such that the atom is effectively in a single well (T_3) results in a substantial decrease in U because the atom can now be at the center of the well. Gradually increasing T (T_4) results in a gradually increasing U. The U by atom and U by site should be almost the same for $T > T_2$, but, at T_1 , the U by site is expected to be much larger than U by atom because atoms can occupy both wells of the site.



Schematic of atom distribution in a double-well potential.

Table 3

U values of Ag in Ag_8SnSe_6 at 300 K from $3 \times 3 \times 3$ supercell MD simulations.

The unit is $Å^2$.

	U^{11}	U^{22}	U^{33}	U^{23}	U^{13}	U^{12}	U_3	U_2	U_1	U_{3}/U_{1}	$U_{\rm iso}$
Ag1	0.042	0.040	0.053	0.015	0.013	0.019	0.076	0.037	0.022	3.5	0.045
Ag2	0.043	0.051	0.066	-0.014	0.003	0.002	0.075	0.046	0.040	1.9	0.053
Ag3	0.060	0.110	0.068	0.010	-0.034	0.014	0.114	0.098	0.026	4.3	0.080
Ag4	0.052	0.048	0.034	-0.008	0.000	-0.001	0.053	0.051	0.031	1.7	0.045
Ag5	0.065	0.038	0.022	0.007	0.000	-0.001	0.065	0.040	0.019	3.3	0.041



Figure 7

The eigenvalues of experimental (Yamada *et al.*, 2023) and calculated **U** of Na₂In₂Sn₄, of (*a*) Na and (*b*, *c*) In/Sn sites, shown with different symbols, plotted against temperature. (*c*) is an enlargement of (*b*) for small **U**. Experimental values are shown with black filled symbols and the linear regressions passing through the origin are shown with solid lines. Computational values are shown with empty symbols and the linear regressions in (*a*) passing through the origin for 50, 100 and 150 K points are shown with solid lines at T < 175 K and are extrapolated using dashed lines at T > 175 K.

Tables 2 and 3 show the elements of **U**, the eigenvalues U_1 , U_2 and U_3 , U_3/U_1 and U_{iso} for all Ag sites at 200 K and 300 K, respectively, from the $3 \times 3 \times 3$ supercell simulations. Takahashi et al. (2024) used anisotropic U for Ag1 and Ag3 because this dramatically improved the R_{wp} of experimental data at 300 K. Calculations can provide anisotropic U for all Ag simultaneously and independently without the need for repeated refinement attempts. The calculated value of a measure of anisotropy, U_3/U_1 , at 300 K is roughly 4 for Ag1, Ag3 and Ag5 (Table 3). The U_{iso} of Ag3 is roughly double that of Ag1 and Ag5, while the number of Ag5 atoms is half that of Ag1. Therefore, considering anisotropy of Ag5 might result in a smaller improvement of R_{wp} compared with Ag1 and Ag3. Ag2 and Ag4 are less anisotropic than Ag1, Ag3 and Ag5 because of their smaller U_3/U_1 ; thus using anisotropic U would not improve R_{wp} significantly. The trends are similar for both 200 K (Table 2) and 300 K (Table 3).

The convergence of **U** in the $3 \times 3 \times 3$ supercell simulation was checked by comparing the similarity index between **U** from position recordings 201 to 400 and 401 to 600 (the initial 200 are discarded). The similarity index was 0.02, 0.07, 0.06, 0.04 and 0.16 for Ag1 to Ag5, respectively. This is about one order of magnitude smaller than the similarity index for Ag1 and Ag3 between the experimental and calculated values (position recordings between 201 and 600), which are 0.67 and 0.43, respectively. Therefore, the **U** values are regarded as converged with respect to sampling time.

4.3. Na₂In₂Sn₄

Fig. 7 shows the eigenvalues of experimental (Yamada *et al.*, 2023) and calculated **U**, denoted as $U_1 < U_2 < U_3$, for Na and In/Sn1 sites. (U_{aniso_a} is used instead of U_3 in the original reference.) The results for In/Sn2 and In/Sn3 sites are very similar to those of the In/Sn1 sites and are not shown. The In and Sn **U** are calculated separately, although one **U** for In and Sn combined is obtained experimentally.

The experimental and computational U values of Na are comparable with each other, and U_3 of Na is significantly larger than U_1 and U_2 for all temperatures, implying an almost cigar-shaped spheroid [Fig. 7(*a*)]. The experimental U_1 , U_2 and U_3 are roughly proportional to T (linear regressions passing through the origin are shown as black lines). The calculated U is roughly the same as the experimental U, but the details are slightly different. All of U_1 , U_2 and U_3 are almost proportional to T up to about 150 K, but consistently become larger than the linear regression of 50, 100 and 150 K values that pass

Т	U^{11}	U^{22}	U^{33}	U^{23}	U^{13}	U^{12}
50	0.009	0.009	0.009	-0.004	-0.005	0.005
100	0.020	0.021	0.018	-0.009	-0.011	0.011
150	0.033	0.033	0.028	-0.015	-0.017	0.019
200	0.046 (0.055)	0.047 (0.051)	0.039 (0.048)	-0.021(-0.024)	-0.024(-0.033)	0.030 (0.036)
250	0.072 (0.072)	0.070 (0.065)	0.065 (0.061)	-0.029(0.049)	-0.036(-0.043)	0.037(-0.032)
300	0.092 (0.087)	0.088 (0.078)	0.094 (0.073)	-0.029(-0.040)	-0.051 (0.055)	0.034 (0.060)

Experimental values from Yamada *et al.* (2023) are shown in brackets. Units of T and U are K and Å², respectively.

through the origin (shown as red solid lines below 175 K, extrapolations to higher temperature shown with dashed lines above 175 K).

