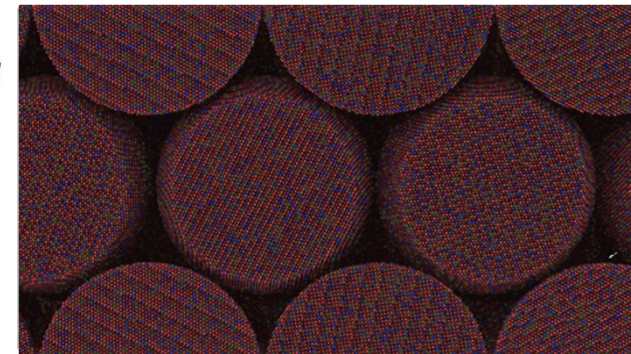
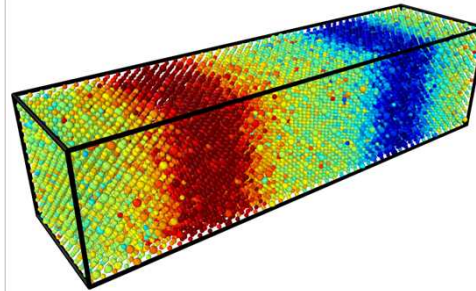
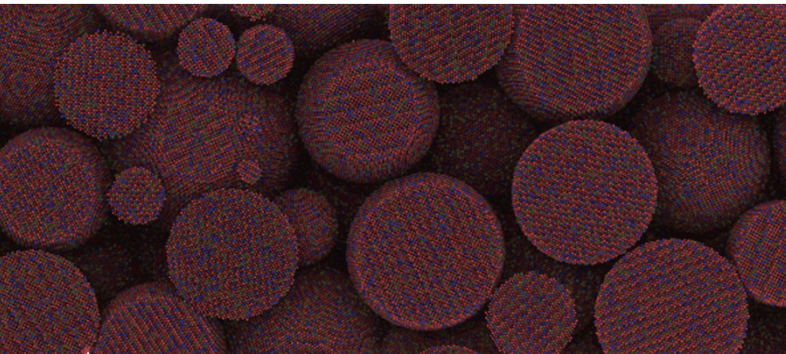


Exceptional service in the national interest



Thermal Conductivity within Nanoparticle Powder Beds

Solid Freeform Fabrication Symposium, August 10th 2016

Mark Wilson, Michael Chandross

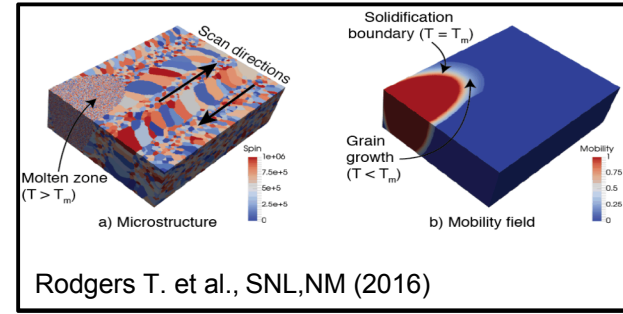
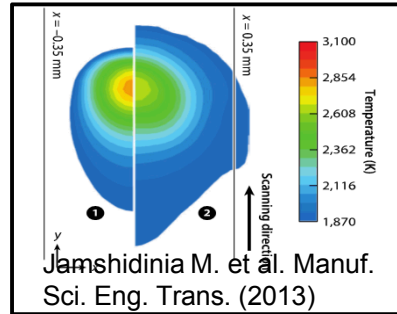
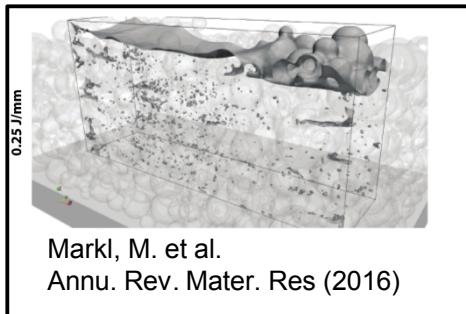
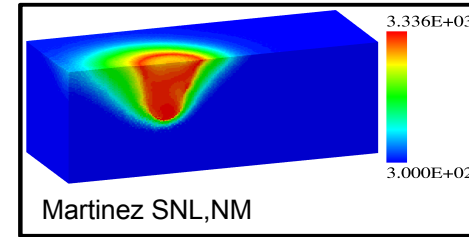
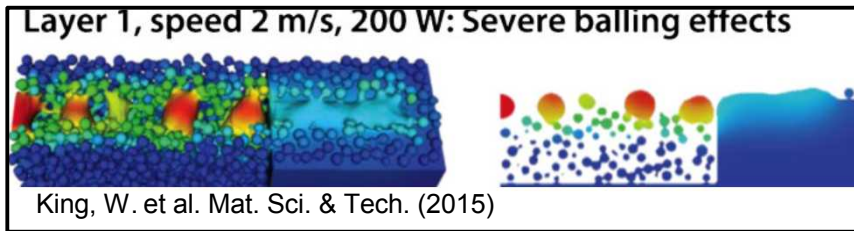
Computational Materials and Data Science



