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# **ADVANCED MATERIALS**

### Supporting Information

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Charge-Induced Disorder Controls the Thermal Conductivity of Entropy-Stabilized Oxides

Jeffrey L. Braun, Christina M. Rost, Mina Lim, Ashutosh Giri, David H. Olson, George N. Kotsonis, Gheorghe Stan, Donald W. Brenner, Jon-Paul Maria, and Patrick E. Hopkins\*

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#### 1. MODELING THE THERMAL CONDUCTIVITY

#### A. Theory

Derived from the Boltzman transport equation under the relaxation time approximation,<sup>[1-4]</sup> the thermal conductivity is  $\kappa = \frac{1}{3} \sum_{j} \int C_{j}(\omega) v_{j}^{2}(\omega) \tau_{j}(\omega) d\omega$ , where *C* is mode specific heat capacity,  $\omega$  is phonon angular frequency,  $\nu$  is phonon group velocity,  $\tau$  is phonon relaxation time, and *j* denotes phonon polarization. Intrinsic scattering processes involve phonon-phonon scattering, which include momentum conserving Normal and momentum destroying Umklapp processes ( $\propto \omega^2$ ), and Rayleigh scattering from mass and strain impurities resulting from, for example, natural isotopes and point defects ( $\propto \omega^4$ ). Extrinsic boundary scattering can result from sample dimensions being on the order of phonon mean free paths; for a thin film this takes the form  $\tau_h = 2v_i/d$ , where d is the film thickness. For random alloys and solid solutions, Abeles developed the virtual crystal approximation (VCA),<sup>[5]</sup> whereby a random alloy is treated as an effective crystal possessing the compositionally- weighted average properties (sound speed, mass, atomic radii, dispersion, intrinsic scattering rates) of the elements or compounds constituting the virtual crystal; additional phonon scattering results from differences in constituent and virtual crystal properties. In general, these Rayleigh scattering mechanisms are derived from perturbation theory,<sup>[6]</sup> such that their use, and the phonon gas picture in general, become dubious when disorder becomes large.<sup>[7]</sup> Still, this formalism has been used to adequately model the thermal conductivity in a variety of materials, including SiGe,<sup>[5, 8, 9]</sup> InGaN<sup>[10]</sup>, InAsP,<sup>[5]</sup> and GaInAs<sup>[5]</sup> across a range of compositions, and remains the standard to model alloy thermal conductivity, even within first principles frameworks.<sup>[11]</sup> Under the VCA, Rayleigh scattering is proportional to  $\Gamma = \Gamma_m + \Gamma_f$ and is described by Abeles to be  $\Gamma = \sum_i x_i [(\Delta m/\bar{m})^2 + 2((\Delta G/\bar{G}) - 2 \times 3.2\gamma(\Delta \delta/\bar{\delta}))^2],$ where x is the concentration of each species,  $\gamma$  is an average anharmonicity of bonds, and the difference in mass (m), stiffness constant of nearest neighbor bonds (G), and atomic radii ( $\delta$ ) are with respect to their average respective quantities  $(\overline{m}, \overline{G}, \overline{\delta})$ . The disorder defining  $\Gamma$  can take many forms, including mass, strain, interatomic force constant (IFC), and charge disorder. Because the latter three are related, we decouple  $\Gamma$  into mass disorder ( $\Gamma_m$ ) and interatomic force ( $\Gamma_f$ ) disorder terms. Further details are provided below.

#### **B. Model Details**

We model the thermal conductivity,  $\kappa$ , as a function of temperature, using the relation

Equation S1

$$\kappa = \frac{1}{3} \sum_{j} \int_{0}^{k_{\max}} \hbar \omega_j(k) D_j(k) \frac{\partial f(k)}{\partial T} v_j^2(k) \tau_j(k) \, \mathrm{d}k,$$

where k is the phonon wavevector, j is an index that refers to the polarization (longitudinal/transverse, acoustic/optical),  $\hbar$  is the reduced Planck's constant,  $\omega$  is the phonon angular frequency, D is the phonon density of states, f is the phonon equilibrium distribution function (Bose-Einstein distribution), T is temperature, v is the phonon group velocity  $(\partial \omega / \partial k)$ , and  $\tau$  is the phonon relaxation time. Integration in Equation (S1) is performed in phonon wavevector space to allow the use of numerical dispersion relations for MgO and NiO obtained from literature.<sup>[12, 13]</sup> However, in practice we find that Debye approximation, the standard for dispersion modeling of alloys whose phonon contribution to thermal conductivity is typically assumed to be dominated by low-frequency modes, is sufficient for modeling these systems.

The relaxation time  $\tau$  for a bulk crystal, such as MgO or NiO, is a combination of isotope/impurity scattering<sup>[3]</sup> ( $\tau_I$ ) as well as Normal and Umklapp scattering<sup>[1, 3, 14–16]</sup> ( $\tau_N$  and  $\tau_U$ ).  $\tau_I$  is proportional to  $\omega^4$ , while  $\tau_N$  and  $\tau_U$  share the same  $\omega^2$  dependence, so that we combine them into a single term. Together, the phonon relaxation time becomes

Equation S2

$$\tau_j^{-1} = \tau_{I,j}^{-1}(k) + \tau_{N,j}^{-1}(k) + \tau_{U,j}^{-1}(k) = A\omega_j^4(k) + BT\omega_j^2(k)\exp(-C/T),$$

where *A*, *B*, and *C* are constants that are typically assigned based on a best-fit of Equation S1 to experimental data. In this case, we use experimental thermal conductivity data vs. temperature for MgO<sup>[17]</sup> and NiO<sup>[18]</sup> to fit these constants using both an actual dispersion as well as a Debye dispersion. The resulting experimental data and fit are shown in Figure S1; similarly good fits are found for both the full dispersion and Debye dispersion. In the former case,  $A = 1.86 \times 10^{-38} \text{ s}^3$ ,  $B = 4.61 \times 10^{-19} \text{ s} \text{ K}^{-1}$ , and C = 80.3 K for MgO, while  $A = 4.02 \times 10^{-48} \text{ s}^3$ ,  $B = 5.68 \times 10^{-19} \text{ s} \text{ K}^{-1}$ , and C = 41.0 K for NiO. In the latter case,  $A = 1.12 \times 10^{-39} \text{ s}^3$ ,  $B = 9.20 \times 10^{-19} \text{ s} \text{ K}^{-1}$ , and C = 146.3 K for MgO, while  $A = -8.51 \times 10^{-49} \text{ s}^3$ ,  $B = 1.24 \times 10^{-18} \text{ s} \text{ K}^{-1}$ , and C = 81.66 K for NiO. We note that the fitted values for A in each case were negligible in determining the best-fit; changing this value by several orders of magnitude made little difference to the fit. Moreover, when these constants are used later to model the 2-, 5-, and 6-component systems, the mass scattering, which takes the same  $\omega^4$  form, overwhelmingly outweighs any *A* obtained for the bulk crystal.



**Figure S1.** Thermal conductivity vs. temperature for MgO and NiO. Models depict the thermal conductivity calculated by Equation S1 with best-fit values for parameters A, B, and C.

