Featured in Physics

Validation of the Wiedemann-Franz Law in Solid and Molten Tungsten above 2000 K through Thermal Conductivity Measurements via Steady-State **Temperature Differential Radiometry**

Milena Milich[®],^{1,*} Hunter B. Schonfeld[®],^{1,*} Konstantinos Boboridis[®],² Davide Robba[®],²

Luka Vlahovic,² Rudy J. M. Konings^(D),^{2,†} Jeffrey L. Braun,³ John T. Gaskins,³ Niraj Bhatt^(D),⁴ Ashutosh Giri,⁴ and Patrick E. Hopkins^(D),^{1,2,5,6,‡}

¹Department of Mechanical and Aerospace Engineering, University of Virginia, Charlottesville, Virginia 22904, USA ²European Commission, Joint Research Centre, Karlsruhe, D-76125, Germany

³Laser Thermal Analysis, Inc., Charlottesville, Virginia 22902, USA

⁴Mechanical, Industrial and Systems Engineering, University of Rhode Island, Kingston, Rhode Island 02881, USA

⁵Department of Materials Science and Engineering, University of Virginia, Charlottesville, Virginia 22904, USA

⁵Department of Physics, University of Virginia, Charlottesville, Virginia 22904, USA

(Received 7 September 2023; revised 11 January 2024; accepted 26 January 2024; published 5 April 2024)

We measure the thermal conductivity of solid and molten tungsten using steady state temperature differential radiometry. We demonstrate that the thermal conductivity can be well described by application of Wiedemann-Franz law to electrical resistivity data, thus suggesting the validity of Wiedemann-Franz law to capture the electronic thermal conductivity of metals in their molten phase. We further support this conclusion using *ab initio* molecular dynamics simulations with a machine-learned potential. Our results show that at these high temperatures, the vibrational contribution to thermal conductivity is negligible compared to the electronic component.

DOI: 10.1103/PhysRevLett.132.146303

The critical heat transfer mechanisms of materials subjected to extreme heat fluxes and temperatures are rooted in an interplay between conduction and radiation. For metals in particular, the combination of their high thermal conductivities and low emissivities make the conduction of heat away from heated surfaces a relatively substantial energy transfer process at thousands of Kelvin, especially for high melting point refractory metals [1-3]. This makes refractory metals ideal materials for use in nuclear fusion and additive manufacturing processes, for example, due to their ability to withstand the large temperature changes in reactors or extreme heat fluxes imparted by laser heating, respectively. A key thermal transport property of metals for these high heat flux applications is thus the thermal conductivity and, due to the large resultant temperature excursions, concerns both solid and molten phases. However, measurements of thermal conductivity during these extreme conditions are particularly challenging. This has led to a void in the fundamental understanding of the conductive processes of metals at high temperatures and in their molten phases leaving century-old theories, such as the Wiedemann-Franz law for electronic thermal conductivity [4], unvalidated for metals in this regime, and in particular in their molten state.

In this work, we report on a new measurement technique that we develop to measure the thermal conductivity of materials as a function of temperature at elevated temperatures including into their molten states. We measure the thermal conductivity of W from ~2000-4000 K using an approach we call "steady state temperature differential radiometry" (SSTDR), in which we heat the sample with a continuous wave laser source to induce steady-state conditions, and then measure the resulting temperature changes as a function of laser power perturbations via radiative pyrometry, which we then relate to the thermal conductivity via Fourier's law. By the nature of these SSTDR measurements being conducted in near steady-state conditions, the technique is a measurement of thermal conductivity, as opposed to effusivity or diffusivity measurements typical using transient or frequency domain techniques, thus avoiding the requirement of knowledge of the material's heat capacity to calculate the thermal conductivity. The nature of this technique being single sided, where the heat is sourced and temperature is measured from the same side, and the maximally heated volume being constrained to the laser spot size, allows us to induce a sustained molten pool in the middle of an otherwise solid sample, thus enabling a versatile technique for repeated measurement of thermal conductivity of

Published by the American Physical Society under the terms of the Creative Commons Attribution 4.0 International license. Further distribution of this work must maintain attribution to the author(s) and the published article's title, journal citation, and DOI.