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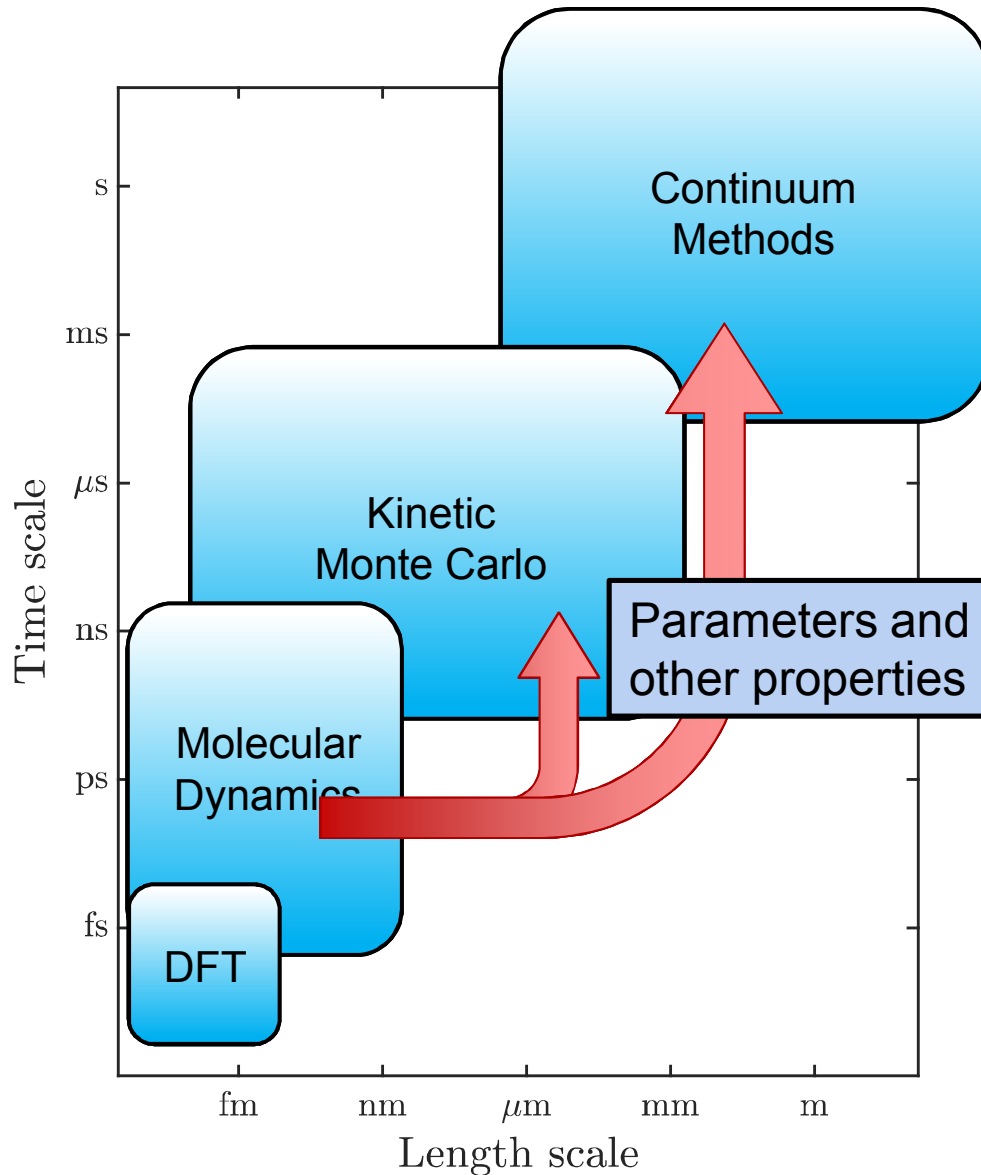
Motivation

- Evolution of AM is challenged by process and quality issues, typically a function of control parameters, determined by a trial-and-error method.
- Modeling of the AM process powder beds are modeled at Thermo/mechanical continuum levels

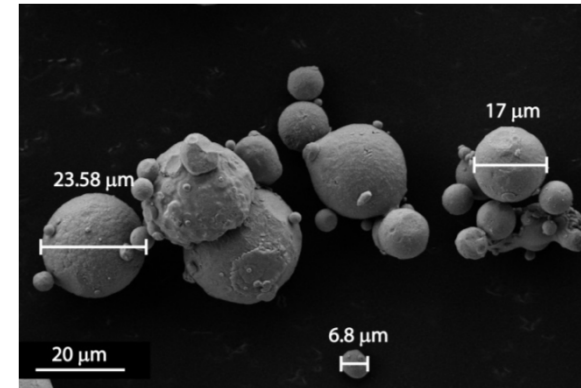


- Gain a better understanding of thermal conduction within powder beds, beyond the continuum representation. Is this important? If so, to what degree?
- Molecular dynamics (MD) challenges to consider
 - Electron-mediated heat transfer is important in metals – Two Temperature Model (TTM)
 - Scale ...

Modeling scale



- MD scale is substantially smaller than the "part" scale



Manfredi, D. et al.

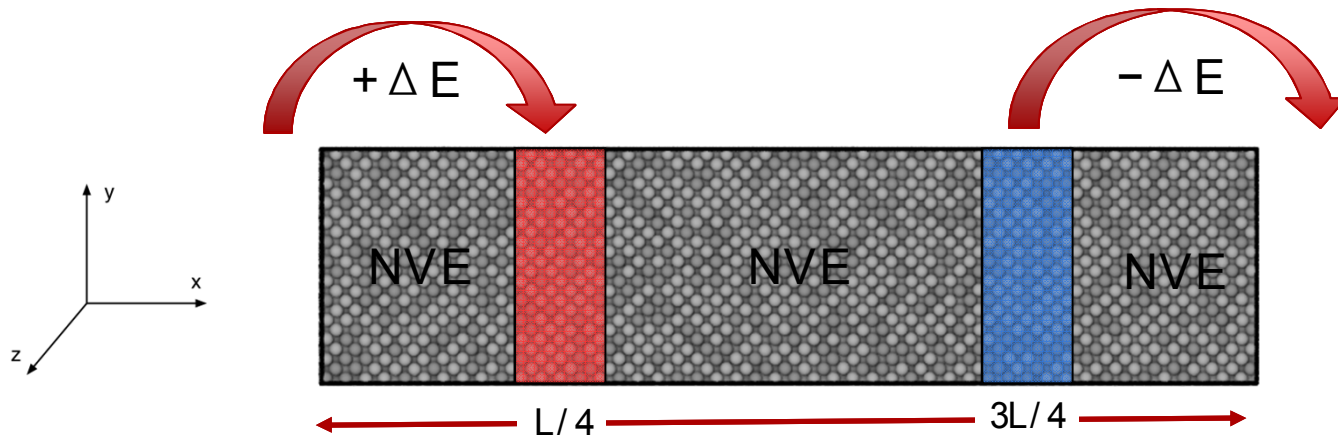
- Extrapolate to larger scales
- Goal: Inform other modeling approaches at various length and time scales
- Provide material specific parameters for upscale models