To extend this model to multi-component systems, we add the additional scattering times due to mass-impurity scattering<sup>[19]</sup> ( $\tau_m$ ), normal scattering, <sup>[10, 14]</sup> and boundary scattering ( $\tau_b$ ) resulting from finite film thicknesses (*d*) in experimental samples. Using Matthiessen's rule, the total scattering time,  $\tau$ , takes the form

Equation S3

$$\tau_j^{-1} = \tau_{I,j}^{-1}(k) + \tau_{m,j}^{-1}(k) + \tau_{U,j}^{-1}(k) + \tau_{N,j}^{-1}(k) + \tau_{b,j}^{-1}(k)$$
$$= \left(A + \frac{\Gamma\Omega}{12\pi v_j^3(k)}\right)\omega_j^4(k) + \left(B + \frac{k_B\gamma^2\Omega^{1/3}}{\overline{m}v_j^3}\right)T\omega_j^2(k)\exp\left(-\frac{C}{T}\right) + \frac{2v_j(k)}{d}$$

where the mass-impurity is a Rayleigh type scattering in which phonon-displacement, phonon-isotope impurity, and phonon-mass impurity scattering are included in  $\Gamma$ .  $k_B$  is Boltzmann's constant,  $\gamma$  is the Grüneisen parameter describing the average anharmonicity between bonds, and  $\Omega$  is the volume per atom.  $\Gamma$  is described by<sup>[5]</sup>

Equation S4

$$\Gamma = \Gamma_m + \Gamma_f = \sum_i x_i \left[ \left( \frac{\Delta m_i}{\overline{m}} \right)^2 + 2 \left( \left( \frac{\Delta G_i}{\overline{G}} \right) - 2 \times 3.2 \gamma \left( \frac{\Delta \delta_i}{\overline{\delta}} \right) \right)^2 \right],$$

where  $x_i$  is the fraction of element *i*,  $m_i$  denotes the atomic mass of species *i*,  $G_i$  represents the average stiffness constant of nearest neighbor bonds of species *i* within the host lattice, and  $\delta_i$  denotes atomic radius of species *i*. Under the VCA,  $\overline{m}$ ,  $\overline{G}$ , and  $\overline{\delta}$  are the average mass, stiffness, and atomic radius of the perturbed atoms, in this case the metal cations. From this

analytical expression, we observe that three terms dictate the Rayleigh scattering of phonons within a multi-component alloy or solid solution: (1) mass difference, (2) bond strength difference, and (3) atomic radii difference between impurity and host atom. While the mass differences are easily quantifiable, the latter terms, which are all related to the interatomic force constants, are not. Therefore, we split the summation in Equation (S4) to distinguish the contribution from mass and interatomic forces,  $\Gamma = \Gamma_m + \Gamma_f$ . We can then model the thermal conductivity with and without the  $\Gamma_f$  term to assess its contribution to the model.



**Figure S2.** Thermal conductivity vs. temperature for (a) J14 (squares) and (b) J35 (circles), together with the best fit VCA model,  $\kappa_{Total}$ , which is described by Equation S1 and contains both Umklapp and Rayleigh scattering rates in the model.  $\kappa_{Umklapp}$  shows the model when Rayleigh scattering is turned off and Umklapp scattering is on, while  $\kappa_{Rayleigh}$  shows the model when Rayleigh scattering is turned on and Umklapp scattering is off.

Under the VCA, all cations are assumed to have the same mass equal to the average cation mass,  $\overline{m}$ , such that mass differences in Equation (S4) are with respect to  $\overline{m}$ . Additionally, the differences in stiffness constants and atomic radii are with respect to those average quantities of all cations. In this case, the B and C used in Equation (S2) will take the form of the average B and C for each oxide constituent. However, we estimate these values based on the average of only two such components, MgO and NiO, due to the lack of rigorous temperature dependent thermal conductivity data for single crystal forms of the other constituents. Nonetheless, we find that this approximation B and C is relatively unimportant because the other scattering terms dominate the total scattering time of the system. We use the VCA with the relaxation time described by Equation (S3) to calculate the models. We begin with no fitting parameters, ignoring  $\Gamma_f$  in Eq S4 and assuming the Grüneisen parameter is that of MgO (1.6). Uncertainty in the VCA is primarily from uncertainty in this Grüneisen parameter controlling the normal scattering rate, which we vary from 1.2 to 2.0 based on the constituent oxide values. We then fit for  $\Gamma_f$  and  $\gamma$ . All model parameters are listed in Table S1.

p	J is the strain perton of 1, 2 and 5 are simply searceing parameters.					
Sample	B (s K <sup>-1</sup> )	С (К)	$\Gamma_{\!f}$ (no fit)	$\gamma$ (no fit)	$\Gamma_{\!f}$ (best fit)	$\gamma$ (best fit)
J14	1.08 ×10 <sup>-18</sup>	114	0	1.6 ± 0.4	0.496	0
J35	1.08 ×10 <sup>-18</sup>	114	0	1.6 ± 0.4	1.39	0
Co <sub>0.2</sub> Ni <sub>0.8</sub> O	1.24 ×10 <sup>-18</sup>	81.6	0	1.6 ± 0.4	0.0015	1.43
Zn <sub>0.4</sub> Mg <sub>0.6</sub> O	0.92 ×10 <sup>-18</sup>	146.3	0	1.6 ± 0.4	0	0.84
Co <sub>0.25</sub> Ni <sub>0.75</sub> O	1.24 ×10 <sup>-18</sup>	81.6	0	1.6 ± 0.4	0.11	1.34

**Table S1.** Model parameters for VCA under a Debye approximation:  $\gamma$  is the Grüneisen parameter,  $\Gamma_f$  is the strain portion of  $\Gamma$ , B and C are Umklapp scattering parameters.

The resulting models with and without fitting parameters are shown in Figure 3 of the main text. However, in order to justify our claim that the Rayleigh scattering mechanism is dominant over Umklapp scattering, we show the model with and without Rayleigh scattering in Figure S2. The total thermal conductivity,  $\kappa_{Total}$ , represents the best fit model and considers both Umklapp scattering and Rayleigh scattering.  $\kappa_{Umklapp}$  shows the model when Rayleigh scattering is turned off and Umklapp scattering is on, while  $\kappa_{Rayleigh}$  shows the model when Rayleigh scattering is turned on and Umklapp scattering is off. The model describing  $\kappa_{Umklapp}$  greatly overestimates the thermal conductivity and always possesses a decreasing thermal conductivity trend with temperature at elevated temperatures. However, considering Rayleigh scattering without Umklapp scattering, the model describing  $\kappa_{Rayleigh}$  better captures the experimental data. This finding suggests that Rayleigh scattering is the dominant phonon scattering mechanism dictating the thermal conductivity in ESOs within the temperature range tested.

