



# Atomistic-to-Continuum Modeling for Multi-scale and Multi-physics Computations

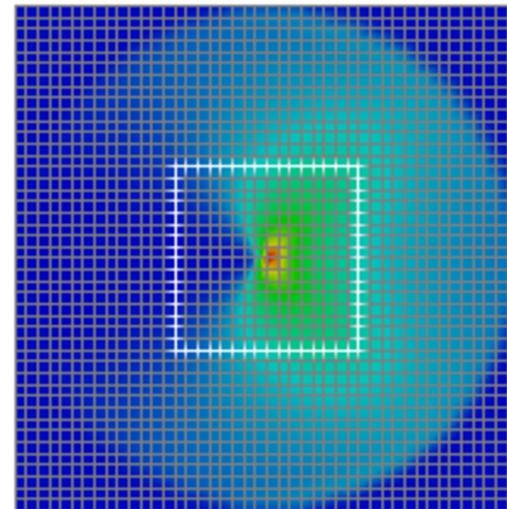
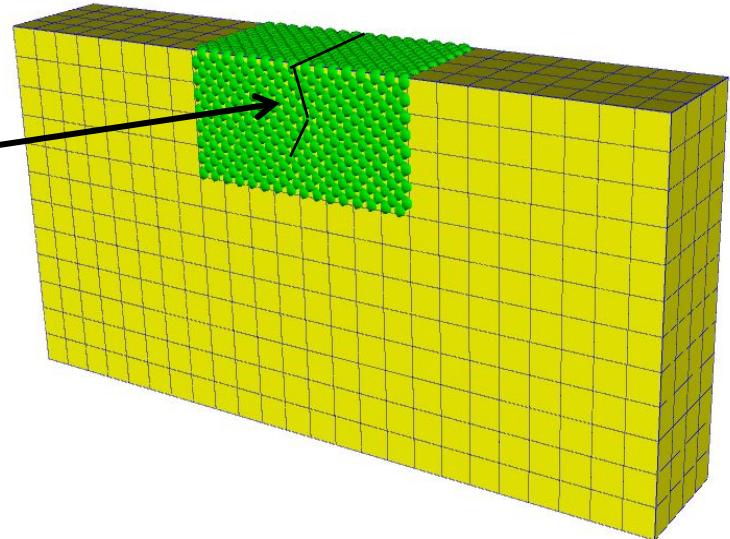
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Bay Area Scientific Computing Day 2011  
Stanford University



# Motivation

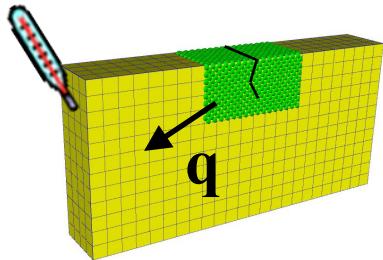
- Provide a unified computational framework for finite element (FE) and an molecular dynamics (MD) for problems in which atomistic description of material is needed only for a localized region and the dynamical interactions between the FE and MD are important for understanding the system
  - MD cost to simulate entire system atomistically would be prohibitive
  - Dual Statement: FE constitutive models are not of sufficient fidelity for all of the system
- Apply boundary conditions and sources to MD to enable engineering simulation of nanosystems analogous to FE analysis
- Enhance MD with multiphysics capabilities mediated by a FE model
  - Electron transport effects augmenting classical MD
  - Electric field modeling for long-range interactions
- Learn something!
  - On-the-fly Hardy post-processing
  - Think before you simulate



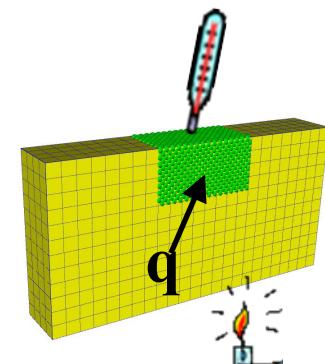


## Two-Way Coupling for Heat Transfer

Goal: Coupling strategy that allows both fine-to-coarse scale heat transfer and coarse-to-fine scale heat transfer



**Fine-to-coarse:** Fine scale vibrational energy from the MD region should flow into the surrounding FE region and be accounted for as temperature



**Coarse-to-fine:** Temperature of the FE model ( $\theta$ ) should have an effect on the MD region, through e.g. thermal excitation of atoms

### **Two interdependent parts of coupling strategy:**

1. Modification of finite element equation to incorporate effects of atoms on  $\theta$
2. Thermostat to enforce temperature field  $\theta$  at atoms



## Continuum Heat Equation

- Heat equation with Fourier heat conduction arising from Boltzmann Transport equation for energy conservation:

$$\rho c_v \frac{\partial \theta}{\partial t} (\mathbf{x}, t) = \nabla \cdot (\kappa \nabla \theta (\mathbf{x}, t))$$

- Finite element discretization leads to a set of ODE's for the nodal temperatures

$$\theta^h (\mathbf{x}, t) = \sum_I N_I (\mathbf{x}) \theta_I (t) \implies \mathbf{M} \dot{\theta} = \mathbf{K} \theta$$

$$M_{IJ} = \int_{\Omega} \rho c_v N_I N_J dV$$

$$K_{IJ} = \int_{\Omega} \kappa \nabla N_I \cdot \nabla N_J dV$$



# MD Temperature Definition

- We have to relate the dynamics of atoms to the nodal temperature field

**Using Equipartition of Energy:**

$$E^{MD} = \sum_{\alpha} \frac{1}{2} m_{\alpha} |\mathbf{v}_{\alpha}|^2 + \Phi \implies e_{\alpha} \approx m_{\alpha} |\mathbf{v}_{\alpha}|^2 / \Delta V_{\alpha}$$