Methodology

- Fourier's law of thermal conduction for small temperature gradients

$$J = -\kappa \nabla T$$

- Valid for all states of matter

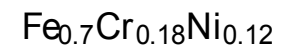


- Heat flux is applied through a velocity renormalization method, conserving net linear momentum

$$J = \frac{\Delta E}{\Delta t 2A} \text{ [W/m}^2\text{]} \quad \kappa = -\frac{J/A}{\partial T / \partial L}$$

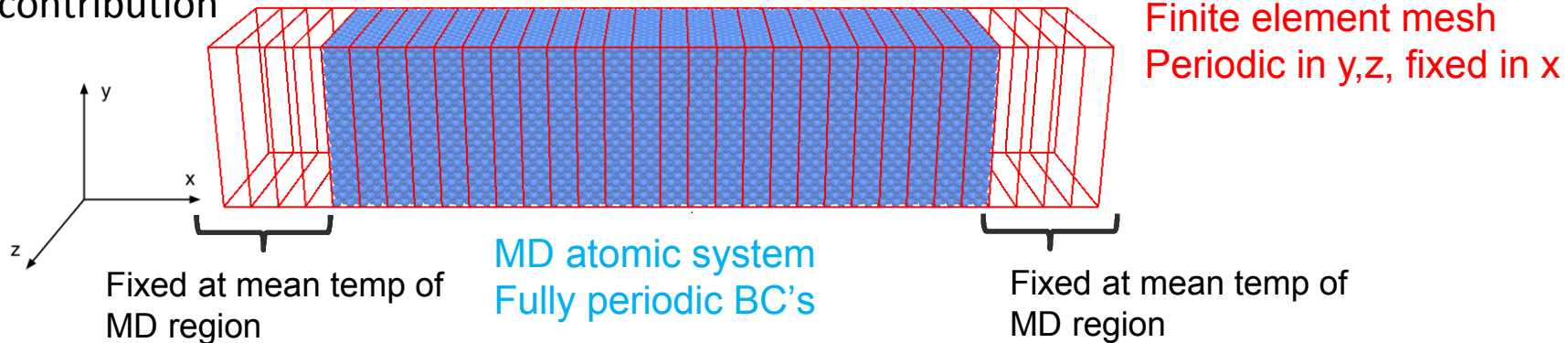
- System undergoes Newtonian dynamics through an NVE ensemble

Potential	lattice
Fe (Mendelev)	bcc
Al (Zhou)	fcc
304L SS (Bonny)	fcc



Two temperature model

- Spatial discretization of FE on top of MD system, implicitly model electronic contribution



- Electronic system and energy coupling between the two system is governed according

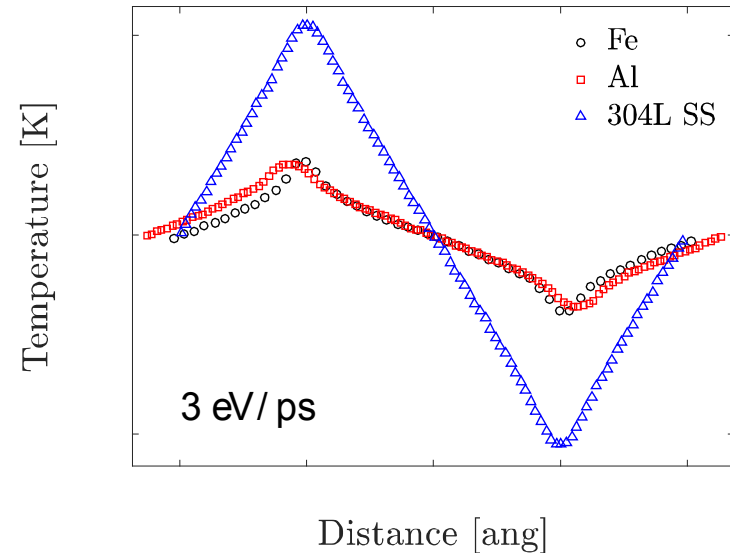
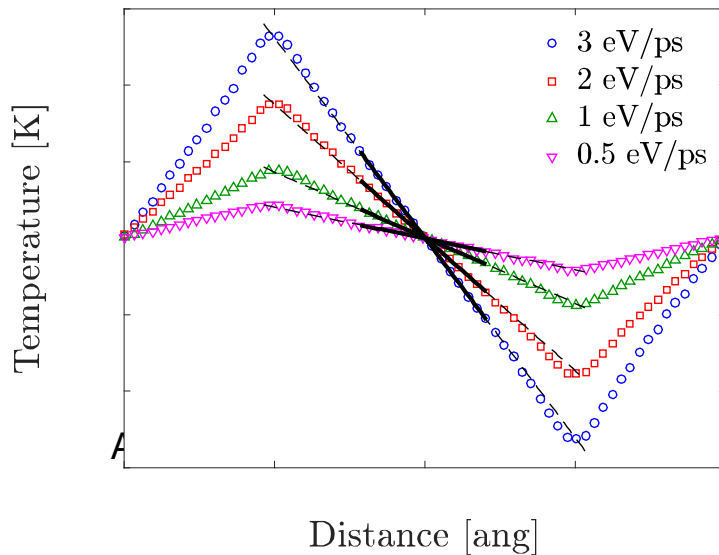
$$C_e \rho_e \frac{\partial T_e}{\partial t} = \nabla \cdot (K_e \nabla T_e) - g_{e-p}(T_e - T_a) + \rho_e S_e$$

$$C_p \rho_p \frac{\partial T_p}{\partial t} = \nabla \cdot (K_p \nabla T_p) + g_{e-p}(T_e - T_a)$$