The minimum limit to thermal conductivity was determined using<sup>[20]</sup>

**Equation S5** 

$$\kappa_{\min} = \left(\frac{\pi}{6}\right)^{1/3} k_B n^{2/3} \sum_{j} v_j \left(\frac{T}{\theta_j}\right)^2 \int_0^{\theta_j/T} \frac{x^3 e^x}{(e^x - 1)^2} \, \mathrm{d}x,$$

where *n* is number density and  $\theta_j = v_j (\hbar/k_B) (6\pi^2 n)^{1/3}$ . The sound speeds,  $v_j$ , used to calculate  $\kappa_{\min}$  are listed in Table S3. For ESO samples, these values are derived from the measured elastic modulus.

#### 2. MEASURING HEAT CAPACITY AND THERMAL CONDUCTIVITY SIMULTANEOUSLY

Transient techniques used to measure thermal conductivity, such as time and frequencydomain thermoreflectance (TDTR/FDTR), are generally analyzed with the heat diffusion equation so that the volumetric heat capacity and thermal conductivity are coupled through the thermal effusivity or thermal diffusivity, depending on the time and length scales of the heating event. Typically for alloys and solid solutions, a composition-weighted average is used to estimate volumetric heat capacity. However, recent developments in thermoreflectance experiments have enabled simultaneous measurements of both heat capacity and thermal conductivity of thin films. The conditions for doing so are outlined and validated in previous studies<sup>[21–23]</sup>, all of which rely on the same operating principle of varying the modulation frequency to decouple the sensitivity of the measurement to thermal conductivity and heat capacity, but are carried out in different ways. There have been many demonstrations of this concept using both FDTR<sup>[21, 24, 25]</sup>, and TDTR at multiple modulation

frequencies <sup>[22, 23, 26–30]</sup>. In this study, we use and compare all of these approaches to characterize the thermal conductivity and volumetric heat capacity simultaneously, when experimental conditions allow. Additionally, we extend the approach by Wei et al.<sup>[23]</sup> to incorporate TDTR phase data over a range of frequencies sufficient for FDTR, so as to combine the benefits of multifrequency TDTR and FDTR for thermal property measurement. This development provides a robust approach for measuring both the heat capacity and thermal conductivity of thin films. We mention the caveat that we are able to decouple the thermal conductivity and heat capacity only as much as experimental conditions allow. Because the samples tested here are thin films on a conductive substrate (MgO), the thermal penetration depth can be very high, such that the ESO sample becomes thermally thin<sup>[26]</sup> so that the ratio is sensitive to thermal conductivity but less sensitive to the volumetric heat capacity. Operating in this regime allows us to characterize the thermal conductivity with larger sensitivity than volumetric heat capacity; as a result, the measurement of heat capacity comes with large uncertainty. This concept becomes especially important at low temperatures where the thermal conductivity of the MgO substrate is so high that the thin film is thermally thin relative to the total thermal penetration depth.

We use the surface fitting procedure discussed in the main text to extract thermal conductivity and volumetric heat capacity. Figure S3 shows the best fit model and data for J14. Fitting parameters include the Al/ESO thermal boundary conductance (G1  $\approx$  170 MW m<sup>-1</sup> K<sup>-1</sup>), thermal conductivity ( $\kappa$ ), and volumetric heat capacity (C<sub>v</sub>). The ESO/MgO thermal boundary conductance (G<sub>2</sub>) was taken to be 300 MW m<sup>-1</sup> K<sup>-1</sup>; fitting this additional parameter gave the same value, but because we are insensitive to it, fitting this parameter does not provide additional benefit. The best fit surface is shown together with the experimental phase data in Figure S3(a), while Figure S3(b) and (c) show the corresponding time and frequency domain best fit models and data to reveal that the combination of fitted values works well to describe the data at all time and frequency points.



**Figure S3.** (a) J14 combined TDTR and FDTR experimental phase data and best-fit surface. (b) Time-domain data and best fit models. (c) Frequency-domain data and best fit models. In all cases, the best fit model is that of the surface fit minimization.



**Figure S4.** Sensitivity of phase ( $\phi$ ) for (a) 114 nm J14 and (b) 78 nm amorphous J14 (a-J14) as a function of delay time and modulation frequency for thermal conductivity ( $\kappa$ ), volumetric heat capacity ( $C_v$ ), Al/J14(a-J14) thermal boundary conductance (G1) and J14(a-J14)/MgO(a-SiO<sub>2</sub>) thermal boundary conductance (G2).

Whereas the thermal boundary conductances and input parameters can generally be assumed independent variables in terms of their affect on the fitted parameters' uncertainties<sup>[31]</sup>, we recognize that  $\kappa$  and  $C_v$  are coupled, motivating the use of the contour approach by Wang et al.<sup>[26]</sup> to quantify their respective role on the total uncertainty. To obtain the contours for thermal conductivity determined in Figure 1 of the main text, we determine the combinations for  $\kappa$  and  $C_v$  that produce a model that falls within  $2\sigma_{min}$ , defined as<sup>[26]</sup>

**Equation S6** 

$$\sigma_{\min} = \sum_{j=1}^{q} \frac{\sum_{i=1}^{n} \left(\frac{\phi_{\mathrm{m},i} - \phi_{\mathrm{d},i}}{\phi_{\mathrm{d},i}}\right)^{2}}{n},$$

where  $\phi_m$  is the model for the phase or ratio,  $\phi_d$  is the experimental data for the phase or ratio, *q* is the number of modulation frequencies used, and *n* is the number of time points used. This contour approach reveals that for J14 and the 6-component oxides, C<sub>v</sub> and  $\kappa$  can be simultaneously obtained. One notes, however, that C<sub>v</sub> has a higher percentage uncertainty than does  $\kappa$ . This can be explained based on the sensitivity of the fitting parameters within the thermal model, R, used. The sensitivity to a parameter x is defined as<sup>[32]</sup>

Equation S7

$$S_x = \frac{\partial \ln(R)}{\partial \ln(x)},$$

The sensitivity is dependent on both time and modulation frequency. The sensitivity to phase is shown for 114 nm J14 at room temperature in Figure S4(a) to reveal that  $C_v$  and  $\kappa$  have significantly different sensitivities in both magnitude and trend across all delay times and modulation frequencies, which allows us to decouple the two quantities using the surface fitting procedure. Because the magnitude of sensitivity for  $\kappa$  is in general higher than that of  $C_v$ , the uncertainty in  $C_v$  is relatively larger; this is evidenced by the contour plot shown in Figure 1(c) of the main text, in which a relatively wide range of volumetric heat capacities can be assumed to fit a relatively narrow range of thermal conductivities. The 6-component oxides show similar sensitivities to J14. As a result, we are able to simultaneously measure the  $\kappa$  and C<sub>v</sub>, but with a relatively large uncertainty in C<sub>v</sub>. For amorphous J14 (a-J14) and polycrystalline J14 (p-J14), which were grown on amorphous silicon dioxide substrates, we are not able to reliably decouple the heat capacity from thermal conductivity. The sensitivity explains this as well; shown in Figure S4(b) is the sensitivity for a-J14, which reveals that  $\kappa$ and C<sub>v</sub> have near identical values and trends over all delay times and temperature. This indicates that the two quantities cannot be decoupled, because the two have near-identical effects on the model.