materials in their molten states. We use this to measure the thermal conductivity, k, of molten W, an exemplary metal with the highest melting point of any elemental solid with extensively studied high temperature radiative properties allowing for a judiciously selected material for validation of SSTDR measurements [1-3,5-18]. We validate this technique via measurements of k of solid W from 2000 K up to its melting point with agreement with prior literature [1,2,10], further supporting the utility of this technique. Extending the measurement to molten W allows us to demonstrate that the thermal conductivity can be well described by application of Wiedemann-Franz law to electrical resistivity data, thus also suggesting the validity of Wiedemann-Franz law to capture the electronic thermal conductivity of metals in their molten phase. We further support this conclusion by calculating the vibrational contribution to thermal conductivity of W up through its melting point using ab initio molecular dynamics (MD) simulations, where we develop a machine-learned (ML) potential for W that is uniformly accurate from room temperature through the melting point. Our results show that at these high temperatures, the vibrational contribution to thermal conductivity is negligible compared to the electronic component, thus demonstrating that the Wiedemann-Franz law can give an accurate prediction of the thermal conductivity of W at high temperatures, including in its molten state.

The details of the equipment used in our experimental setup are described in a prior work [19,20], which describes the principles and additional specific considerations of our equipment for pyrometric sensing of temperature of laser heated solids to measure their melting point. We use this configuration, the pertinent equipment from which are shown in Fig. 1(a), and modify the laser heating profile to measure the thermal conductivity. Our W sample is a cylinder that is 1 cm in diameter and 2 mm thick. We use a high power continuous wave laser (wavelength 1064 nm, maximum power 2 kW) focused through the sapphire window on the chamber (transmissivity 0.86) down to a 3.5 mm diameter with a top-hat intensity profile to heat the sample and pressurize the chamber to 1.5 bar in Ar to minimize convective losses [21]. The temperature of the middle of the heated area on the surface of the W is measured with a high speed pyrometer at 663 nm with a 0.8 mm field of view. We control the temperature of the measured region of the laser heated W by changing the laser power, and continue to heat the sample until quasisteady-state conditions are reached, as determined from a relatively constant temperature in time. Prior to measurements, we heat the W sample through its melting point and cool to ambient several times to effectively clean and smooth the W surface in the measurement volume to ensure consistent surface conditions among measurements. We are able to sustain the melt pool in the center of the W sample for several minutes, effectively demonstrating that this



FIG. 1. (a) Schematic of experimental setup. A key in this approach is the ability to locally heat a region of the sample to its molten state while pyrometrically sensing radiance temperature in the middle of the heated region. This "self-crucible" approach then allows for thermal conductivity measurements by just sustaining melt only the middle of the sample during quasisteady-state conditions. Note, we refer to this state as a "quasi" or "near" steady-state condition since the sample has not reached a true steady state due to the slow heating of the chamber from both conduction through the sample holder and radiation from the sample surfaces; however, this temperature variation is small during the time over which we collect data for thermal conductivity analysis, and we account for this slowly varying temperature in our thermal conductivity analysis. (b) Typical thermogram of the W sample heated to achieve quasi-steadystate conditions with a molten center, with the specific onset times of melting and resolidification (i.e., "freezing") indicated in the plot. The incident laser power generating these radiance temperatures was 1.9 kW. The voltage response of our particular pyrometer was not linear with temperature until above ~1600 K radiance temperature, indicative of the nonphysical cooling response for times greater than 20 s. The minimum temperature that the pyrometer would register was ~900 K radiance temperature, thus leading to this reading at all times when the sample was below this temperature. (c) Close-up of data from (b) around the melting temperature. (d) Close-up of data from (b) around the freezing temperature. The temperature at which this thermal arrest occurs is used to determine the melting temperature of the sample.

measurement approach uses the sample as a "self-crucible" with the volume of the sample outside of the heat affected zone remaining solid. In the exemplar data shown in Fig. 1(b), we heat the W sample through its melting point, and the molten volume reaches a quasi-steady state about 10–15 s after initiation of laser heating. The time it takes for the sample to reach these quasi-steady conditions is related to the thermal diffusivity and laser spot size, which we discuss in detail in our prior works [22,23]. A clear thermal

arrest occurs in our temperature vs time profile when the sample undergoes a phase change to/from its liquid state, shown in Figs. 1(c) and 1(d). As detailed previously [22,23], we use this thermal arrest associated with the resolidification (i.e., "freezing") of the W after the laser turns off to determine the melting temperature. Using Wien's law, the true temperature can be calculated from the radiance temperature $T_{\rm rad}$ from

$$\frac{1}{T} = \frac{1}{T_{\rm rad}} + \frac{\lambda}{c_2} \ln \left[\varepsilon_{\lambda} \tau_{\lambda} \right], \tag{1}$$

where λ is the wavelength, ε_{λ} is the spectral emissivity at λ , τ_{λ} is the transmissivity of the sapphire window at the pyrometer wavelength, and $c_2 = 14\,388\,\mu\text{m K}$, from which we measure the melting temperature of our W sample as using $\varepsilon_{\lambda=663\,\text{nm}} = 0.38$ [Fig. 1(d)] from accepted values in the literature [2], yielding $T_{\text{melt}} = 3698$ K in excellent agreement with the literature ($T_{\text{melt}} = 3,707$ K) [24].