This deviation from proportionality in calculations is even more profound in In/Sn1 sites. The calculated U_3 of In1 is comparable with the U_3 of Na at 300 K, which is very different from the experimental results [Fig. 7(*b*)]. However, the experimental and computational **U** values are relatively close to each other at 50 and 100 K [Fig. 7(*c*), which is an enlargement of Fig. 7(*b*) at low **U**].

A large U value results in a large displacement from the equilibrium position. The standard deviation of the atom position, σ , is simply the square root of U. A U of 0.09 Å² along a certain direction corresponds to a σ of 0.3 Å. Assuming a normal distribution, the atom is more than $3\sigma = 0.9$ Å away from the average position for 0.3% of the time. This 0.9 Å is roughly one-third of the In/Sn–In/Sn bond length (~2.87 Å).

In the author's previous study on LaH_{2.75}O_{0.125} (Hinuma, 2025), the isotropic ADP of O, $U_{\rm iso}$ (denoted as $\langle \Delta r^2 \rangle$ in the reference), is roughly proportional to temperature below ~0.02 Å² but becomes much larger than what is expected from the proportionality trend above this threshold $U_{\rm iso}$ value. The $U_{\rm iso}$ of La is proportional up to ~0.03 Å², which covers the entire considered range of *T*. This LaH_{2.75}O_{0.125} is known as a



Figure 8

Calculated U values by atom for $BaCu_{1.14}In_{0.86}P_2$. The anisotropic U^{11} and U^{33} are given for Ba and Cu because of their large anisotropy, and isotropic U_{iso} is plotted for In and P with low anisotropy. The linear regressions in solid lines are not forced to pass through the origin. The range of ± 1 standard deviation of U over 10 calculations is shown.

very good H ion conductor. The H and O, together with vacancies, share the same sublattice in LaH_{2.75}O_{0.125}; thus O may easily move away from the original site after a very small displacement on the order of ~0.1 Å from the equilibrium position.

The mean square displacement (MSD) of an atom trapped near the equilibrium point becomes a constant regardless of time. This MSD is the ADP when the initial position of the atom is the equilibrium point. However, the MSD is proportional to time in a diffusing atom under Brownian motion, and the proportionality factor is two times the dimension times the diffusion coefficient. For very slowly moving atoms, the moving of some atoms away from the original equilibrium position can be detected but the diffusion coefficient cannot be derived with reasonable precision with a realistic simulation time. MD simulations find that In/Sn atoms can move away from the equilibrium point at above 175 K, based on MSD increasing with time and/or too large U values, and thereby the proposed algorithm concedes that it is not applicable in this material. Assigning atoms to the nearest site might be possible, for example by Gaussian mixture modeling or Voronoi tessellation, and atom sites must be correctly identified or provided explicitly.

Inspection of atom movements during MD simulations of $Na_2In_2Sn_4$ revealed significant displacements of atoms at $T \ge 200$ K. The increase in U above the proportionality trend in calculations, but not in experiment, is caused by the difference in how U is obtained. Experimentally, the displacement of atoms is the distance to the nearest atom site, and the same diffusing atom may be assigned to different sites as time progresses. In contrast, the displacement in calculations is always the distance to the original atom site. The calculated U overestimates the actual U when atoms can move away from the original site.

For the record, Table 4 shows calculated **U** values of Na together with reported experimental values at 200, 250 and 300 K (Yamada *et al.*, 2023). The calculated and experimental values for 200, 250 and 300 K are consistent with each other, although the sign is different in some off-diagonal **U** coefficients.

4.4. BaCu_{1.14}Cu_{0.86}P₂

Table 5 shows the calculated **U** of BaCu_{1.14}In_{0.86}P₂ at 175 K together with experimental results (Sarkar *et al.*, 2024*b*) at 173 K. In the reference, the same U_{iso} was provided for each

Table 5

U of BaCu_{1.14}In_{0.86}P₂ at 175 K (Sarkar et al., 2024b).

Values from MD simulations are shown together with experimental values from Sarkar *et al.* (2024*b*). U values corrected for the zero-point motion based on the Einstein model are also shown. In Sarkar *et al.* (2024*b*), the U_{iso} of Ba is the same for Ba1 and Ba11 sites and the ADP of Ba is not given, and only the combined ADP is provided for Cu/In sites. The Cu/In values from calculations, shown in brackets, are the 164:124 weighted averages based on the Cu/In atom ratio. The unit of U is 10^{-4} Å^2 .

	Calculated				Correct	Corrected				Experiment			
	U^{11}	U^{33}	U^{33}/U^{11}	$U_{\rm iso}$	U^{11}	U^{33}	U^{33}/U^{11}	$U_{\rm iso}$	U^{11}	U^{33}	U^{33}/U^{11}	Uiso	
Ва	77	101	1.31	85	80	104	1.31	88				103	
Cu	116	193	1.66	142	121	197	1.63	147					
In	65	71	1.09	67	68	74	1.08	70					
Cu/In	(94)	(140)	(1.49)	(110)	(99)	(144)	(1.46)	(114)	165	222	1.35	184	
Р	70	71	1.01	70	77	78	1.01	78	93	208	2.24	131	

Table 6

Mean average and standard deviation (std dev.) over 12 temperatures of U/T, by atom, of BaCu_{1.14}In_{0.86}P₂ as well as U_{lowT} and T_c based on the Einstein model.