As mentioned previously, other approaches have been used to simultaneously measure the  $\kappa$ and C<sub>v</sub> in thermoreflectance experiments. One of which, FDTR, was used here as well. We find that in general, FDTR at a single time delay gives similar fitted parameters as the combined TDTR/FDTR approach. We show this in Figure S5, where for J14 and all 6component oxides, FDTR measurements were taken at five delay times (1 - 5 ns). The best fit models and data, together with the extracted  $\kappa$  and C<sub>v</sub>, are shown for (a) J14, (b) J30, (c) J31, (d) J34, (e) J35, and (f) J36. FDTR proves to be reliable for thermal conductivity measurements in general, for the same reason regarding sensitivity to this parameter mentioned above. C<sub>v</sub> measurements are in general in agreement with the combined FDTR/TDTR approach, but can be highly dependent on the delay time chosen, as evidenced by (a) J14 and (e) J35, which could be due to differing sensitivities or experimental noise. Thus, the combined TDTR/FDTR approach has the advantage of fitting over a broad range of data to negate some of these issues from individual FDTR scans, thus reducing some of the artifacts that may overwhelm the determination of small differences in thermal conductivities between samples (e.g. the 6-component oxides). Moreover, the combined TDTR/FDTR approach allows us to quantify the interdependent k and Cv uncertainties via contour plots, which in general relies on both time- and frequency-dependent data.<sup>[26]</sup>

We next used the approach by Liu et al.<sup>[22]</sup> to vary  $C_v$  and fit  $\kappa$  at three frequencies. Figure S6 shows the resulting best fit values for  $\kappa$  as a function of  $C_v$ . The crossing point is taken to be the "true" thermal conductivity and heat capacity. In this case, we used three frequencies that span a range large enough to make the dominant thermal property measured transition from

film effusivity (highest frequency) to diffusivity (mid-frequency) to the lowest frequency case where the substrate properties become more influential. These regimes are evidenced by the differing trends of  $\kappa$  with C<sub>v</sub> for each frequency for (a) J14, (b) J30, (c) J31, (d) J34, (e) J35, and (f) J36. In general, this approach gives similar values to the combined TDTR/FDTR approach, but it is clear that this approach is not as rigorous, and may require user judgement to find the crossing point. Taking J34 as an example, the 10 MHz line crosses the 0.615 MHz line at ~3.0 MJ m<sup>-3</sup> K<sup>-1</sup>, but crosses the 4.37 MHz line at ~3.7 MJ m<sup>-3</sup> K<sup>-1</sup>. The 0.615 MHz and 4.37 MHz lines also intersect at ~3.2 MJ m<sup>-3</sup> K<sup>-1</sup>. In this case, it may not be clear which value is the correct to use. On the other hand, for J36, all three frequency lines intersect once at ~3.5 MJ m<sup>-3</sup> K<sup>-1</sup>, in general agreement with the combined TDTR/FDTR approach. This approach, however, has a benefit of clearly showing when thermal conductivity and heat capacity cannot be decoupled. This can be seen in Figure S6(g) and (h) for p-J14 and a-14, respectively. All frequencies have the same  $\kappa$  vs. C<sub>v</sub> relation, indicating that the two quantities cannot be independently measured under these experimental conditions.

Comparing the three approaches, we note that the combined TDTR/FDTR approach is the most rigorous and allows for a proper estimate of uncertainty when decoupling  $\kappa$  and  $C_v$ . Because of these benefits, we use this approach here to report measured values. We characterize J14 and J35 temperature-dependent data with this approach as well in order to extract  $\kappa$  and  $C_v$  as a function of temperature, using the same contour plots as we used at room temperature. Figure S7(a) shows the contour lines for the temperatures tested. Figure S7(b) shows the measured heat capacities as a function of temperature. In general,  $C_v$  falls within the range of  $C_v$  for each constituent oxide across all temperatures, with the exception of at 78 K. However, the large uncertainty at this temperature due to the J14's thermally thin nature and relatively high uncertainty in MgO substrate properties prevents us from accurately measuring this quantity. Finally, the thermal conductivities are shown as a function of temperature in Figure S7(c).



**Figure S5.** Best fit models and experimental FDTR data at five delay times for (a) J14, (b) J30, (c) J31, (d) J34, (e) J35, and (f) J36.



**Figure S6.** Best fit thermal conductivities as a function of volumetric heat capacity using the approach outlined by Liu et al.<sup>[22]</sup> for (a) J14, (b) J30, (c) J31, (d) J34, (e) J35, (f) J36, (g) polycrystalline J14, and (h) amorphous J14. To show the comparison to the values extracted via the combined TDTR/FDTR approach, also shown are the contours given in Figure 1(d) of the main text as well as the reported values including all propagated uncertainties.



**Figure S7.** (a) Contour plot of thermal conductivity ( $\kappa$ ) and volumetric heat capacity ( $C_v$ ) for 114 nm J14 and 109 nm J35 over a range of temperature from 78 K to 450 K. (b) Measured  $C_v$  as a function of temperature for J14 and J35, together with literature values<sup>[33]</sup> of  $C_v$  for each constituent oxide to include MgO, NiO, CoO, ZnO, CuO, and Cr<sub>2</sub>O<sub>3</sub>. (c) Measured  $\kappa$  as a function of temperature for J14 and J35.

#### 3. UNCERTAINTY ANALYSIS

In addition to the interdependent uncertainty of  $\kappa$  and  $C_v$ , there is additional uncertainty based on the uncertainties of input parameters to the thermal model. The uncertainty ( $\delta$ ) to a fitting parameter, x to an input parameter, y, is given by<sup>[23]</sup>

**Equation S8** 

$$\left(\frac{\delta_x}{x}\right)^2 = \left(R * \frac{\delta\phi}{S_x}\right) + \sum \left(\frac{S_y}{S_x} * \frac{\delta_y}{y}\right)^2$$

where *R* is the signal (ratio or phase) and  $\delta \phi$  is uncertainty in absolute phase of the RF lockin amplifier.  $S_x$  denotes sensitivity to parameter *x* and the summation is over the total number input variables. Phase correction is post-processed<sup>[32, 34]</sup>. The RMS noise of the out-of-phase signal determines  $\delta \phi$ ; for the modulation frequencies used in this study ( $\geq$ 500 kHz), this RMS noise is small, so that in practice, only the latter term in Equation (S8) is important to calculate the uncertainty. The largest contributions to this term are the uncertainties in film thickness of the aluminum ( $\pm$ 2 nm as determined by mechanical profilometry and picosecond acoustics) and film thickness of the ESO film (determined by x-ray reflectivity measurements, varies for each sample).



**Figure S8.** Cross-section SEM images of (a) J14, (b) J30, (c) Cu<sub>0.2</sub>Ni<sub>0.8</sub>O, (d) Co<sub>0.25</sub>Ni<sub>0.75</sub>O and (e) Zn<sub>0.4</sub>Mg<sub>0.6</sub>O.