When the sample reaches quasi-steady state at the target temperature by applying a baseline incident power Q_0 , we then change the incident laser power by a perturbative $\Delta Q = Q_1 - Q_0$ until the sample reaches a new temperature $T_1 = \Delta T + T_0$. Repeating this procedure for multiple ΔQ 's, as shown in Fig. 2, allows us to determine the slope



FIG. 2. Thermograms of the radiance temperature response of W subjected to various power perturbations above the baseline power Q_0 , which was used to bring the sample up to a quasisteady baseline temperature. The ΔQ perturbations result in a ΔT above the baseline temperature that is used to calculate the thermal conductivity of the sample. We note that over the course of collecting a series of data (various thermograms of ΔT), slow temperature rises due to delayed equilibration of the chamber lead to increases in the baseline temperature of the sample (T_0). This is apparent from the difference in radiance temperature of the W from $Q_{0,initial}$ to $Q_{0,final}$, which were collected using identical powers after 10 successive scans spanning about 30 minutes. Thus, ΔT_{rad} is determined by interpolating between temperatures at times before and after the change in temperature driven by ΔQ .

of the line $\Delta T = A \Delta Q$, which is related to the solution to the steady-state heat equation. This problem can be solved analytically assuming a semi-infinite sample, insulative boundary conditions, and a circular heated region that is on the surface of the sample with a radius of r_L , given by [25] $\Delta T = \Delta Q_A / (\pi r_L k)$, which is the temperature increase in the center of the heated region and Q_A is the absorbed power. However, given the finite thickness of the sample relative to the thermal gradient, and the radiative losses at the front and back surfaces, we numerically solve the cylindrical heat equation for a finite thickness slab in steady state using an approach detailed previously [22,23], modified to account for a top-hat spatial profile of the laser heater. The measured radiance temperatures are corrected to true temperature values via the use of temperature dependent spectral emissivity values at our pyrometer wavelength from literature [2]. Under these quasi-steadystate conditions, we assume the emissivity equals the absorptivity A to determine the absorbed laser power at the samples surface, which we take from the literature for polished W [2]; note, our experiments for thermal conductivity are conducted after several iterations of melting the W surface in situ to ensure a specular and clean surface.

In our experiments, the finite size of the sample and radiative boundary conditions (i.e., radiation from surfaces) must be taken into account. We utilize Stefan-Boltzmann's law to calculate the radiative losses emitted from the sample surfaces. The measured temperature rise on the surface of the sample is a result of the absorbed laser power. This absorbed heat flux is split into two modes of heat transport, conduction, and radiation, so that $Q_A = Q_{cond} + Q_{rad}$. In order to determine the thermal conductivity of the material we must determine Q_{cond} . Based on the measured true temperature rise ΔT , we use Stefan-Boltzmann's law along with an estimated distribution of radial temperatures to determine the emitted power Q_{rad} . For the small, perturbed temperatures and the relatively fast measurement times of our experiments, we assume the ambient temperature difference between T_1 and T_0 is negligible. Thus, $Q_{\rm rad} = \varepsilon \sigma (T_1^4 - T_0^4)$. To account for these radiative surface losses, we calculate the temperature distributions on the front and back surfaces from solutions to the cylindrical heat equation applied to a finite cylinder with a circular, surface heat source that is detailed in prior works [26,27]. For solid W, we calculate the radial temperature distribution by assuming a constant temperature (which is the temperature measured by the pyrometer) from the center of the laser spot to $0.55r_L$, and then use a logarithmic temperature distribution for $\Delta T(r)$ that decays to 25% of the center temperature at the outer edge of the 1 cm sample. We assume the same radial temperature distribution for the rear surface temperature, which is opposite the surface on which the laser is applied, only the temperature is 1/3 that of the front side. For the molten measurement, in which the sample is only in its molten state in the laser heated volume,



FIG. 3. Measured thermal conductivity of solid and molten W from this work (fill and open circles, respectively) compared to accepted values from the literature for both solid [1] and molten states [10]. The previously reported accepted value for the thermal conductivity of molten W from Tolias *et al.* [10] is derived from the Wiedemann-Franz law applied to electrical resistivity data.

the rear temperature is 1/4.5 that of the front side temperature in the radial portion of the sample. With these front and rear surface temperature gradients, we then integrate Stefan-Boltzmann's law over each surface while accounting for the temperature dependent total emissivity [2] of the material to determine $Q_{\rm rad}$ emitted by the sample.