- Define restriction operation: MD field  $\rightarrow$  Nodal field
  - E.g. projection, averaging, shape functions...
  - One way: minimize difference between MD and continuum temperature fields

$$\min_{\theta_I} \sum_{\alpha \in \text{atoms}} \left( e_{\alpha} \Delta V_{\alpha} - \sum_{I \in \text{nodes}} \rho c_v N_{I\alpha} \theta_I \Delta V_{\alpha} \right)^2 \implies \theta_I = \sum_{\alpha} \hat{N}_{I\alpha} T_{\alpha}$$

$$\rho \equiv \frac{m_{\alpha}}{\Delta V_{\alpha}}, \quad c_v \equiv \frac{3k_B}{m_{\alpha}}$$

**Dulong-Petit expression for heat capacity of a mono-atomic solid or dense fluid above the Debye temperature**

**Using row-sum lumping (localization) and atomic quadrature for mass matrix in MD region (thermodynamic consistency)**

$$\hat{N}_{I\alpha} = \frac{N_{I\alpha}}{\sum_{\beta} N_{I\beta}}$$
$$T_{\alpha} = \frac{1}{3k_B} m_{\alpha} |\mathbf{v}_{\alpha}|^2$$



# Derivation of Coupled FEM-MD Equations

- Apply Galerkin method to entire domain:

- Decompose domain:

$$\int_{\Omega} N_I(\mathbf{x}) \rho c_v \dot{\theta}^h(\mathbf{x}) dV = \int_{\Omega_{\text{fem}}} N_I(\mathbf{x}) \rho c_v \dot{\theta}^h(\mathbf{x}) dV + \sum_{\alpha} N_{I\alpha} \rho c_v \dot{\theta}_{\alpha}^h \Delta V_{\alpha}$$

- Use atomic temperature:

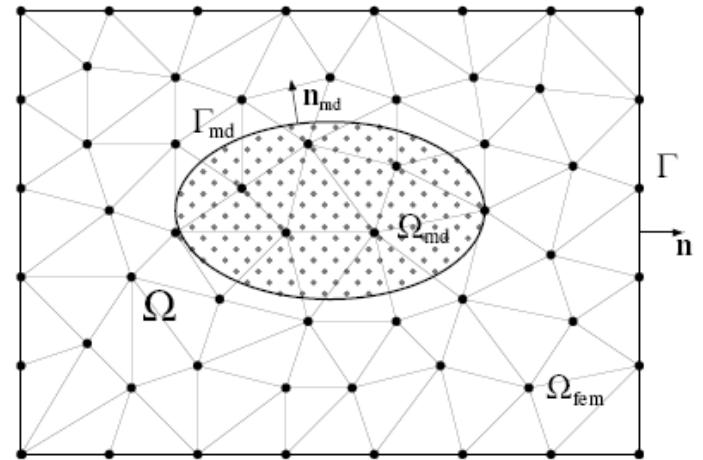
$$\int_{\Omega_{\text{fem}}} N_I(\mathbf{x}) \rho c_v \dot{\theta}^h(\mathbf{x}) dV + \sum_{\alpha} N_{I\alpha} \rho c_v \dot{\theta}_{\alpha}^h \Delta V_{\alpha} = \int_{\Omega_{\text{fem}}} N_I(\mathbf{x}) \rho c_v \dot{\theta}^h(\mathbf{x}) dV + \sum_{\alpha} N_{I\alpha} e_{\alpha} \Delta V_{\alpha}$$

- Apply physics:

$$\int_{\Omega_{\text{fem}}} N_I(\mathbf{x}) \rho c_v \dot{\theta}^h(\mathbf{x}) dV + \sum_{\alpha} N_{I\alpha} \rho c_v \dot{\theta}_{\alpha}^h \Delta V_{\alpha} = \int_{\Omega_{\text{fem}}} N_I \nabla \cdot \kappa \nabla \theta^h dV + 2 \sum_{\alpha} N_{I\alpha} \mathbf{v}_{\alpha} \cdot \mathbf{f}_{\alpha}$$

- Discretize:

$$\sum_J M_{IJ} \dot{\theta}_J = \sum_J K_{IJ} \theta_J + 2 \sum_{\alpha} N_{I\alpha} \mathbf{v}_{\alpha} \cdot \mathbf{f}_{\alpha}$$





## Coupling MD Thermostat

- Effects of FEM on MD can be included by prescribing constraints relating the FE and MD dynamics:

- Temperature constraint

$$2 \sum_{\alpha} N_{I\alpha} \mathbf{v}_{\alpha} \cdot \mathbf{f}_{\alpha} - \sum_J M_{IJ}^{MD} \dot{\theta}_J = 0$$

- Heat flux constraint

$$\sum_{\alpha} N_{I\alpha} \left( \frac{\partial \Phi}{\partial \mathbf{x}_{\alpha}} \cdot \mathbf{v}_{\alpha} + \mathbf{v}_{\alpha} \cdot \mathbf{f}_{\alpha} \right) + \int_{\Gamma_{MD}} N_{I\alpha} \mathbf{n}_{md} \cdot \mathbf{q}^h \, dA = 0$$