#### 4. TESTING FOR SIZE EFFECTS IN THERMAL CONDUCTIVITY

To test for size effects, additional films of roughly double the thickness were deposited for J14 and J30. Cross-section scanning electron microscopy (SEM) was used to measure the film thicknesses of these samples and the 2-cation samples. The SEM images are shown in Figure S8. J14 was measured to be 260 nm  $\pm$  7 nm, while J30 was measured to be 270 nm  $\pm$  14 nm. Both of these films are about twice the thickness of the films discussed in the main text; thus, we should measure a higher thermal conductivity in the thicker samples compared to the ~100 nm samples if boundary scattering is significantly reducing phonon mean free paths. However, we measure 260 nm J14's thermal conductivity to be  $3.17 \pm 0.45$  W m<sup>-1</sup> K<sup>-1</sup> and 270 nm J30's thermal conductivity to be  $1.63 \pm 0.23$  W m<sup>-1</sup> K<sup>-1</sup>. Both of these values fall within the thermal conductivity uncertainty of their ~100 nm counterparts, which were reported in the main text as  $2.95 \pm 0.25$  W m<sup>-1</sup> K<sup>-1</sup> and  $1.68 \pm 0.13$  W m<sup>-1</sup> K<sup>-1</sup>, for 114 nm J14 and 149 nm J30, respectively. The J14 film was additionally measured as a function of temperature to reveal similar thermal conductivities as it's thinner counterpart. The lack of size effects on thermal conductivity indicates that the reported thermal conductivities are intrinsic values.

Table S2. Resulting parameter values from EXAFS analysis. All uncertainties are propagated
though Artemis. $S_0^2$ is the amplitude reduction factor, $E_0$ is the inner potential energy shift, R
is the half scattering path distance, and $\sigma^2$ is the EXAFS Debye-Waller factor.

Parameter	J14	J35	
S <sub>0</sub> <sup>2</sup>	1.0	0.85	
E <sub>0</sub>	3.0 ± 1.0	2.0 ± 1.0	
R	$2.10 \pm 0.02$	$1.96 \pm 0.08$	
σ²	$0.0073 \pm 0.0005$	$0.006 \pm 0.002$	
R	$2.15 \pm 0.04$	$1.93 \pm 0.04$	
σ²	$0.0073 \pm 0.0005$	$0.006 \pm 0.002$	
R	$3.00 \pm 0.01$	$2.86 \pm 0.02$	
σ²	$0.0073 \pm 0.0005$	$0.006 \pm 0.002$	
R	-	$2.97 \pm 0.02$	
σ²	-	0.006 ± 0.002	

#### 5. EXAFS FITTING PARAMETERS

The EXAFS fitting parameters are shown listed in Table S2. Each fit generally contains four fitting parameters: amplitude reduction factor  $S_0^2$ , inner potential energy shift  $E_0$ , half scattering path distance R, and EXAFS Debye-Waller factor  $\sigma^2$ .

## 6. ELASTIC MODULUS MEASUREMENTS AND DERIVATION OF SOUND SPEED

Contact resonance atomic force microscopy (CR-AFM)<sup>[35, 36]</sup> was used to determine the elastic moduli of all ESO samples. The measurements consisted of observing the change in the CR frequency,  $f_2^{\text{contact}}$ , of the second eigenmode of the cantilever under a given applied load on the tip-sample contact. By using the spring coupled-clamped beam model with the tip located at the end of the beam, [35, 37] the  $f_2^{\text{contact}}$  frequencies measured on each material were normalized to the first free resonance  $f_1^{air}$  of the cantilever and used to calculate the normalized contact stiffness  $k/k_c$ , with k being the contact stiffness and  $k_c$  being the cantilever spring constant. With the assumption of a Hertz contact geometry, the contact stiffnesses and the indentation moduli of the reference and AFM tip were used to determine the indentation modulus of a given material, <sup>[35, 37, 38]</sup>  $M_S = [(k_R/k_S)^{3/2}/M_R +$  $(k_R/k_S)^{3/2}/M_T - 1/M_T]^{-1}$ . The indices S, R, and T denote "sample" (the ESO test material), "reference" (sapphire) and "tip" (silicon), respectively. The determined indentation modulus was converted to Young's elastic modulus by assuming a Poisson ratio of 0.28 for each ESO material,  $E_S = (1 - v_S^2)M_S$ . Other values used were  $E_R = 345.0$  GPa and  $v_R = 0.29$ for sapphire,  $E_T = 130.0$  GPa and  $v_T = 0.28$  for the silicon tip. The substrate contribution to the determined elastic moduli was found negligible for the contact geometry, film thickness, applied loads, and materials involved in these measurements. For each material, the measured CR frequencies were used to determine a weighted average and uncertainty of this average with the weights given by the uncertainties  $\Delta f$  of the measured frequencies (the half width at the half height of the resonance peak). The uncertainty for each determined elastic modulus was calculated then by adding in quadrature the independent uncertainties from  $f_1^{air}$  (first free-resonance in air),  $f_{2,S}^{\text{contact}}$  (second CR frequency on a test ESO sample), and  $f_{2,S}^{\text{contact}}$ (second CR frequency on the reference material),<sup>[37]</sup>

**Equation S9** 

$$\Delta E_{S} = \sqrt{\left(\frac{\partial E_{S}}{\partial f_{1}^{\operatorname{air}}}\right)^{2} \left(\Delta f_{1}^{\operatorname{air}}\right)^{2} + \left(\frac{\partial E_{S}}{\partial f_{2,S}^{\operatorname{contact}}}\right)^{2} \left(\Delta f_{2,S}^{\operatorname{contact}}\right)^{2} + \left(\frac{\partial E_{S}}{\partial f_{2,R}^{\operatorname{contact}}}\right)^{2} \left(\Delta f_{2,R}^{\operatorname{contact}}\right)^{2}$$

Figure S9 shows the second contact resonance frequency on sapphire (used as a calibration) and several ESO samples to demonstrate the differences observed that directly relate to the elastic moduli of these samples; higher frequencies are indicative of stiffer materials. The elastic moduli (E) among ESOs vary from ~150 to 250 GPa. From these elastic moduli, under the assumption that the elastic properties are isotropic and the Poisson's ratio (v) is 0.28, the longitudinal (v<sub>L</sub>) and transverse (v<sub>T</sub>) sound speeds can be derived from the following equations<sup>[29]</sup>

Equation S10

$$v_{\rm L} = \sqrt{\frac{E(1-\nu)}{\rho(1+\nu)(1-2\nu)}},$$

Equation S11

$$\mathbf{v}_{\mathrm{T}} = \sqrt{\frac{G}{\rho}} = \sqrt{\frac{E}{2\rho(1+\nu)}},$$

where  $\rho$  is the density (assumed as the theoretical density) and G is the shear modulus. The resulting sound speeds are listed in Table S3.

**Table S3.** Longitudinal ( $v_L$ ) and transverse ( $v_T$ ) sound speeds in [100] direction for the oxide constituent oxides that make up J14.