The measured thermal conductivity of the W sample as a function of temperature is shown in Fig. 3 up to and above its melting temperature. For the solid phase, we plot the recommended values for the thermal conductivity of W tabulated in the literature [1], which agree well with our measurements. We are not aware of any prior measurements of the thermal conductivity of molten W that were not derived from electrical resistivity measurements via the Wiedemann-Franz law, and thus our measurement offers a unique opportunity to validate the Wiedemann-Franz law for molten tungsten. Tolias et al. and Pottlacher [9,10] report recommended values for the electrical resistivity of molten W at temperatures near the phase transition of $\rho =$ 134 $\mu\Omega$ cm and $\rho = 137 \ \mu\Omega$ cm, respectively. Using $L_0 =$ $2.443 \times 10^{-8} \ W \, \Omega \, K^{-2}$ as the Lorenz number in the Wiedemann-Franz law $(k_e = L_0 T / \rho$, where k_e is the electronic thermal conductivity) [4] yields a thermal conductivity of 68–70 W m⁻¹ K⁻¹. Tolias *et al.* [10] further expounds upon their molten W thermal conductivity report to recommend a value of $66.6 \pm 8.2 \,\mathrm{W \, m^{-1} \, K^{-1}}$ and discontinuity in k across the solid-liquid phase transition of 20.4 W m⁻¹ K⁻¹. This is in agreement with our measured value of 57.0 \pm 11.0 W m⁻¹ K⁻¹ with a similar reduction in thermal conductivity from the solid to molten state within our experimental uncertainty. Taken together, our measurements strongly support the validity of the Wiedemann-Franz law and the use of L_0 applied to W in its molten state.

We further validate our assertion that the Wiedemann-Franz law is suitable to calculate the thermal conductivity of high temperature W by determining the lattice contribution to the total thermal conductivity of W through ab initio MD simulations, where we develop a ML potential for W that is uniformly accurate over the entire range of temperatures from room temperature up through the melting point (see Supplemental Material for details) [28–36]. These ML-MD simulated phonon thermal conductivities of W are shown in Fig. 4, and only contribute < 5% to the total thermal conductivity of W at these high temperatures with the phononic contribution decreasing with increasing temperature up to the melting temperature. In the molten state, the vibrational thermal conductivity is ~0.5 W m⁻¹ K⁻¹, contributing < 1% to the thermal conductivity. Note, this relatively negligible vibrational contribution is not the case at lower temperatures (i.e., room temperature) where the phonon contribution to the thermal conductivity of W can contribute $\sim 30\%$, as predicted by our ML-MD simulations and consistent with prior works



FIG. 4. ML-MD simulated vibrational thermal conductivities of solid (phonons) and molten (vibrations) W compared to data presented in Fig. 3 (data symbols the same as in Fig. 3). The vibrational component to the thermal conductivity of W only contributes < 5% to the total thermal conductivity above 2000 K with the phononic contribution decreasing with increasing temperature up to the melting temperature, indicating the phononic thermal conductivity at these elevated temperatures is decreasing due to anharmonic phonon-phonon interactions. In the molten state, the vibrational thermal conductivity is ~0.5 W m⁻¹ K⁻¹, contributing < 1% to the thermal conductivity. At these elevated temperatures above $T_{\text{melt}}/2$, the vibrational contribution is effectively suppressed leading to the thermal conductivity of W being dominated by electrons, thus resulting in the Wiedemann-Franz law proving an accurate route to calculate the thermal conductivity.