The (standard deviation)/(mean average) over all considered temperatures was 4.6% or less for all of U^{11} , U^{33} and U_{iso} of all elements.

	Mean $(10^{-5} \text{ Å}^2 \text{ K}^{-1})$			Std dev. $(10^{-5} \text{ Å}^2 \text{ K}^{-1})$			$U_{\text{low}T} (10^{-4} \text{ Å}^2)$			$T_{\rm c}$ (K)		
	U^{11}	U^{33}	$U_{\rm iso}$	U^{11}	U^{33}	$U_{\rm iso}$	U^{11}	U^{33}	$U_{\rm iso}$	U^{11}	U^{33}	$U_{\rm iso}$
Ва	4.45	5.86	4.92	0.15	0.19	0.17	20	23	21	45	39	42
Cu	6.73	11.07	8.18	0.12	0.20	0.12	36	46	40	53	42	48
In	3.78	4.10	3.89	0.07	0.07	0.06	20	21	20	53	51	52
Ва	4.00	4.06	4.02	0.03	0.04	0.02	40	40	40	99	98	99

split Ba site, and anisotropic **U** was not given for Ba. Anisotropic **U** was provided for the Cu/In and P sites. Experimentally, the Cu/In site has the largest **U** and is moderately anisotropic with $U^{33}/U^{11} = 1.38$, while the **U** of P is very anisotropic with $U^{33}/U^{11} = 2.24$ and is slightly smaller than that of Cu/In. The calculations underestimate experimentally determined **U**. Notably, the calculated U^{33} of Cu/In and P are roughly one-half and one-third of the experimental U^{33} , respectively.

Fig. 8 shows the calculated anisotropic **U** of Ba and Cu and isotropic U_{iso} of In and P. The U_{iso} of In and P are almost the same value for all temperatures *T*. All atoms are in an almost harmonic potential, with the linear regressions passing very close to the origin although not required to do so. There were no migrating atoms. The ± 1 standard deviation over the 10 MD runs is shown. The standard deviation of Cu is large because of the large *U* value and relatively large (standard deviation)/(mean average) ratio.

Assuming $U \propto T$ over the temperature range, the (standard deviation)/(mean average) over all considered temperatures was 4.6% or less for all of U^{11} , U^{33} and $U_{\rm iso}$ of all elements (the mean averages and standard deviations are given in Table 6). The correction to **U** from zero-point motion based on the Einstein model [details in Appendix A (Section A2), $U_{\rm lowT}$ and $T_{\rm c}$ in equations (29) and (30), respectively] was calculated. The correction is at most 11% for P and 4% within other elements. The corrected **U** is given in Table 5.

The difference in **U** between experiment and calculations in Table 5 arises from how the values were derived. The experimental ADPs are by site, while the calculated ADPs in Table 5 and Fig. 8 are the averages of ADPs by atom. Therefore, the U^{33} by site was additionally derived using a histogram of *z* coordinates. Atoms with coordinates outside of

-0.1 < z < 0.4 were translated to this range in integer multiples of 0.5; note that BaCu_{1.14}In_{0.86}P₂ is a body-centered crystal.

Figs. 9(a)-9(d) show the histograms for Ba, Cu, In and P, respectively, for T = 50, 175 and 300 K. The bin size of the z coordinate is 0.001. There are 144 atoms \times 500 position recordings \times 10 supercells = 720000 total positions for Ba. Only the $z \simeq 0.14$ peak is shown for P (there is another peak at $z \simeq -0.14$, which is a mirror image around z = 0, that is not shown). The normal distribution regressions and their standard deviations are also given, which can be used to obtain the ADP by site. The histogram for Cu in Fig. 9(b) cannot be described well by a single normal distribution.

The curve for Ba has a single peak, and the experimentally suggested triple-well scenario with small peaks at $\Delta z = \pm 0.02$ (Sarkar *et al.*, 2024*b*) is clearly denied. In contrast, Cu, but not In, shows a triple peak with additional peaks at $\Delta z \simeq \pm 0.025$. Figs. 9(*e*), 9(*f*) show the histograms of Cu and Cu/In combined, respectively, for T = 50 and 175 K and the regressions

$$y = A \left\{ p \exp\left[-\frac{(z - 0.25)^2}{2\sigma^2}\right] + \frac{1 - p}{2} \exp\left[-\frac{(z - 0.25 - \Delta z)^2}{2\sigma^2}\right] + \frac{1 - p}{2} \exp\left[-\frac{(z - 0.25 + \Delta z)^2}{2\sigma^2}\right] \right\}.$$
 (4)

The values to be fitted are a scaling constant A, the occupancy ratio of the main peak p, the standard deviation of the peaks σ and the position of the additional peaks Δz . Equation (4) provides a very good fit, and the parameters used in fitting are given in Table 7. Very interestingly, the p for Cu/In at 175 K is 0.811, which is the experimental occupancy of the

Table 7Parameters used to fit curves in Figs. 9(e), 9(f) using equation (4).

Elements	T (K)	$A (10^3)$	р	σ	Δz
Cu	175	28.4	0.66	0.0115	0.0257
Cu	50	35.1	0.63	0.0092	0.0257
Cu/In	175	56.3	0.81	0.0101	0.0264
Cu/In	50	67.4	0.79	0.0084	0.0257

main peak of Ba. The Δz of Ba in the experiment is 0.021, while the Δz of Cu/In in the calculation is a very similar value of 0.026.