- Parameterization

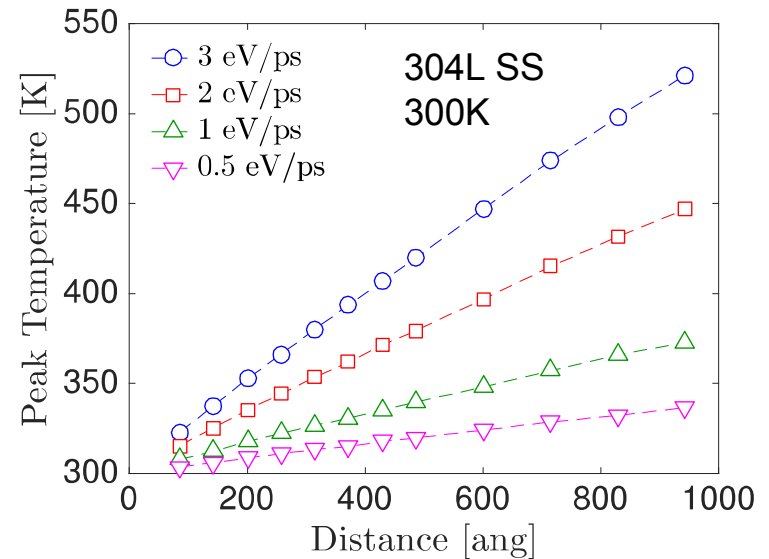
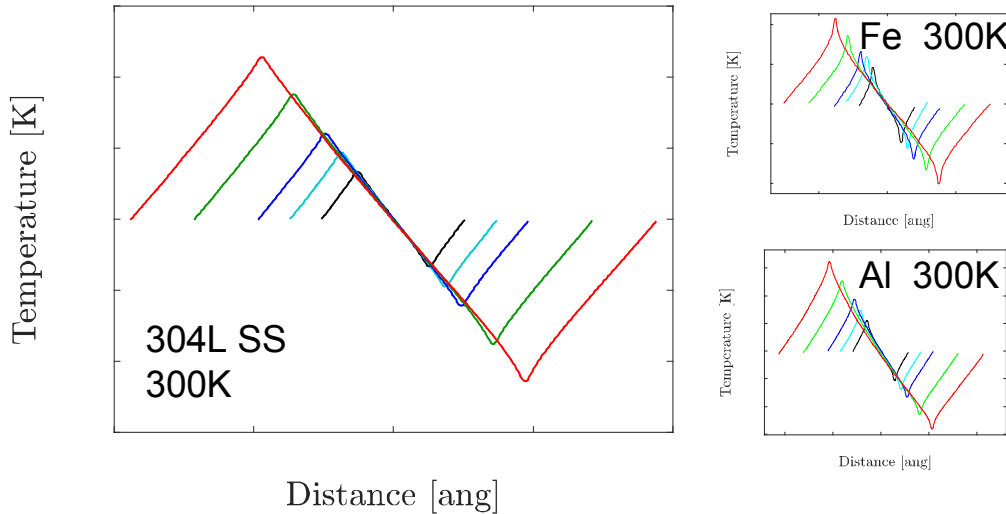
- | | | |
|--------------|--------------|--|
| $C_e \rho_e$ | $C_p \rho_p$ | ▪ Heat capacity: estimated from free electron density (electronic), Dulong-Petit law (phonon) |
| K_e | K_p | ▪ Thermal conductivity: Franz-Wiedemann law (electronic), direct method MD (phonon) |
| g_{e-p} | | ▪ Electron-phonon coupling: DFT calculations of electronic DOS, pump-probe experiments |

Phonon heat conduction results



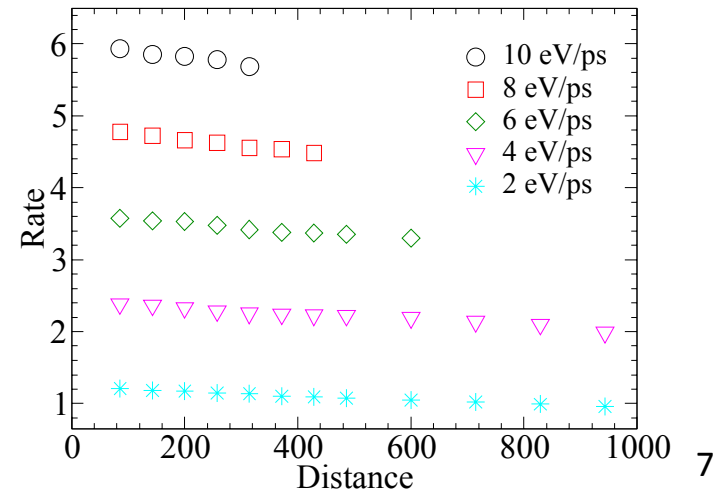
- Determination of temperature profile discretizes the MD simulation spatially along the x axis
- The error in calculated conductivity resides in determination of slope of thermal profile Zhou. X., et al, Phys Rev B. (2009)
- Profile shape gives indications of general thermal behavior of system
 - Greater temp at extrema - slower energy transfer
 - Linear profile – slower energy transfer