- Application of Gauss' principle of least constraint to atomic forces:

$$\mathbf{f}_{\alpha} = \mathbf{f}_{\alpha}^{MD} - \frac{m_{\alpha}}{2} \lambda(\mathbf{x}_{\alpha}) \mathbf{v}_{\alpha}$$

- Variable  $\lambda$  is a continuum field defined on the nodes:

$$\lambda(\mathbf{x}_{\alpha}) = \sum_I N_{I\alpha} \lambda_I$$



# Combined System

- Result is set of coupled FEM/MD equations

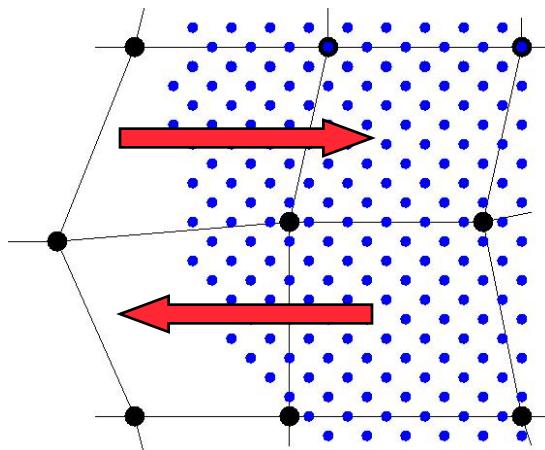
$$\sum_J M_{IJ} \dot{\theta}_J = \sum_J K_{IJ} \theta_J + 2 \sum_{\alpha} N_{I\alpha} \mathbf{v}_{\alpha} \cdot \mathbf{f}_{\alpha}$$

$$m_{\alpha} \dot{\mathbf{v}}_{\alpha} = \mathbf{f}_{\alpha}^{MD} - \frac{m_{\alpha}}{2} \sum_I N_{I\alpha} \lambda_I \mathbf{v}_{\alpha}$$

Coupling parameter  
(temperature/flux constraint)

- Combined MD/FEM system has two-way coupling:

← Atoms contribute to nodal heat equation



Heat at nodes affects MD energy through thermostat





## Fractional Step Method for Time Integration

- Gear time integration for FE dynamics:  $K_{IJ}\theta_J$
- Verlet time integration for MD dynamics:  $m_\alpha \dot{\mathbf{v}}_\alpha = \mathbf{f}_\alpha^{MD}$
- Consistent update for FE-MD terms:

$$\Delta(N_I E_I) = \sum_{\alpha} N_{I\alpha} (2\Delta t \mathbf{v}_\alpha \cdot \mathbf{f}_\alpha + \Delta t^2 m_\alpha^{-1} \mathbf{f}_\alpha \cdot \mathbf{f}_\alpha)$$

- Exact constraint enforcement applied after other time updates using the fractional step method

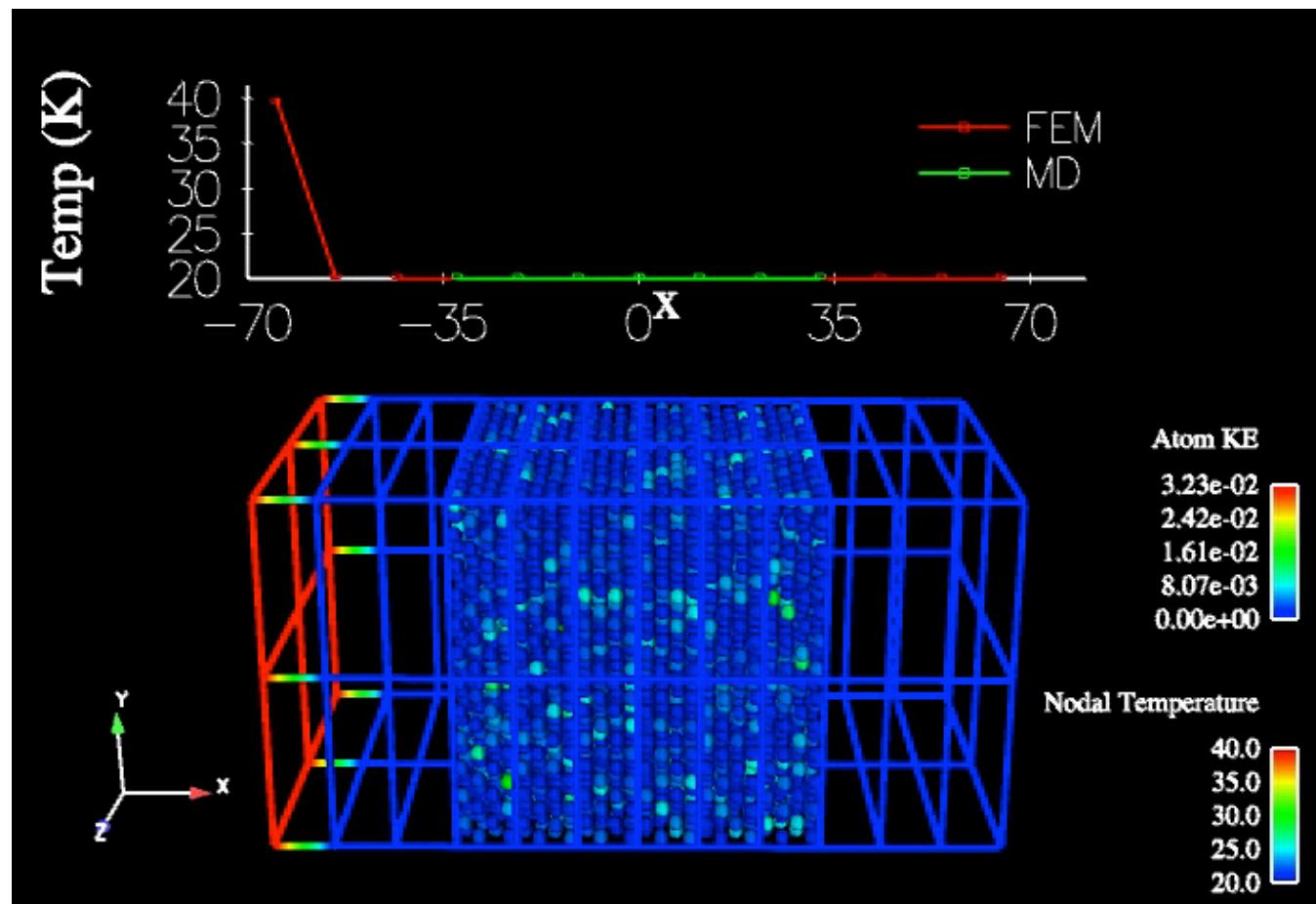
$$\Delta t \sum_{\alpha} N_I^\alpha k_{\alpha} \sum_{\mathcal{J}} N_J^\alpha \lambda_J - \frac{\Delta t^2}{4} \sum_{\alpha} N_I^\alpha k_{\alpha} \left( \sum_J N_J^\alpha \lambda_J \right) \left( \sum_K N_K^\alpha \lambda_K \right) = \text{RHS}$$