Fig. 10 plots the calculated U^{33} ADP by atom and by site. The site ADP is obtained as $U^{33}_{\text{site}} = c^2 \sigma^2$ where c is the lattice parameter and σ is the standard deviation of the histogram. The ADP was obtained for Cu only, In only, and Cu/In combined for the 4*d* site. A single normal distribution and a superposition of three normal distributions with the same σ as in equation (4), which models a triple-split site, were calculated with Cu and Cu/In sites.

In Fig. 10, all shown U^{33} are well described with linear fits. There is no contribution to U except for the zero-point motion that is not reflected in the calculations. The non-zero U^{33} by site but zero U^{33} by atom at $T \rightarrow 0$ implies a significant contribution to U by site from disorder of Cu/In sites, which causes atoms to move away from the average atom sites defined as points. This is in addition to any contributions from zero-point motion that is not reflected in the calculations.

The single-crystal XRD data of Sarkar *et al.* (2024*a*) [Cambridge Crystallographic Data Centre (CCDC) No. 2285845] were re-refined using a model suggested by ADP



Figure 9

Distribution of z coordinates of (a) Ba, (b, e) Cu, (c) In, (d) P and (f) Cu+In combined in BaCu_{1.14}In_{0.86}P₂ derived from the atom positions obtained from MD simulations. The atom positions were binned with 0.001 intervals of z. The points are fitted to (a-d) normal distributions (solid lines) and (e, f) superposition of three normal distributions in equation (4). The standard deviation σ of the distributions is shown in (a-d).

calculations, which has a triple-split Cu site and no splitting in Ba, In and P sites. The results are summarized in Table 8. The $R_1 [I > 2\sigma(I)]$ and R_1 (all data) of the re-refinement are 0.0298 and 0.0318, which are better than 0.031 and 0.033, respectively, in the original reference (Sarkar *et al.*, 2024*b*). However, the ADPs in the re-refinement are not consistent with the calculated values in Table 5.

4.5. Behavior of U at $T \rightarrow 0$

The Einstein model is considered first, where atoms are each isolated in a harmonic potential and the atoms do not explicitly interact with each other. The relation $U \propto T$ holds between an ADP component U and temperature T at sufficiently high temperatures. On the other hand, U converges to a non-zero value, U_{lowT} , at very low temperatures where the zero-point motion cannot be ignored. A crossover temperature T_c is defined, which is the T corresponding to U_{lowT} assuming that the $U \propto T$ relation holds down to 0 K. This T_c can be obtained once a combination of U and T in the $U \propto T$ regime is obtained. [See Appendix A (Section A2) for the mathematical details for this section.] Using the U/T proportionality factor is preferred, if available, instead of a single combination.

Experimental results of U_3 for In in Na₂In₂Sn₄ are proportional to temperature down to 90 K [see Fig. 4(*b*) of Yamada *et al.* (2023)]. Using values of $U_3 = 0.15 \text{ Å}^2$ at 250 K in the figure, $U_{\text{low}T} = 0.008 \text{ Å}^2$ and $T_c = 13$ K. Therefore, effects from the zero-point motion are not relevant in the temperature range studied in this system.

The heat capacity C in the Einstein model is not proportional to T^3 at $T \rightarrow 0$, although experimentally $C \propto T^3$ is often found. In contrast, the Debye model gives $C \propto T^3$ at $T \rightarrow 0$. In the Debye model, the U at $T \rightarrow 0$ converges to a non-zero U value, $U_{\text{low}T_{\text{-}}\text{D}}$, and $U \propto T$ at sufficiently high temperature, as in the Einstein model. The crossover temperature $T_{c_{\text{-}}\text{D}}$ can be defined similarly, which is 1/4 of the Debye temperature in the



Figure 10

Calculated U^{33} per atom (empty symbols) and by site (filled symbols) in BaCu_{1.14}In_{0.86}P₂. The U^{33} by site is the variance of the normal distribution fit as in Fig. 8. The variance from fitting of three superposed normal distributions with the same valences is shown for Cu and Cu/In sites (triangular symbols for 'split' sites).

Table 8

Re-refinement of single-crystal XRD data of $BaCu_{1.14}In_{0.86}P_2$ (Sarkar *et al.*, 2024*b*) based on a model suggested from MD simulations.

Lattice parameters are a = b = 4.0773 (4) and c = 13.451 (2) Å, 'Occ.' is the site-occupancy factor.

	x	у	z	Occ.	U^{11} (Å ²)	U^{33} (Å ²)
Ba1	0	0	0.0	1	0.0106 (3)	0.0222 (5)
Cu1	0.5	0	0.25	0.381 (14)	0.0163 (4)	0.0123 (12)
Cu2	0.5	0	0.2720 (17)	0.096 (7)	0.0163 (4)	0.0123 (12)
In1	0.5	0	0.25	0.427	0.0163 (4)	0.0123 (12)
P1	0.5	0.5	-0.1330(2)	1	0.0093 (7)	0.0210 (12)

simplest approximation. The $U_{\text{low}T_D}$ and T_{c_D} are $\sqrt{3}/2 \approx 87\%$ smaller than $U_{\text{low}T}$ and T_c , respectively.