Phonon system size effects

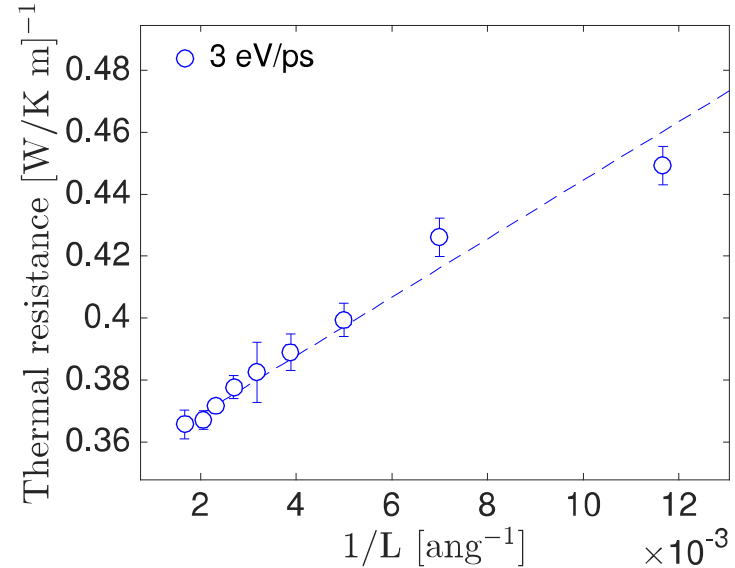
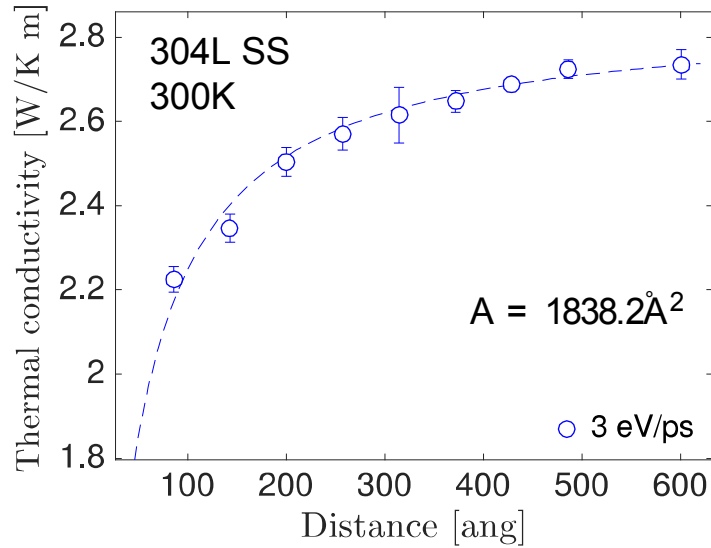


- Employ direct method over multiple system sizes
- Peak temperature indicates strong dependent on system size
- Rate of energy transfer through material

$$R_t = \frac{Q}{t} = \kappa A \frac{(T_{\text{source}} - T_{\text{sink}})}{D}$$



Phonon system size effects



- Extrapolate to bulk properties – Matthiessen rule

$$\frac{1}{\kappa} = \frac{1}{\kappa_{\infty}} + \frac{\alpha}{L}$$

$$\frac{1}{\kappa} = \frac{2}{nk_B v} \left(\frac{1}{\ell_{MFP}} + \frac{4}{L} \right)$$

- Mean free path, group velocity of acoustic phonon can be determined under a simple model

Heino, P., Microelectronics J., (2003)

Potential	lattice	v [m/s]	v _{exp} [m/s]	ℓ _{MFP} [nm]
Fe (Mendelev)	bcc	5766	5130	9.32
Al (Zhou)	fcc	5100	5939	4.48
304L SS (Bonny)	fcc	6225	5790	7.6

Temperature / flux dependence

Potential	lattice	Temp [K]	κ_p [W/ m K]	κ_p [W/ m K]	κ_{exp} [W/ m K]	T_D [K]
Fe (Mendlev)	bcc	300	32.5	-	80	420
Al (Zhou)	fcc	300	10.8	≈ 6	205-240	394
304L SS (Bonny)	fcc	300	2.92	-	14.0-16.3	468

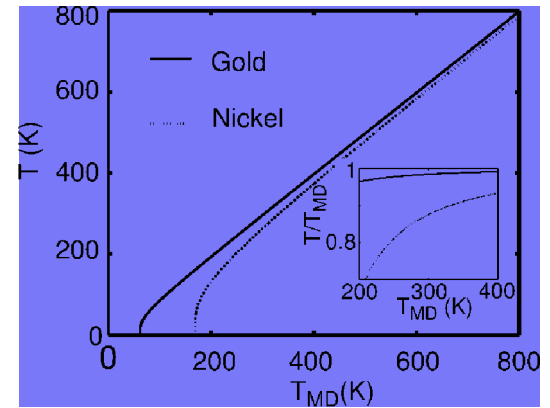

 This work

Jain A. et al, Phys Rev B. (2016) – κ_p

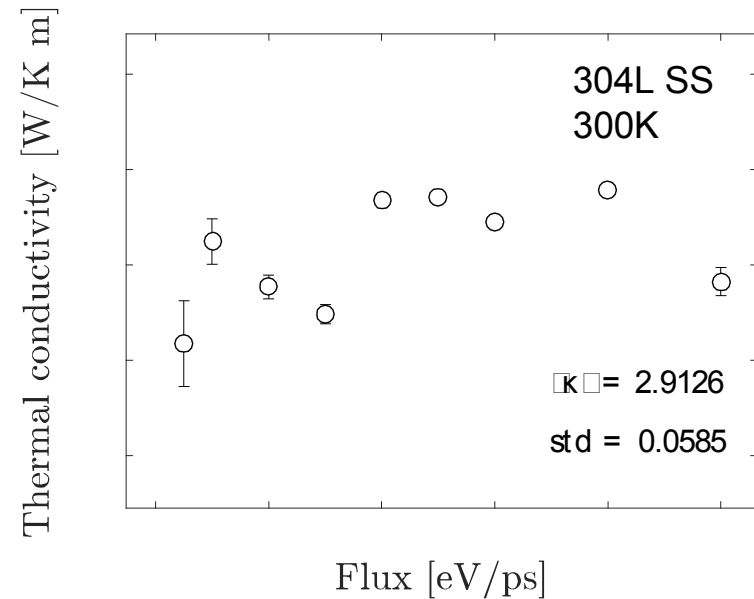
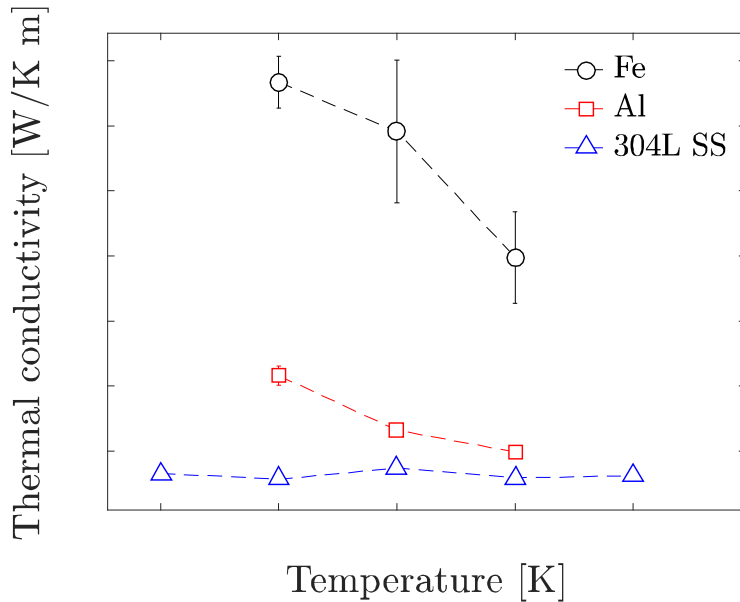
Ashcroft and Mermin – T_D