- Can eliminate energy loss/gain in coupling



# Coupled System

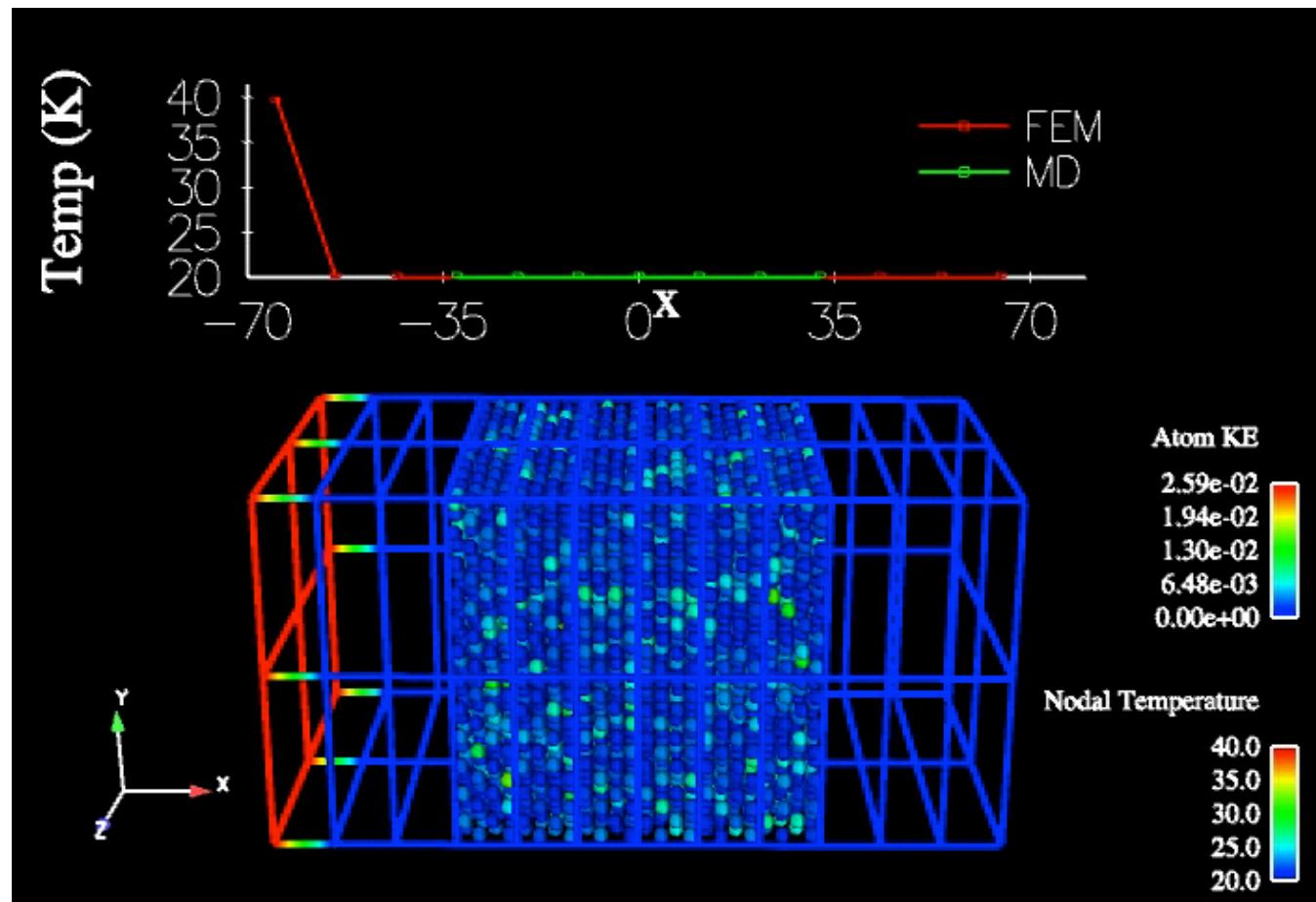
- 1D bar with embedded MD region (~7000 atoms)
- FEM nodes fixed hot/cold at left/right ends
- Temperature coupling method