The Einstein and Debye models are totally different assumptions on atom vibrations in the crystal. Different atoms can have different characteristic frequencies in different directions in the Einstein model, while there is only one Debye temperature in a crystal.

An elastic neutron scattering study reports the Debye temperature of MgO as 743 ± 8 K (Beg, 1976), corresponding to $T_{c_D} = 186$ K. The corresponding Einstein model crossover temperature, T_c , would be roughly 214 K. The *U* based on the Einstein model and the $U \propto T$ proportionality factor of the $5 \times 5 \times 5$ supercell model are shown as blue dashed lines in Fig. 2. The T_c for Mg and O are 187 and 244 K, respectively, which are close to the 214 K inferred from the experimental Debye temperature.

From another perspective, the NNP MD simulations in this study can clearly identify whether the experimental non-zero U at $T \rightarrow 0$ is solely the consequence of zero-point motion in an Einstein model or whether there are contributions from something else, such as configurational disorder or a split site. Therefore, ADPs estimated from NNP MD act as a probe to complement experimental observations.

Why does the $U \propto T$ proportionality persist at very low *T* in the NNP MD simulations, but not in experiment? This paradox can be resolved easily. The NNP MD is based on classical dynamics although the parameters are fitted to non-classical DFT, and there is no zero-point motion in classical dynamics.

The author raises an open question. Is it ever possible for a classical MD to give a non-zero ADP at $T \rightarrow 0$ in systems where atoms are in a harmonic potential, such as in MgO?

5. Summary

The anisotropic ADPs by atom were directly derived from MD simulations taking the (co)variances over atom positions at different time steps. A universal machine-learned NNP was used to accelerate the calculations. The proposed method is applicable to systems with substitutional disorder and split sites, unlike with conventional methods using the dynamical matrix from phonon modes calculated at 0 K. The ADPs can be obtained by atom, where the (co)variance of each atom is obtained and then averaged for atoms in an atom site, or by site, where the (co)variance is calculated over all atoms at the

atom site. The zero-point motion is not reflected in an ADP from classical MD simulations, but it can be estimated by extrapolation assuming an Einstein model using the proportionality factor between the ADP and temperature, if proportionality holds. The proposed method gives ADPs of MgO that are consistent with experimental values. The experimentally obtained shapes of anisotropic displacement ellipsoids of rattling atoms in thermoelectric materials Ag₈SnSe₆ and Na₂In₂Sn₄ are consistent with calculated results. The possibility of splitting of the Ag3 site of Ag₈SnSe₆ can be detected through calculation of the ADP over different temperatures. Migration of atoms was found in Na₂In₂Sn₄ at $T \ge 200$ K, resulting in a very large ADP by atom that disagrees with the experimentally obtained, much smaller ADPs by atom site. The ADPs by atom and by site are clearly different in the thermoelectric material BaCu_{1.14}In_{0.86}P₂, which is caused by disorder in the shared Cu/In site. The nonzero ADPs by site at $T \rightarrow 0$ in BaCu_{1.14}In_{0.86}P₂ are a good reason why ADPs should not be referred to as 'temperature factors' or 'thermal ellipsoids' because there are contributions to the 0 K ADPs from disorder of Cu/In atoms other than the zero-point motion. The investigations in this study suggest the effectiveness and limitations of direct ADP derivation from MD simulations and the use of calculated ADPs as a tool complementing experimental efforts to determine the crystal structure including atom displacement around atom sites.

APPENDIX A

Mathematical details

A1. Relations between different ADP definitions

The **U**, $\boldsymbol{\beta}$ and **B** are related by [equation (38) of Trueblood *et al.* (1996)]

$$U^{jl} = \beta^{jl} / (2\pi^2 a^j a^l) = B^{jl} / 8\pi^2.$$
 (5)

Using a scaling matrix

$$\mathbf{S} = \begin{pmatrix} a^* & 0 & 0\\ 0 & b^* & 0\\ 0 & 0 & c^* \end{pmatrix},\tag{6}$$

$$\boldsymbol{\beta} = 2\pi^2 \mathbf{SUS}.$$
 (7)

The Debye-Waller factor for a diffraction vector

$$\mathbf{h} = \sum_{i=1}^{3} h_i \mathbf{a}^i = \sum_{i=1}^{3} h_i^C \mathbf{e}_i, \tag{8}$$

which is a row vector in reciprocal space, is

$$T(\mathbf{h}) = \exp\left(-\sum_{j=1}^{3} \sum_{l=1}^{3} h_{j}\beta^{jl}h_{l}\right)$$

= $\exp\left(-2\pi^{2} \sum_{j=1}^{3} \sum_{l=1}^{3} h_{j}a^{j}U^{jl}a^{l}h_{l}\right)$
= $\exp\left(-2\pi^{2} \sum_{j=1}^{3} \sum_{l=1}^{3} h_{j}^{C}U_{jl}^{C}h_{l}^{C}\right)$ (9)

[from equations (21), (24), (34) and (36) of Trueblood *et al.* (1996)]. Here, $(\mathbf{e}_1, \mathbf{e}_2, \mathbf{e}_3)$ is an orthonormal basis.