Graves R.S. et al, Int J Thermo. (1991) – 304L κ_{exp}

Winter J., et al, Phys Rev B (2016) – 304L T_D



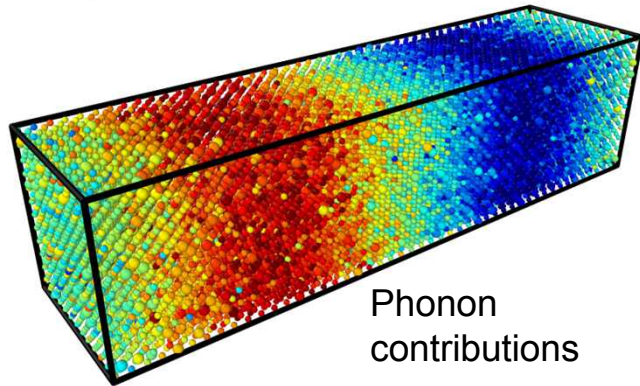
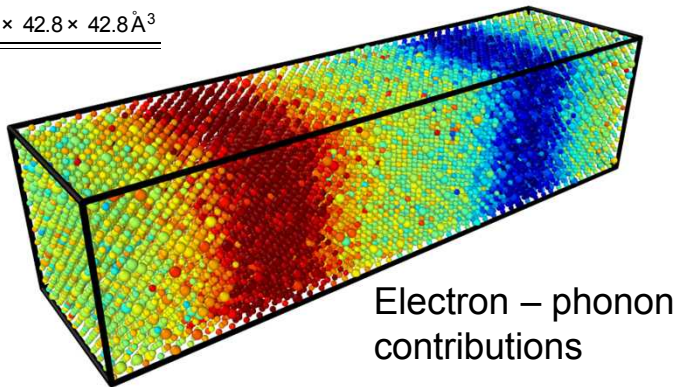
Heino, P., et al, Microelectronics J., (2003)



Comparison with TTM

$\approx 30,000$ atoms

$171.5 \times 42.8 \times 42.8 \text{ \AA}^3$



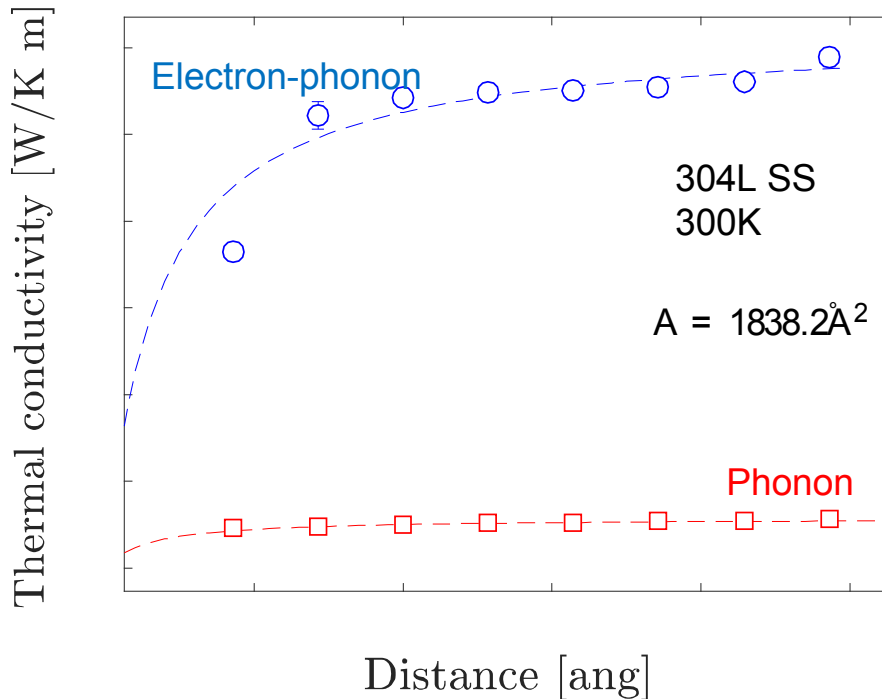
Temperature [K]

304L SS
300K

- Shape of the thermal profile indicates improved conductance with the addition of the TTM
- Increased heat flux is necessary to achieve similar resultant slope