# Coupled System

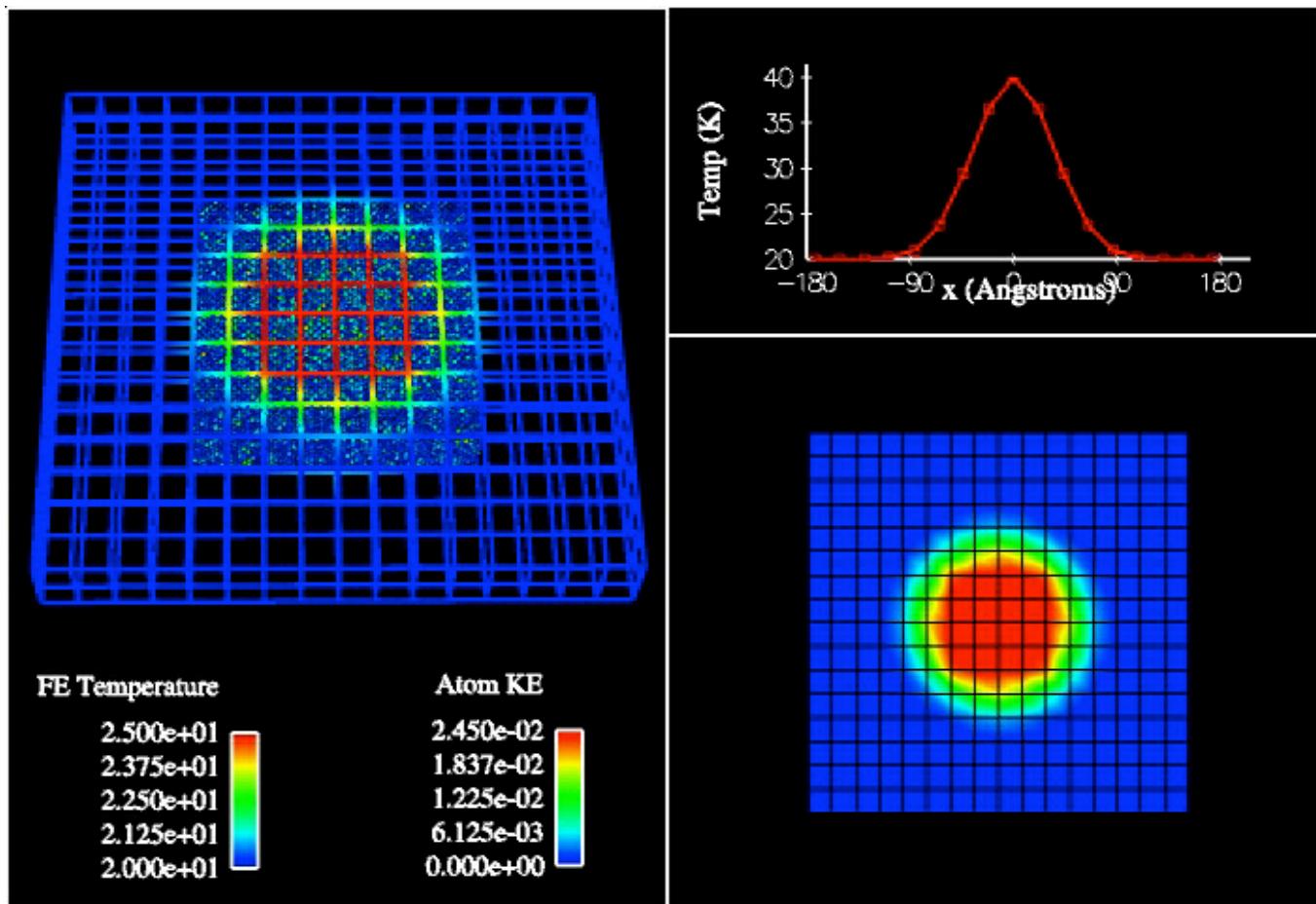
- 1D bar with embedded MD region (~7000 atoms)
- FEM nodes fixed hot/cold at left/right ends
- Flux coupling method