One transformation matrix between the bases $(\mathbf{a}, \mathbf{b}, \mathbf{c})$ and $(\mathbf{e}_1, \mathbf{e}_2, \mathbf{e}_3)$ is [equation (50) of Trueblood *et al.* (1996)]

$$\mathbf{A} = \begin{pmatrix} a & b\cos\gamma & c\cos\beta\\ 0 & b\sin\beta & -c\sin\beta\cos\alpha^*\\ 0 & 0 & 1/c^* \end{pmatrix}.$$
 (10)

Coordinates of vector **r** in bases (**a**, **b**, **c**), $(a^*$ **a**, b^* **b**, c^* **c**) and (**e**₁, **e**₂, **e**₃), which are denoted as (*x*, *y*, *z*), (ξ , η , ζ) and (ξ^C , η^C , ζ^C), respectively, transform as

$$\left(\xi^{C}, \eta^{C}, \zeta^{C}\right)^{\mathrm{T}} = \mathbf{A}(x, y, z)^{\mathrm{T}}$$
(11)

[based on equation (41) of Trueblood et al. (1996)] and

$$\left(\xi^{C}, \eta^{C}, \zeta^{C}\right)^{\mathrm{T}} = \mathbf{AS}\left(\xi, \eta, \zeta\right)^{\mathrm{T}}$$
(12)

[based on equations (46)-(48) of Trueblood *et al.* (1996)]. Matrix

$$\mathbf{D} = \mathbf{AS} \tag{13}$$

was used by Trueblood et al. (1996).

The transformation between **U** with the basis $(a^*\mathbf{a}, b^*\mathbf{b}, c^*\mathbf{c})$ and **U**^C with the orthonormal basis $(\mathbf{e}_1, \mathbf{e}_2, \mathbf{e}_3)$ is

$$\mathbf{U}^{C} = \mathbf{A}\mathbf{S}\mathbf{U}\mathbf{S}\mathbf{A}^{\mathrm{T}} = \mathbf{D}\mathbf{U}\mathbf{D}^{\mathrm{T}}$$
(14)

[based on equation (49) of Trueblood et al. (1996)].

The ADPs of an atom are often visualized as an ellipsoid. The principal semi-axes of the ellipsoid are simply the three eigenvalues of \mathbf{U}^{C} , and the directions of the semi-axes are those of the eigenvectors. The matrix of three eigenvectors \mathbf{P} and the diagonal matrix with three corresponding eigenvalues \mathbf{Q} are obtained as

$$\mathbf{P}^{-1}\mathbf{U}^C\mathbf{P} = \mathbf{Q}.$$
 (15)

The eigenvectors in the bases (**a**, **b**, **c**) and $(a^*\mathbf{a}, b^*\mathbf{b}, c^*\mathbf{c})$ are derived with equations (10) and (11), respectively. Alternatively, principal component analysis may be used to obtain the eigenvalues and eigenvectors of \mathbf{U}^C .

The conversion of **U** between two atoms with the same Wyckoff position, p and q, is given below. Let the mean positions of the two atoms p and q, $\mathbf{r} = (x, y, z)^{T}$ and $\mathbf{r}' = (x', y', z')^{T}$, be related as

$$\mathbf{r}' = \mathbf{R}\mathbf{r} + \mathbf{t},\tag{16}$$

where **R** is a rotation matrix and **t** is a translation vector. The relation between displacement vectors $\mathbf{u} = (\Delta x, \Delta y, \Delta z)^{\mathrm{T}}$ and $\mathbf{u}' = (\Delta x', \Delta y', \Delta z')^{\mathrm{T}}$ is

$$\mathbf{u}' = \mathbf{R}\mathbf{u}.\tag{17}$$

The goal here is to change the basis vectors defining \mathbf{U}' such that the transformed quantity \mathbf{U}'' is directly comparable with \mathbf{U} , which is accomplished by

$$\mathbf{U}'' = (\mathbf{R}^{-1})\mathbf{U}'(\mathbf{R}^{-1})^{\mathrm{T}}.$$
 (18)

This transformation is useful to increase the number of atoms with \mathbf{U} values that can be easily averaged, thereby improving the reliability of results. The average \mathbf{U} and \mathbf{U}^{C} of

research papers

atoms that are directly comparable is simply the mean of \mathbf{U} and \mathbf{U}^{C} of the atoms, respectively.

A2. Temperature dependence of the ADP in Einstein and Debye models

The ADP in the Einstein model is discussed first. A 1D harmonic potential is considered with the standard Hamiltonian

$$\hat{H} = \left(-\frac{\hbar^2}{2m}\frac{\mathrm{d}^2}{\mathrm{d}x^2} + \frac{m\omega^2}{2}x^2\right),\tag{19}$$

where x is the position, m is the particle mass and ω is the characteristic angular frequency. An atom is placed in this potential. Although this potential does not have terms describing explicit interactions with other atoms, this potential reflects the interactions between atoms.

The eigenvalues of this potential are

$$E_n = (n+1/2)\hbar\omega, \tag{20}$$

where n are non-negative integers. The corresponding variance of the position, which is also the same as the ADP, U, is

$$U_n = \left\langle x^2 \right\rangle = \frac{E_n}{m\omega^2}.$$
 (21)

In the classical limit of continuous E_n , and when the equipartition theorem holds,

$$U = \langle x^2 \rangle \propto E \propto T.$$
⁽²²⁾

The partition function of the eigenvalues in equation (17) is

$$Z = \sum_{n=0}^{\infty} \exp\left(-\frac{E_n}{kT}\right) = \left[2\sinh\left(\frac{\hbar\omega}{2kT}\right)\right]^{-1}$$
(23)

and U for a certain T is

$$U = Z^{-1} \sum_{n=0}^{\infty} U_n \exp\left(-\frac{E_n}{kT}\right) = \frac{\hbar}{2m\omega} \coth\left(\frac{\hbar\omega}{2kT}\right).$$
(24)