$$\kappa = - \frac{J/A}{\partial T / \partial L}$$

Comparison with TTM

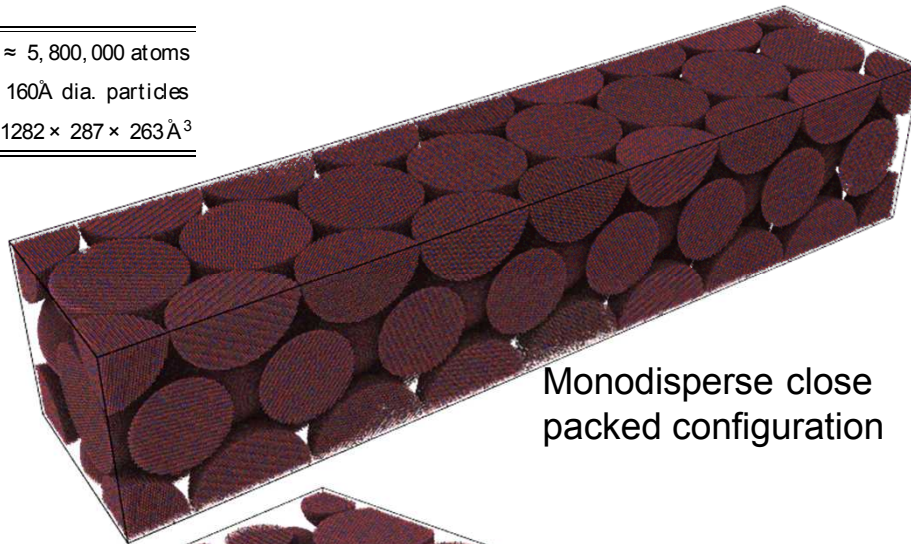


- Observe a plateau region for 304L SS, suggesting that distance dependence maybe less important when including TTM
- Elevated conductivity results from TTM. Considerations:
 - Correct parameterization of TTM?
 - Free electron density - $C_e \rho_e$
 - Temperature relative to Debye temperature

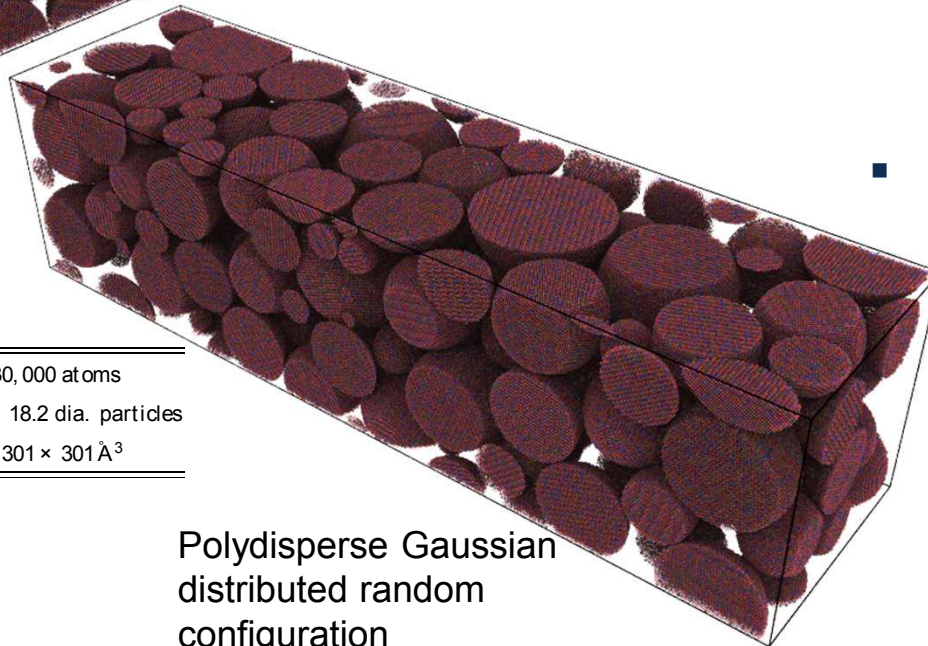
Potential	lattice	temp [K]	κ_p [W/ m K]	κ_{TTM} [W/ m K]	κ_{exp} [W/ m K]
Fe (Mendlev)	bcc	300	32.5		80
Al (Zhou)	fcc	300	10.8	$321.98 \pm 12.01(800\text{\AA})$	205-240
304L SS (Bonny)	fcc	300	2.92	31.02 ± 0.96	14.0-16.3

Nanoparticle powder beds

$\approx 5,800,000$ atoms
 160\AA dia. particles
 $1282 \times 287 \times 263 \text{\AA}^3$



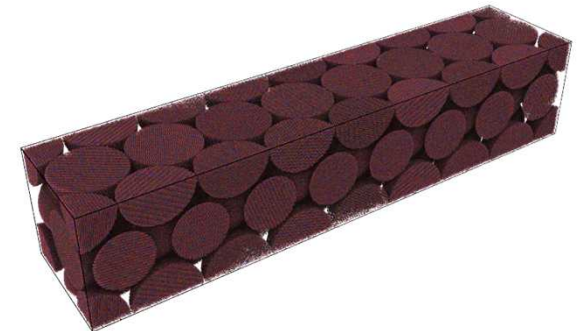
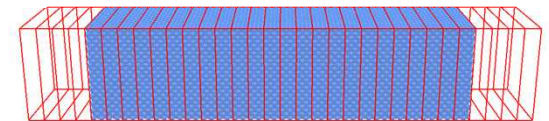
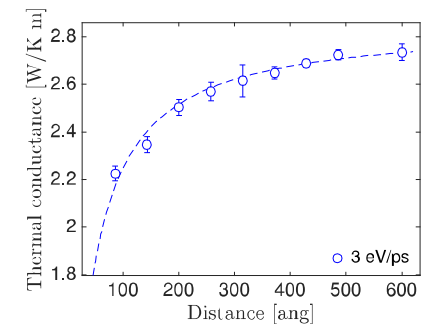
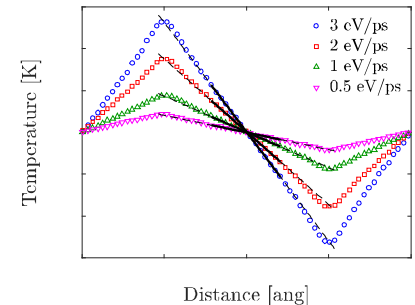
$\approx 5,730,000$ atoms
 $< 41.8 > \text{\AA} \pm 18.2$ dia. particles
 $1152 \times 301 \times 301 \text{\AA}^3$



- Approach for creation of atomistic powder bed, initial configuration
- Mono/poly disperse configurations
- GOAL: Extrapolation of results to micrometer scales, using a similar approach to the determination of bulk conductivity properties
- Observations / considerations:
 - Small dia. particles leads to cohesive polycrystalline material at temperature.
 - Parameterization of TTM model, decrease in the number of free electrons
 - Discontinuous nature of configuration leads to decreased phonon contribution to conductivity