## 2D Diffusion Problem

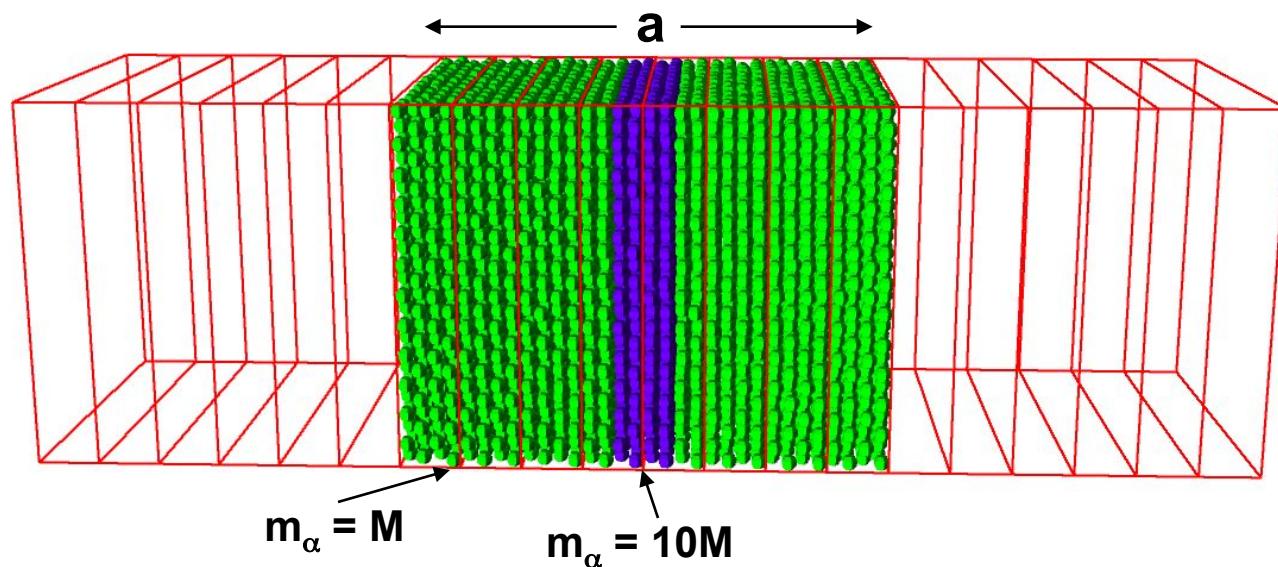
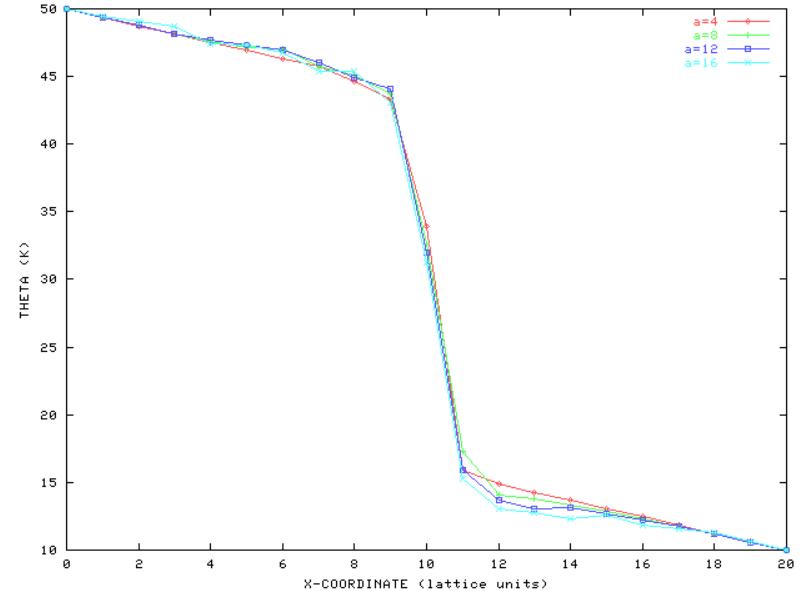
- Plate with embedded MD region (~33,000 atoms)
- Initialized to temperature field with gaussian profile
- Adiabatic boundary conditions at edges



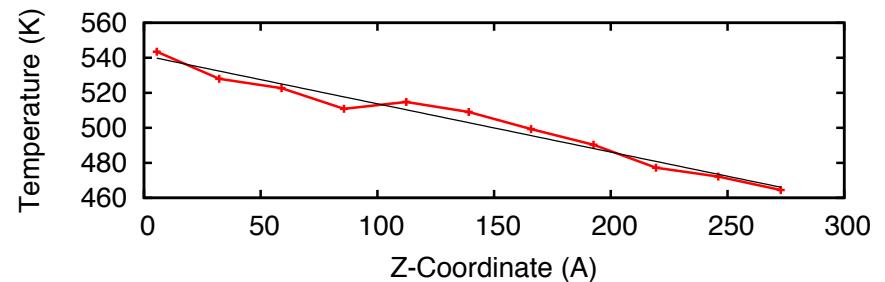
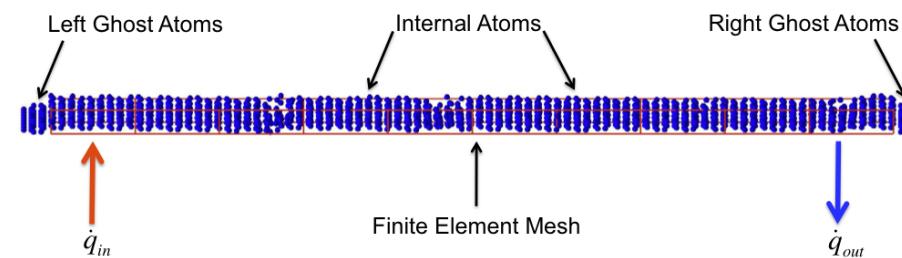