The limits of U at $kT \gg \hbar\omega$ and $kT \ll \hbar\omega$ are

$$U_{\text{low}T} = \frac{\hbar}{2m\omega} \tag{25}$$

and

$$U_{\text{high}T} = \frac{kT}{m\omega^2} = U_{\text{low}T} \frac{T}{T_{\text{c}}},$$
(26)

respectively, using a crossover temperature where $U_{\text{low}T} = U_{\text{high}T}$, namely

$$T_{\rm c} = \frac{\hbar\omega}{2k}.$$
 (27)

When a set of U and T in the $U \propto T$ regime, (U_1, T_1) , is known,

$$\omega = \sqrt{\frac{kT_1}{mU_1}},\tag{28}$$

resulting in

$$U_{\text{low}T} = \frac{\hbar}{2} \sqrt{\frac{U_1}{mkT_1}} = 3.4824 \sqrt{\frac{U_1}{mT_1}}$$
(29)

$$T_{\rm c} = \frac{\hbar}{2} \sqrt{\frac{T_1}{mkU_1}} = 3.4824 \sqrt{\frac{T_1}{mU_1}}$$
(30)

and

$$U = U_{\text{low}T} \coth(T_{\text{c}}/T).$$
(31)

The crossover temperature tends to be higher in light atoms with small U/T atoms. Atoms with smaller U are more tightly bound to the equilibrium point.

The rightmost term in equations (29) and (30) is when units of daltons for mass, K for temperature and Å² for U are used. The proportionality factor between U and T may be used instead of U_1/T_1 if this can be obtained from fitting.

The correction factor to U arising from the zero-point motion may be written as

$$\frac{U - U_{\text{high}T}}{U_{\text{high}T}} = \frac{T_{\text{c}}}{T} \operatorname{coth}\left(\frac{T_{\text{c}}}{T}\right) - 1.$$
(32)

The function $f(x) = \operatorname{coth}(1/x)/x - 1$ converges relatively slowly to 0 when *x* is increased. Its value when x = 1, 2, 3, 4, 5, 6and 10 is 0.313, 0.082, 0.037, 0.021, 0.013, 0.019 and 0.003, respectively. In other words, the correction factor is 30%, 10%, 3% and 1% when T/T_c is 1.023, 1.81, 3.3 and 5.8, respectively.

The Debye model is considered next. The simplest model of a 3D crystal is considered with one atom per unit cell, degenerate acoustic branches, and polarization vectors forming an orthonormal tern is considered (Grosso & Parravicini, 2014). The U from the Debye model along a certain direction is, using a Debye temperature $T_{\rm D}$,

$$U_{\rm D} = 3 \frac{\hbar^2 T^2}{mk T_{\rm D}^3} \int_{0}^{T_{\rm D}/T} \left(\frac{1}{e^x - 1} + \frac{1}{2}\right) x \, \mathrm{d}x.$$
(33)

The low- and high-temperature approximations are

$$U_{\mathrm{D_low}T} = \frac{3}{4} \frac{\hbar^2}{mkT_{\mathrm{D}}}$$
(34)

and

$$U_{\mathrm{D_high}T} = 3 \frac{\hbar^2 T}{mkT_{\mathrm{D}}^2},\tag{35}$$

respectively. The crossover temperature where $U_{D_lowT} = U_{D_highT}$ is

$$T_{\rm D_c} = T_{\rm D}/4.$$
 (36)

The $U_{D_{lowT}}$ can be obtained from a set of U and T in the $U \propto T$ regime, (U_1, T_1) , as

$$U_{\text{D_low}T} = \frac{\hbar}{4} \sqrt{\frac{3U_1}{mkT_1}} = 3.0159 \sqrt{\frac{U_1}{mT_1}}.$$
 (37)

The rightmost term is when units of daltons for mass, K for temperature and \AA^2 for U are used. According to equations (30) and (37),

$$U_{\text{D}_\text{low}T} = \left(\sqrt{3}/2\right) U_{\text{low}T}$$
(38)

and

$$T_{\mathrm{D}_{\mathrm{c}}} = \left(\sqrt{3}/2\right) T_{\mathrm{c}}.$$
(39)

Note that the $U_{D_{lowT}}$ must be the same for all atoms and all directions in this simplest Debye model.

Acknowledgements

The author acknowledges Dr Naoya Ishida (AIST) for rerefinement of the published single-crystal diffraction data of BaCu_{1.14}In_{0.86}P₂ (CCDC No. 2285845) (Sarkar *et al.*, 2024*a*) based on the suggested computational model. The author also thanks Dr Eiji Nishibori for sharing experimental ADPs for Ag₈SnSe₆ used by Yamada *et al.* (2023), which were used to draw Figs. 1(*a*) and 5(*c*) in this paper. The *VESTA* code (Momma & Izumi, 2011) was used to draw Fig. 1.

Funding information

This study was funded by a Kakenhi Grant-in-Aid (No. 24H00395) from the Japan Society for the Promotion of Science (JSPS).