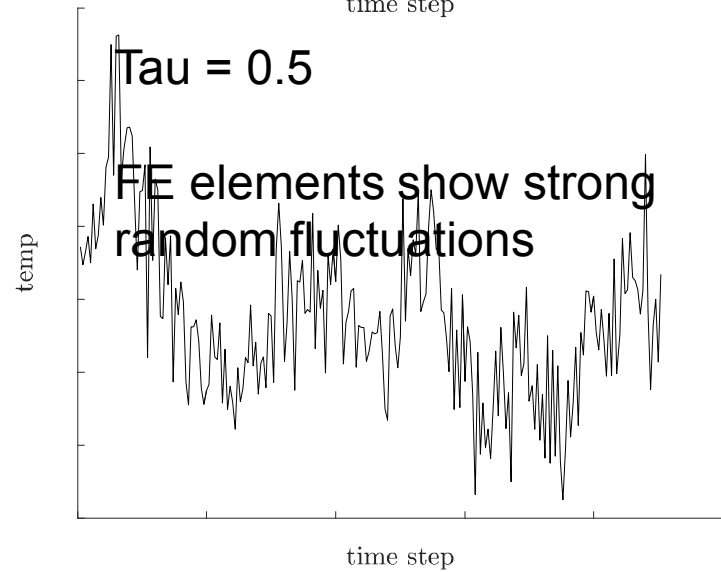
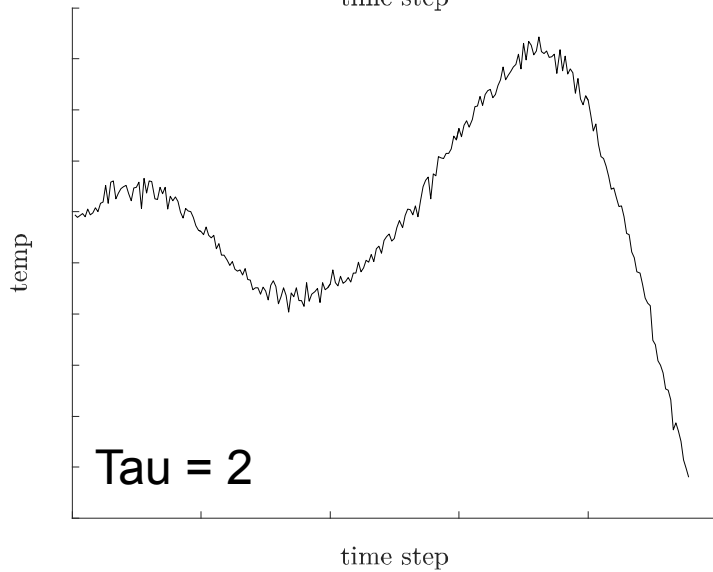
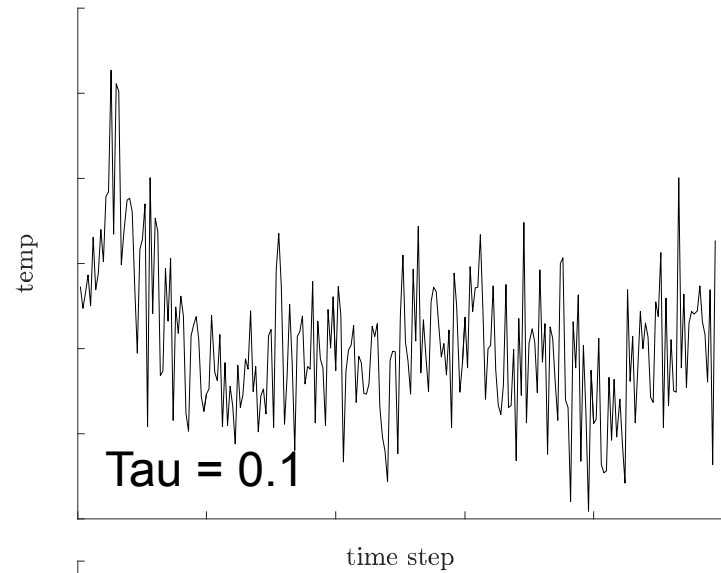
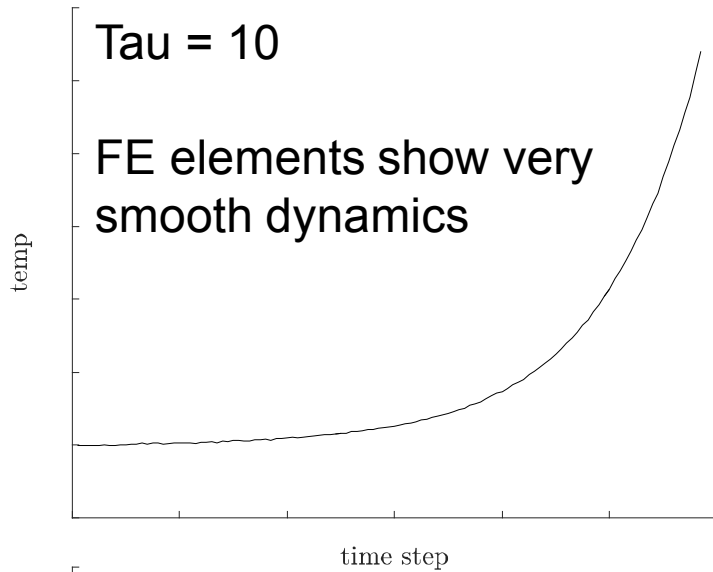
Summary

- Utilize MD and the “direct method” to study thermal conduction within crystalline metallic systems
- Showed that resulting conductance values can be extrapolated to bulk system properties utilizing a simple model of thermal resistivity
- Introduced a two-temperature model, so as to incorporate electronic contributions to thermal conductance
- Initial results indicate that the model overshoots experimental conductance values
- Approach to studying thermal conductivity within powder beds was discussed



Time filtering

Aluminum: G_{e-p} times a factor of 10;
Equilibrium conditions -- No heat source



Time filtering

Aluminum: G_{e-p} known value;
Equilibrium conditions -- No heat source