# Effects of Imperfections on Conductivity

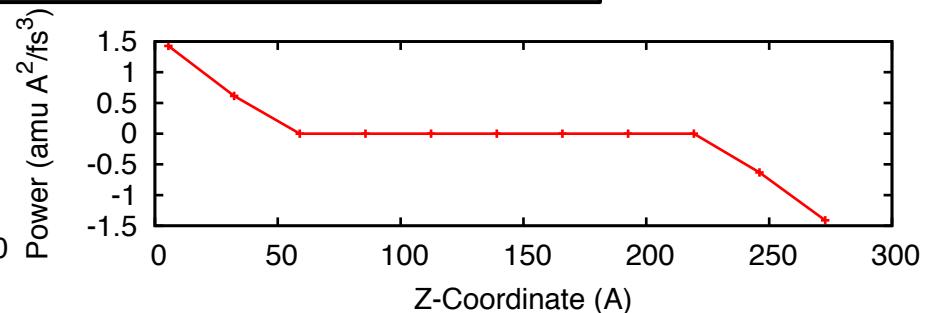
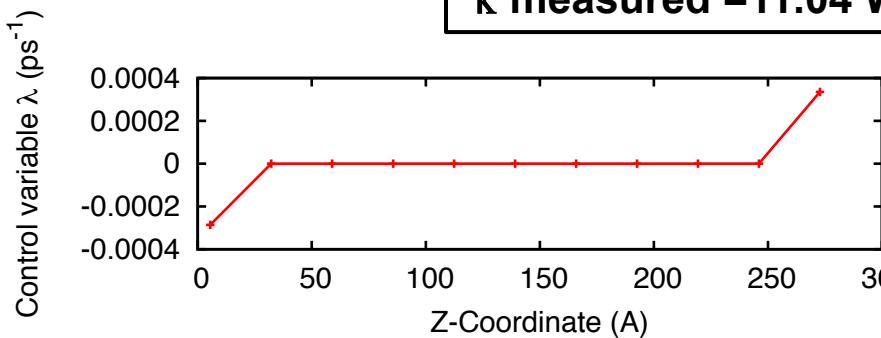
- Center layers of atoms given 10x mass of surroundings
  - Acoustic mismatch leads to inherent resistance in center layer
- Results are fairly insensitive to size of MD region



# Thermal Conductivity Calculations using AtC Boundary Conditions



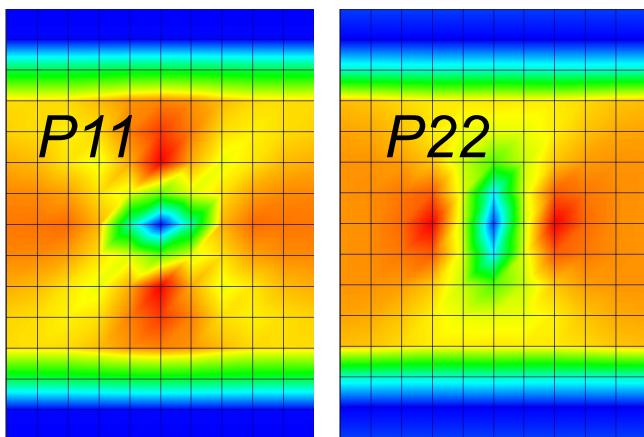
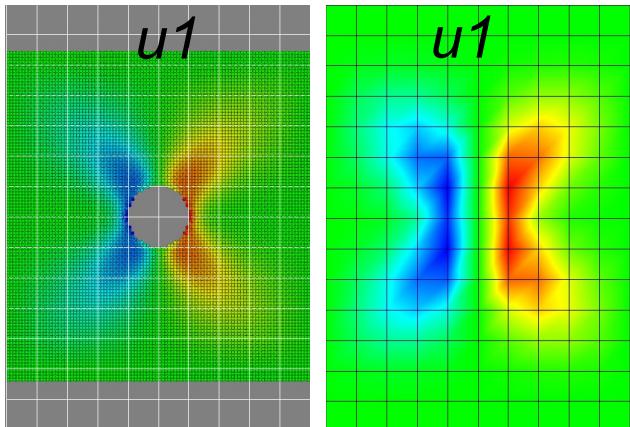
$\kappa$  measured = 11.04 W/mK,  $\kappa$  theory = 12.01 W/mK