Sample or Constituent	v <sub>L</sub> [km s <sup>-1</sup> ]	v <sub>T</sub> [km s <sup>-1</sup> ]
J14, $Mg_xNi_xCu_xCo_xZn_xO$ , x = 0.2	5.63	3.11
J30, Mg <sub>x</sub> Ni <sub>x</sub> Cu <sub>x</sub> Co <sub>x</sub> Zn <sub>x</sub> Sc <sub>x</sub> O, x = 0.167	7.16	3.96
J31, Mg <sub>x</sub> Ni <sub>x</sub> Cu <sub>x</sub> Co <sub>x</sub> Zn <sub>x</sub> Sb <sub>x</sub> O, x = 0.167	5.33	2.94
J34, Mg <sub>x</sub> Ni <sub>x</sub> Cu <sub>x</sub> Co <sub>x</sub> Zn <sub>x</sub> Sn <sub>x</sub> O, x = 0.167	5.77	3.19
J35, Mg <sub>x</sub> Ni <sub>x</sub> Cu <sub>x</sub> Co <sub>x</sub> Zn <sub>x</sub> Cr <sub>x</sub> O, x = 0.167	5.49	3.03
J36, $Mg_xNi_xCu_xCo_xZn_xGe_xO$ , x = 0.167	6.67	3.68
MgO	9.11ª	6.59ª
NiO	7.39 <sup>b</sup>	3.36 <sup>b</sup>
ZnO	6.09 °	2.76 °
CoO	6.30 <sup>d</sup>	2.90 <sup>d</sup>
CuO	5.20 °	2.20 °

<sup>a)</sup> Reference 39; <sup>b)</sup> Derived from phonon dispersion, reference 13; <sup>c)</sup> Reference 40; <sup>d)</sup> Derived from elastic properties, reference 41; <sup>e)</sup> Derived from elastic properties, reference 42.



**Figure S9.** (a) The shift of the second contact resonance frequency on sapphire, J30, J34, and J35 respectively. The measurements were made under the same applied load, so the frequency shift reflects the stiffness of the material probe: Higher shifts on stiffer materials. The out-of-contact frequency spectrum shows the absence of any peak in this frequency range when the tip is not in contact with a material. (b) The determined Young's modulus of the samples probed by CR-AFM. The calculations were done by considering the sapphire as a reference material of Young's modulus 345.0 GPa and Poisson's ratio 0.29. An average Poisson's ratio of 0.28 was assumed for all the other materials. The uncertainty in the calculated elastic modulus of a material is the standard deviation of the mean value and includes the uncertainties in the contact frequencies measured on that material and on the reference. A set of five measurements were made on each material, with two sets of measurements on sapphire bracketing the measurements on the test materials.

# 7. LITERATURE DATA FOR ELASTIC MODULUS AND THERMAL CONDUCTIVITY

Table S4 lists the elastic moduli and thermal conductivity obtained from the listed references.

**Table S4.** Elastic moduli (E) and thermal conductivities ( $\kappa$ ) for isotropic single crystals at room temperature.

Material	E [GPa]	к [W m <sup>-1</sup> K <sup>-1</sup> ]
Ag	87.03 ª	429 <sup>b</sup>
AI	71.26 ª	237 <sup>b</sup>
Au	89.15 ª	317 <sup>b</sup>
Cu	144.57 <sup>a</sup>	401 <sup>b</sup>
Fe	227.48ª	80.4 <sup>b</sup>
W	389.02ª	174 <sup>b</sup>
К	4.51 ª	102.4 <sup>b</sup>
Na	9.24 ª	143 <sup>b</sup>
Ni	231.17ª	90.9 <sup>b</sup>
Pb	28.28 ª	35.3 <sup>b</sup>
Ge	135.40ª	60.2 <sup>b</sup>
Si	165.82ª	149 <sup>b</sup>
Diamond (I/ IIa/ IIb)	1144.81 <sup>a</sup>	900/2320/1360 <sup>t</sup>
AgSbTe <sub>2</sub>	49.49 °	0.68 <sup>d</sup>
PbTe	67.23 °	1.7 <sup>d</sup>
InAs	79.70 <sup>f</sup>	27 <sup>g</sup>
SrTiO <sub>3</sub>	260.85 <sup> h</sup>	11 <sup>i</sup>
SnTe	65.36 °	8.2 <sup>j</sup>
SnTe:Ga, x=0.1	68.30 °	6.3 <sup>j</sup>
Ag <sub>8</sub> SnSe <sub>6</sub>	52.63 <sup>k</sup>	0.39 <sup>k</sup>
MgO	310	52 <sup>m</sup>
$AI_2O_3$	345 <sup>m</sup>	34 <sup>m</sup>
MAPbCl₃ (cubic)	23.0 <sup>n</sup>	0.73 <sup>n</sup>
MAPbBr <sub>3</sub> (cubic)	17.8 <sup>n</sup>	0.51 <sup>n</sup>
MAPbl <sub>3</sub> (tetragonal)	12.0 <sup>n</sup>	0.34 <sup>n</sup>
CsPbBr <sub>3</sub> (othorombic)	13.5 <sup>n</sup>	0.46 <sup>n</sup>
FAPbBr <sub>3</sub> (cubic)	10.2 <sup>n</sup>	0.49 <sup>n</sup>
$YB_{66}$	362.69°	2.55 <sup>p</sup>
(KBr) <sub>0.81</sub> (KCN) <sub>0.19</sub>	16.35 <sup>q</sup>	0.67 <sup>p</sup>

$Co_6S_8$	4.0 <sup>r</sup>	0.22 <sup>r</sup>
Co <sub>6</sub> Se <sub>8</sub>	2.3 <sup>r</sup>	0.18 <sup>r</sup>
Co <sub>6</sub> Te <sub>8</sub>	0.62 <sup>r</sup>	0.13 <sup>r</sup>
$[Co_6Se_8][C_{60}]_2$	8.1 <sup>r</sup>	0.25 <sup>r</sup>
$[Co_6Te_8][C_{60}]_2$	1.5 <sup>r</sup>	0.16 <sup>r</sup>
C <sub>60</sub>	10 <sup>s</sup>	0.4 <sup>t</sup>
C <sub>70</sub>	4 <sup>s</sup>	0.07 <sup>t</sup>
BaZrO <sub>3</sub>	181 <sup>u</sup>	4.3 <sup>u</sup>
$La_2Zr_2O_7$	175 <sup>u</sup>	1.90 <sup>u</sup>
Y <sub>2</sub> O <sub>3</sub> -stabilized ZrO <sub>2</sub> (YSZ)	210 <sup>u</sup>	2.13 <sup>u</sup>
NiO	175 <sup>v</sup>	34 <sup>w</sup>
B₂C	350 ×	3.9 <sup>y</sup>
$(BiSbTe_{1.5}Se_{1.5})_{1-x}Ag_x, x = 0$	72 <sup>z</sup>	0.66 <sup>z</sup>
$(BiSbTe_{1.5}Se_{1.5})_{1-x}Ag_x, x = 0.3$	58 <sup>z</sup>	0.59 <sup>z</sup>
$(BiSbTe_{1.5}Se_{1.5})_{1-x}Ag_x, x = 0.6$	39 <sup>z</sup>	0.61 <sup>z</sup>
$(BiSbTe_{1.5}Se_{1.5})_{1-x}Ag_x, x = 0.9$	60 <sup>z</sup>	0.51 <sup>z</sup>
$(BiSbTe_{1.5}Se_{1.5})_{1-x}Ag_x, x = 1.2$	58 <sup>z</sup>	0.57 <sup>z</sup>
AlCoCrFeNi	127 <sup>aa</sup>	11 <sup>ab</sup>
J14	152.0 <sup>m</sup>	2.95 <sup>m</sup>
J30	236.7 <sup>m</sup>	1.68 <sup>m</sup>
J31	158.4 <sup>m</sup>	1.41 <sup>m</sup>
J34	180.8 <sup>m</sup>	1.44 <sup>m</sup>
J35	151.0 <sup>m</sup>	1.64 <sup>m</sup>
J36	229.9 <sup>m</sup>	1.60 <sup>m</sup>