References

- Beg, M. M. (1976). Acta Cryst. A32, 154-156.
- Erba, A., Ferrabone, M., Orlando, R. & Dovesi, R. (2013). J. Comput. Chem. 34, 346–354.
- Grosse-Kunstleve, R. W. & Adams, P. D. (2002). J. Appl. Cryst. 35, 477–480.
- Grosso, G. & Parravicini, G. P. (2014). Editors. *Solid state physics*, 2nd ed., pp. 391–436. Amsterdam: Academic Press.
- Hinuma, Y. (2025). Comput. Mater. Sci. 246, 113368.
- Hoover, W. G. (1985). Phys. Rev. A 31, 1695-1697.
- Iversen, B. B., Larsen, F. K., Figgis, B. N., Reynolds, P. A. & Schultz, A. J. (1996). Acta Cryst. B52, 923–931.
- Jacobs, R., Morgan, D., Attarian, S., Meng, J., Shen, C., Wu, Z., Xie, C. Y., Yang, J. H., Artrith, N., Blaiszik, B., Ceder, G., Choudhary, K., Csanyi, G., Cubuk, E. D., Deng, B., Drautz, R., Fu, X., Godwin, J., Honavar, V., Isayev, O., Johansson, A., Kozinsky, B., Martiniani, S., Ong, S. P., Poltavsky, I., Schmidt, K. J., Takamoto, S., Thompson,

A. P., Westermayr, J. & Wood, B. M. (2025). Curr. Opin. Solid State Mater. Sci. 35, 101214.

- Johnson, C. K. (1965). ORTEP: a Fortran thermal-ellipsoid plot program for crystal structure illustrations. ORNL-3794. Oak Ridge National Laboratory, USA.
- Kresse, G. & Furthmüller, J. (1996). Phys. Rev. B 54, 11169–11186.
- Kresse, G. & Joubert, D. (1999). Phys. Rev. B 59, 1758-1775.
- Lane, N. J., Vogel, S. C., Hug, G., Togo, A., Chaput, L., Hultman, L. & Barsoum, M. W. (2012). *Phys. Rev. B* **86**, 214301.
- Lawrence, J. L. (1973). Acta Cryst. A29, 94-95.
- Madsen, A. Ø., Civalleri, B., Ferrabone, M., Pascale, F. & Erba, A. (2013). Acta Cryst. A69, 309–321.
- Momma, K. & Izumi, F. (2011). J. Appl. Cryst. 44, 1272-1276.
- Nosé, S. (1984). J. Chem. Phys. 81, 511-519.
- Perdew, J. P., Burke, K. & Ernzerhof, M. (1996). Phys. Rev. Lett. 77, 3865–3868.
- Reilly, A. M., Wann, D. A., Gutmann, M. J., Jura, M., Morrison, C. A. & Rankin, D. W. H. (2013). J. Appl. Cryst. 46, 656–662.
- Reilly, A. M., Wann, D. A., Morrison, C. A. & Rankin, D. W. H. (2007). Chem. Phys. Lett. 448, 61–64.
- Sarkar, A., Porter, A. P., Viswanathan, G., Yox, P., Earnest, R. A., Wang, J., Rossini, A. J. & Kovnir, K. (2024a). CCDC No. 2285845 experimental crystal structure determination, https://doi.org/ 10.1039/d4ta01063a.
- Sarkar, A., Porter, A. P., Viswanathan, G., Yox, P., Earnest, R. A., Wang, J., Rossini, A. J. & Kovnir, K. (2024b). J. Mater. Chem. A 12, 10481–10493.
- Sasaki, S., Fujino, K. & Takéuchi, Y. (1979). Proc. Jpn. Acad. Ser. B 55, 43–48.
- Suekuni, K., Lee, C. H., Tanaka, H. I., Nishibori, E., Nakamura, A., Kasai, H., Mori, H., Usui, H., Ochi, M., Hasegawa, T., Nakamura, M., Ohira-Kawamura, S., Kikuchi, T., Kaneko, K., Nishiate, H., Hashikuni, K., Kosaka, Y., Kuroki, K. & Takabatake, T. (2018). *Adv. Mater.* **30**, 1706230.
- Takahashi, S., Kasai, H., Liu, C., Miao, L. & Nishibori, E. (2024). *Cryst. Growth Des.* **24**, 6267–6274.
- Takamoto, S., Shinagawa, C., Motoki, D., Nakago, K., Li, W., Kurata, I., Watanabe, T., Yayama, Y., Iriguchi, H., Asano, Y., Onodera, T., Ishii, T., Kudo, T., Ono, H., Sawada, R., Ishitani, R., Ong, M., Yamaguchi, T., Kataoka, T., Hayashi, A., Charoenphakdee, N. & Ibuka, T. (2022). *Nat. Commun.* 13, 2991.
- Trueblood, K. N., Bürgi, H.-B., Burzlaff, H., Dunitz, J. D., Gramaccioli, C. M., Schulz, H. H., Shmueli, U. & Abrahams, S. C. (1996). *Acta Cryst.* A**52**, 770–781.
- Tsirelson, V. G., Avilov, A. S., Abramov, Yu. A., Belokoneva, E. L., Kitaneh, R. & Feil, D. (1998). Acta Cryst. B54, 8–17.
- White, G. K. & Anderson, O. L. (1966). J. Appl. Phys. 37, 430-432.
- Whitten, A. E. & Spackman, M. A. (2006). Acta Cryst. B62, 875-888.
- Willis, B. T. M. & Pryor, A. W. (1975). *Thermal vibrations in crystallography*. London: Cambridge University Press.
- Yamada, T., Yoshiya, M., Kanno, M., Takatsu, H., Ikeda, T., Nagai, H., Yamane, H. & Kageyama, H. (2023). *Adv. Mater.* **35**, 2207646.