[8]. This dramatically high phonon contribution to thermal conductivity in tungsten is attributed to the high degree of symmetry of its Fermi surface. However, at these elevated temperatures above $T_{\text{melt}}/2$, the vibrational contribution is effectively suppressed leading to the thermal conductivity of W being dominated by electrons, thus resulting in the Wiedemann-Franz law proving an accurate route to calculate the thermal conductivity. Above T_{melt} , the absence of long-range order precludes phonons from being supported, the vibrational contribution to thermal conductivity is effectively suppressed, and heat transfer is limited to the effects of nearest neighbor potentials on acoustically propagating density fluctuations [37]. However, at these elevated temperatures of interest in this work, the absence of long-range order precludes traditional phonons from being supported by the metal lattice. This $\sim 1.5 \text{ W m}^{-1} \text{ K}^{-1}$ drop in vibrational thermal conductivity does not, however, account for the \sim 20–30 W m⁻¹ K⁻¹ reduction observed in the total thermal conductivity. Since the resulting total thermal conductivity of W is thus dominated by electrons. the Wiedemann-Franz law proves to be an accurate route to calculate the change in thermal conductivity across the molten transition temperature.

In general, given the relatively low phononic contribution to thermal conductivity in most metals, the changes in thermal conductivity across the melting temperature of metals will be mostly dominated by the changes in electron thermal conductivity, which will be driven, at least in part, by changes in electron-phonon scattering rates. While W exhibits a relatively modest decrease in thermal conductivity due to its already relatively high electron-phonon scattering rates in the solid phase [38], the highly conductive, free electron metals with intrinsically low electronphonon scattering rates in their solid phases [38], such as gold and copper, exhibit dramatically greater drops in thermal conductivity across solid to liquid transitions [39], exceeding a 50% reduction, due to the larger increase in electron-ion scattering rates.

In conclusion, we measure the thermal conductivity of solid and molten tungsten using SSTDR. We demonstrate that the thermal conductivity can be well described by application of the Wiedemann-Franz law using the Lorenz number L_0 . We further support this conclusion using ab initio MD simulations with a machine-learned potential. Our conclusions are enabled through the development of SSTDR as a measurement technique for determination of thermal conductivity, which allows for a measure of thermal properties without relying on the interpretation of electrical resistances. This technique could offer an approach to measure the thermal properties of electrically insulating materials at high temperatures, including during melting and in their molten states. With the integration of additional spatial and spectral pyrometric sensors with increased temporal resolution into this apparatus, this technique can be extended to measure heat capacity,

emissivity, and latent heat of materials at high temperatures and during solid-liquid transitions.

We appreciate support from the Office of Naval Research, Grants No. N00014-22-1-2139, No. N00014-21-1-2622, and No. N00014-23-1-2630. P. E. H. acknowledges support from the Alexander von Humboldt Foundation for partially supporting his work at the European Commission, Joint Research Centre in Karlsruhe, Germany.

^{*}These two authors contributed equally.

[†]Present address: Delft University of Technology, Faculty of Applied Sciences, Department of Radiation Science and Technology, Delft, 2628, Netherlands. [‡]phopkins@virginia.edu

- [1] C. Y. Ho, R. W. Powell, and P. E. Liley, J. Phys. Chem. Ref. Data 1, 279 (1972).
- [2] Y. S. Touloukian and D. P. DeWitt, *Thermophysical Proper*ties of Matter–Thermal Radiative Properties: Metallic Elements and Alloys (IFI/Plenum, New York, 1970), Vol. 7.
- [3] R. D. Allen, L. F. Glasier, and P. L. Jordan, J. Appl. Phys. 31, 1382 (1960).
- [4] G. Wiedemann and R. Franz, Ann. Phys. (N.Y.) 165, 497 (1853).
- [5] A. J. Sievers, J. Opt. Soc. Am. 68, 1505 (1978).
- [6] G. Grimvall, M. Thiessen, and A. F. Guillermet, Phys. Rev. B 36, 7816 (1987).
- [7] L. G. Wang, A. van de Walle, and D. Alfe, Phys. Rev. B 84, 092102 (2011).
- [8] Y. Chen, J. Ma, and W. Li, Phys. Rev. B 99, 020305(R) (2019).
- [9] G. Pottlacher, *High Temperature Thermophysical Properties of 22 Pure Metals* (edition keiper, 2010).
- [10] P. Tolias and EUROfusion MST1 Team, Nucl. Mater. Energy 13, 42 (2017).
- [11] T. Matsumoto, A. Cezairliyan, and D. Basak, Int. J. Thermophys. 20, 943 (1999).
- [12] R. Bedford, G. Bonnier, H. Maas, and F. Pavese, Metrologia 33, 133 (1996).
- [13] A. Cezairliyan, A. P. MIller, F. Righini, and A. Rosso, in *Temperature. Its Measurement and Control in Science and Industry* (American Institute of Physics, New York, 1992).
- [14] A. Cezairliyan and J. McClure, J. Res. Natl. Bereau Stand. A 75, 283 (1971).
- [15] A. Cezairliyan, S. Krishanan, and J. L. McClure, Int. J. Thermophys. 17, 1455 (1996).
- [16] A. P. Miiller and A. Cezairliyan, Int. J. Thermophys. 14, 511 (1993).
- [17] R. D. Larrabee, J. Opt. Soc. Am. 49, 619 (1959).
- [18] E. Brodu, M. Balat-Pichelin, J.-L. Sans, and J. Kasper, Acta Mater. 84, 305 (2015).
- [19] D. Manara, L. Soldi, S. Mastromarino, K. Boboridis, D. Robba, L. Vlahovic, and R. Konings, J. Vis. Exp. 14, 54807 (2017).
- [20] O. Cedillos-Barraza, D. Manara, K. Boboridis, T. Watkins, S. Grasso, D. D. Jayaseelan, R. J. M. Konings, M. J. Reece, and W. E. Lee, Sci. Rep. 6, 37962 (2016).