<sup>a)</sup> Reference 43; <sup>b)</sup> Reference 44; <sup>c)</sup> Reference 45; <sup>d)</sup> Reference 46; <sup>e)</sup> Reference 47; <sup>f)</sup> Reference 48; <sup>g)</sup> Reference 49; <sup>h)</sup> Reference 50; <sup>i)</sup> Reference 51; <sup>j)</sup> Reference 52;

<sup>k)</sup> Reference 53; <sup>1)</sup> Reference 54; <sup>m)</sup> This study; <sup>n)</sup> Reference 55; <sup>o)</sup> Reference 56;

<sup>p)</sup> Reference 20; <sup>q)</sup> Reference 57; <sup>r)</sup> Reference 58; <sup>s)</sup> Reference 59; <sup>t)</sup> Reference 60; <sup>u)</sup> Reference 61; <sup>v)</sup> Reference 62; <sup>w)</sup> Reference 18; <sup>x)</sup> Reference 63; <sup>y)</sup> Reference 64;

<sup>z)</sup> Reference 65; <sup>aa)</sup> Reference 66; <sup>ab)</sup> Reference 67



**Figure S10.** Lattice parameter of J30 vs. temperature. The line represents the best fit to the data and the shaded region represents the 95% confidence bounds.

#### 8. COEFFICIENT OF THERMAL EXPANSION

The coefficient of thermal expansion (CTE) was measured for composition J30 via nonambient XRD. A Panalytical Empyrean was equipped with an Anton-Paar HTK 1200N hightemperature oven chamber. To avoid any significant interfacial diffusion, high temperatures were primarily avoided. Measurements were taken incrementally between 25 °C and 500 °C in air around the (002) film and substrate peaks, respectively (39- 45 20). The ramp rate was 60 °C/min. and each measurement was taken within 10 degrees of incremental set points for a total measurement time of approximately 90 min. Using Bragg's law, the shift in diffraction angle was converted to unit cell lattice parameter and plotted as a function of temperature. Figure S10 shows the resulting trend for the expansion of the out-of-plane lattice parameter, c, of J30 as a function of temperature. From the slope of the linear fit and its relationship to CTE, we find the linear CTE of the out-of-plane lattice parameter of J30 to be  $1.2 \pm 0.2 \times 10^{-5}$ K<sup>-1</sup>, which agrees well with both the previously measured CTE of J14,<sup>[68]</sup> as well as nominal MgO<sup>[69]</sup> and NiO.<sup>[70]</sup>

#### 9. MOLECULAR DYNAMICS SIMULATIONS

#### A. Charge induced interatomic force constant disorder

Molecular dynamics simulations were performed to further probe the relationship between thermal conductivity, composition, and the mass and IFC disorder. The potential energy function ( $\phi$ ) between atom i and j used in the simulations consisted of an exponential-6 pair potential

Equation S12

$$\phi_{ij} = A_{ij} \exp\left(-\frac{r_{ij}}{\rho}\right) - \frac{C_{ij}}{r_{ij}^6} + \frac{q_i q_j}{4\pi\varepsilon_0 r_{ij}}$$

where the last term is defines the electrostatic interactions modeled by atom-centered point charges. A,  $\rho$  and C are Buckingham potential parameters taken from prior work modeling MgO<sup>[71]</sup> while Bader charges from Density Functional Theory (DFT) calculations were used for the electrostatic point charges<sup>[72]</sup>. This model is not intended to quantitatively reproduce thermal conductivities, but rather to explore the explicit issue of the reduction in thermal conductivity with the addition of a sixth cation. Three compositions are reported here, J14, J30 (J14+Sc), and J35 (J14+Cr). For each system, a 480 atom unit cell was populated using the special quasi-random structure algorithm.<sup>[73]</sup> As described in detail elsewhere, DFT calculations were carried out in which the structure was relaxed to minimize the energy.<sup>[72]</sup> The point charges used in the simulations were then set equal to the Bader DFT charges (or their average values). The systems used in the simulations reported here each contained  $4 \times 4 \times 4$  unit cells for a total of 30,700 atoms.

Using the LAMMPS package,<sup>[74]</sup> the potential energy was first minimized with respect to atom position, followed by equilibration at zero pressure and 300 K for 32 picoseconds using a Nose-Hoover thermostat. After equilibration, the thermal conductivity was calculated under NVE conditions using the Green-Kubo method <sup>[75–77]</sup> for 20 nanoseconds. This was sufficient to produce a converged value of thermal conductivity for each system. To separate the effects of charge from mass disorder, four systems were simulated for each of the three compositions. The cases include (1) individual DFT charges and individual masses being distributed randomly to cation positions (heterogeneous charge / heterogeneous mass), (2) a single charge and mass for each ion that was equal to the average of the DFT charges and atomic mass, respectively (homogeneous charge / heterogeneous mass), (3) a single charge and distributed individual masses (hemogeneous charge / heterogeneous mass), and (4) distributed individual DFT charges and a single mass (heterogeneous charge / homogeneous mass). These average charge and mass values are given in Table S5.

The calculated thermal conductivities for all 12 systems are given Table S5 and Figure S11. The introduction of a sixth cation reduces thermal conductivity compared to J14 for both Sc and Cr, in agreement with experiment. For the three compositions, heterogeneity in either mass or charge reduces the thermal conductivity compared to the corresponding fully homogeneous systems. However, there is little difference between heterogeneity in mass and charge, and heterogeneity in charge only. This suggests that scattering from disorder in the force constants dominates over that from scattering due to mass disorder. This agrees with our interpretation of the VCA model's ability to capture experimental data only when Rayleigh scattering from IFC disorder dominates the total phonon scattering rate dictating thermal conductivity.



**Figure S11.** (a) Thermal conductivities obtained from equilibrium molecular dynamics simulations using all combinations of homogeneous and heterogeneous mass and charge. The scenario that includes heterogeneous charge and heterogeneous mass most closely captures experimental conditions. (b) Comparison of experimental thermal conductivities to MD results from the heterogeneous charge / heterogeneous mass case. The MD results capture the reduction in thermal conductivity measured experimentally.

Sample	κ [W m <sup>-1</sup> K <sup>-1</sup> ] Heterogeneous charge/ Homogeneous mass	κ [W m <sup>-1</sup> K <sup>-1</sup> ] Heterogeneous charge/ Heterogeneous mass	κ [W m <sup>-1</sup> K <sup>-1</sup> ] Homogeneous charge/ Heterogeneous mass	κ [W m <sup>-1</sup> K <sup>-1</sup> ] Homogeneous charge/ Homogeneous mass	Average Charge [e]	Average Mass [g mol <sup>-1</sup> ]
J14	4.9	4.9	5.7	11.5	1.285	47.09
J30	3.9	3.5	5.7	11.4	1.283	46.72
J35	2.9	2.9	7.6	15.0	1.333	47.84

**Table S5.** Thermal conductivity ( $\kappa$ ) results from equilibrium molecular dynamics simulations.



**Figure S12.** (a) Schematic of computational domain and (b) thermal conductivity ( $\kappa$ ) results from non-equilibrium molecular dynamics simulations vs. both parameters defining the LJ potential,  $\epsilon$  (bottom axis) and  $\sigma$  (top axis).

#### B. Charge induced interatomic force constant disorder

In addition to the material specific potentials used to capture the experimentally observed trends in thermal conductivity, we also show that this concept of interatomic force disorder to reduce thermal conductivity can be generalized to other material systems. We employ the widely used 12-6 Lennard Jones (LJ) potential,  $U(r) = 4\epsilon [(\sigma/r)^{12} - (\sigma/r)^6]$ , where U is the interatomic potential, r is the interatomic separation, and  $\sigma$  and  $\varepsilon$  are the LJ length and energy parameters, respectively. For computational efficiency the cutoff distance is set to  $2.5\sigma$  for all the simulations and the time step is set to 1 fs throughout the simulations. As we are interested in understanding the general effect of mass and interatomic force constant disorder scattering on thermal transport in multi-atom component crystalline solid solutions as opposed to material specific properties, the use of the LJ potential is sufficient to provide this translational insight. For simplicity, the length and energy parameters are modeled for argon  $(\sigma = 3.405 \text{ Å and } \varepsilon = 10.3 \text{ meV}$ , respectively) with the lattice constant  $a_0 = 1.56\sigma$  and arranged in an fcc lattice. The sizes of the computational domains are  $10a_0 \times 10a_0 \times 80a_0$  with periodic boundary conditions applied in the x- and y- directions, whereas, fixed boundaries with 4 monolayers of atoms at each end are placed in the z-direction. The computational domain size was chosen to allow us to perform nonequilibrium molecular dynamics (NEMD) simulations. A schematic of the simulated structure is shown in Figure S12(a). In this case, an ordered sublattice of argon, shown as blue atoms, is analogous to oxygen anions in the ESO structures, while all other atoms have increasing integer multiples of argon mass from  $2 \times$  to  $5\times$ . These additional atoms are randomly assigned to the remaining sublattice with equal probability, analogous to the random configuration of metal cations in the ESO structures.

The computational domains are equilibrated under the Nose-Hoover thermostat and barostat with a fixed number of atoms, volume, and temperature. The domains are then left in an isothermal-isobaric ensemble with the number of particles, pressure, and temperature of the system held constant for a total of 2 ns at 0 bar pressure. For the NEMD simulations, a fixed amount of energy is added per time step to a warm bath at one end of the computational domain and removed in equal amount from a cool bath at the other end. The length of the baths is set to 10a<sub>0</sub> in the z-direction, and the dynamics are carried out under a micro-canonical, NVE, ensemble, with the number of particles (N), volume (V), and energy (E) held constant. After 2 ns, a steady-state temperature gradient in the z-direction is established by

averaging the temperature for atoms in each monolayer for a total of another 5 ns. The thermal conductivity,  $\kappa$  is then determined by invoking Fourier's law,  $Q = -\kappa (\partial T/\partial z)$  where the applied flux, Q, is in the z-direction.

Whereas the addition of further mass disorder in the form of higher integer multiples of argon mass makes a negligible difference in thermal conductivity,<sup>[78, 79]</sup> we find that adding interatomic force constant disorder can significantly reduce the thermal conductivity. We obtain such disorder by changing the LJ parameters,  $\varepsilon$  and  $\sigma$ , for all impurity atom species. Doing so effectively adds a random disruption to the otherwise continuous network of identical potentials defining the bond strength between atoms. Furthermore, we can change the strength of this disruption by changing the magnitude of difference in  $\varepsilon$  and  $\sigma$  relative to the baseline LJ parameters for argon. Figure S12(b) shows the resulting thermal conductivity change with adjusting the potential. The same results are also summarized in Table S6. There is a clear difference in thermal conductivity of over 50% between the lowest and highest value with the parameters chosen, confirming that stronger deviation from the baseline LJ potential leads to stronger reduction in thermal conductivity. However, like the experimental study on the ESOs, we need an observable metric that quantifies this disorder of interatomic forces. With the ESOs, we were able to use strain within the oxygen sublattice to reveal such disorder. Likewise, in these LJ systems, we use strain as a metric to quantify the disorder in interatomic forces. Shown in Figure S13 are snapshots of the von Mises strain<sup>[80, 81]</sup> on atoms with the 5 potentials listed in Table S6. We find that the average level of strain measured in these simulations is directly tied to the thermal conductivity extracted in NEMD simulations; the larger strain, indicative of larger interatomic force constant disorder as determined by deviation from the baseline LJ potential, corresponds to a stronger reduction in thermal conductivity.

Label in Figure S13	ε [meV]	σ [Å]	$\kappa [W m^{-1} K^{-1}]$
(a)	10.30	3.05	0.153
(b)	9.98	3.47	0.149
(c)	9.66	3.54	0.139
(d)	9.34	3.61	0.12
(e)	8.70	3.75	0.093

**Table S6.** Thermal conductivity of nonequilibrium molecular dynamics simulations using Lennard Jones potentials with varying  $\varepsilon$  and  $\sigma$  parameters.



**Figure S13.** Snapshots of the von Mises strain on atoms when parameters are adjusted within the LJ potential. The LJ parameters ( $\epsilon$  and  $\sigma$ ) and thermal conductivity ( $\kappa$ ) for each case are (a)  $\epsilon = 10.30$  Å,  $\sigma = 3.05$  meV, and  $\kappa = 0.153$  W m<sup>-1</sup> K<sup>-1</sup>; (b)  $\epsilon = 9.98$  Å,  $\sigma = 3.47$  meV, and  $\kappa = 0.149$  W m<sup>-1</sup> K<sup>-1</sup>; (c)  $\epsilon = 9.66$  Å,  $\sigma = 3.54$  meV, and  $\kappa = 0.139$  W m<sup>-1</sup> K<sup>-1</sup>; (d)  $\epsilon = 9.34$  Å,  $\sigma = 3.61$  meV, and  $\kappa = 0.12$  W m<sup>-1</sup> K<sup>-1</sup>; (e)  $\epsilon = 8.70$  Å,  $\sigma = 3.75$  meV, and  $\kappa = 0.093$  W m<sup>-1</sup> K<sup>-1</sup>.

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