- [21] T. R. Pavlov, D. Staicu, L. Vlahovic, R. J. M. Konings, P. Van Uffelen, and M. R. Wenman, Int. J. Thermal Sci. 124, 98 (2018).
- [22] J. L. Braun, D. H. Olson, J. T. Gaskins, and P. E. Hopkins, Rev. Sci. Instrum. 90, 024905 (2019).
- [23] J. L. Braun, C. J. Szwejkowski, A. Giri, and P. E. Hopkins, J. Heat Transfer 140, 052801 (2018).
- [24] D. R. Lide, CRC Handbook for Chemistry and Physics, 89th ed. (Internet Version, CRC Press/Taylor and Francis, Boca Raton, FL, 2008).
- [25] H. S. Carslaw and J. C. Jaeger, Application to surface heating of a semi-infinite region. III. Heat supply at the rate q per unit time per unit area for t > 0 over the circle $x^2 + y^2 < a^2$, z = 0, p. 264, in *Conduction of Heat in Solids*, 2nd ed. (Oxford University Press, New York, 1959), Sec. 10.5, p. 264.
- [26] N. Y. Olcer, Br. J. Appl. Phys. 18, 89 (1967).
- [27] W. T. Laughlin and R. C. Vrem, Air Force Weapons Laboratory Technical Report No. AFWL-TR-72-236, 1973.
- [28] See Supplemental Material at http://link.aps.org/ supplemental/10.1103/PhysRevLett.132.146303 for details on density functional theory-molecular dynamics (DFT-MD), training dataset, training, standard MD, Green-Kubo simulations, and thermal conductivity vs electrical conductivity of tungsten, which includes Refs. [10,29–36].

- [29] P. Giannozzi *et al.*, J. Phys. Condens. Matter **21**, 395502 (2009).
- [30] R. Martoňák, A. Laio, and M. Parrinello, Phys. Rev. Lett. 90, 075503 (2003).
- [31] H. Wang, L. Zhang, J. Han, and E. Weinan, Comput. Phys. Commun. 228, 178 (2018).
- [32] M. Abadi *et al.*, TensorFlow: Large-scale machine learning on heterogeneous systems (2015), software available from https://www.tensorflow.org/.
- [33] A. P. Thompson, H. M. Aktulga, R. Berger, D. S. Bolintineanu, W. M. Brown, P. S. Crozier, P. J. in't Veld, A. Kohlmeyer, S. G. Moore, T. D. Nguyen *et al.*, Comput. Phys. Commun. **271**, 108171 (2022).
- [34] K. He, X. Zhang, S. Ren, and J. Sun, in Proceedings of the IEEE Conference on Computer Vision and Pattern Recognition (2016), pp. 770–778.
- [35] Q. Zheng, A. B. Mei, M. Tuteja, D. G. Sangiovanni, L. Hultman, I. Petrov, J. E. Greene, and D. G. Cahill, Phys. Rev. Mater. 1, 065002 (2017).
- [36] R. E. B. Makinson, Math. Proc. Cambridge Philos. Soc., 34, 474 (1938).
- [37] A. Z. Zhao and J. E. Garay, Prog. Mater. Sci. 139, 101180 (2023).
- [38] Z. Lin, L. V. Zhigilei, and V. Celli, Phys. Rev. B 77, 075133 (2008).
- [39] G. Pottlacher, J. Non-Cryst. Solids 250-252, 177 (1999).