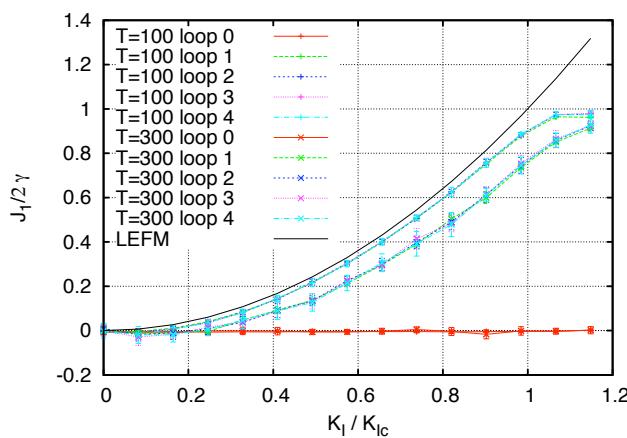
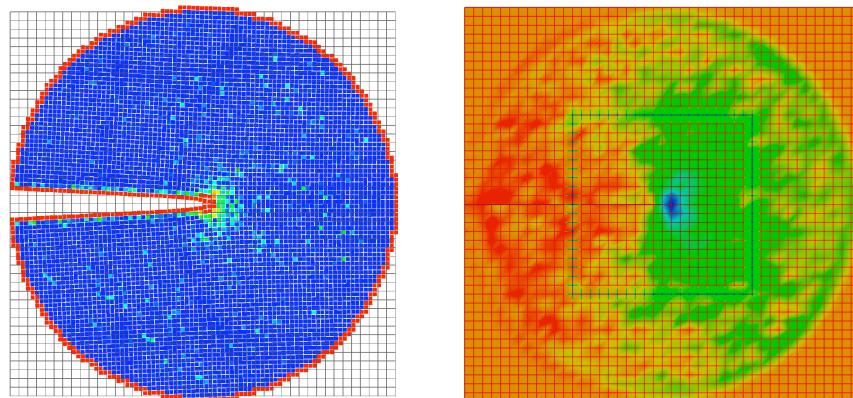


# Hardy Analysis

*Tensile stretching of plate with circular hole*



*Compressive stress field for an atomic simulation of shock loading*



*Calculation of local values of atomic potential energy, Eshelby tensor, and J-integral at finite temperature*

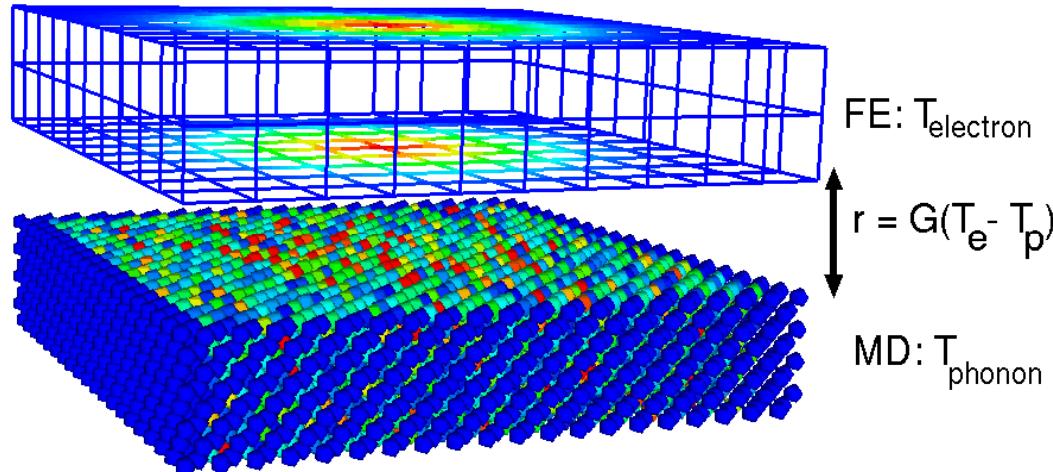


## Extrinsic Physics Modeling

- MD explicitly represents atomic motions with great accuracy
  - Ballistic phonon propagation
  - Defects
  - Nanostructures
- MD does not capture many other important physics
  - Electric fields
  - Energy carriers
  - Electrons
- Represent additional physics in a continuum model
- Use coupling techniques developed in thermal work to interface the two disparate types of physics descriptions
- Examples underway: electron temperature, consistent electric fields, energy carrier density, full “fluidic” description of unrepresented particles

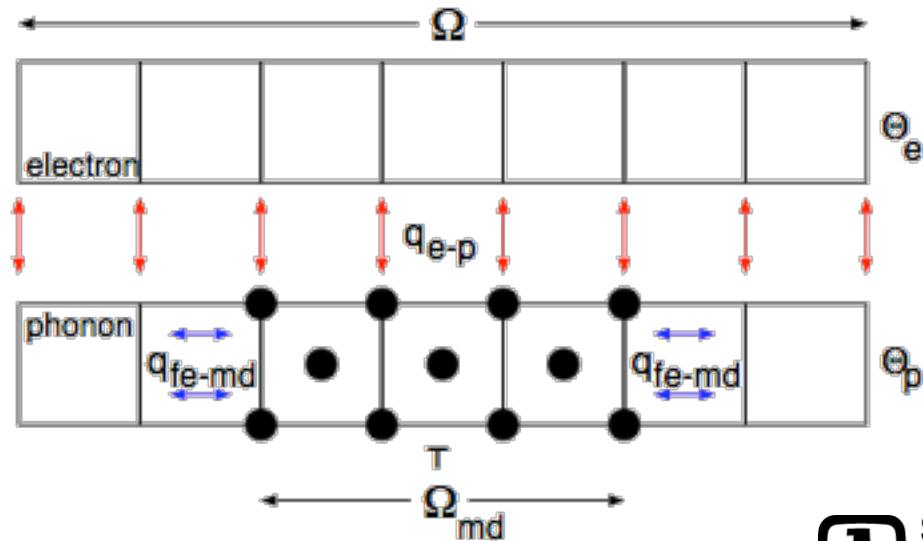


# Coupled Two-Temperature Approach



Explicit representation of phonons by MD,  
Electron effects solved for on overlaid mesh

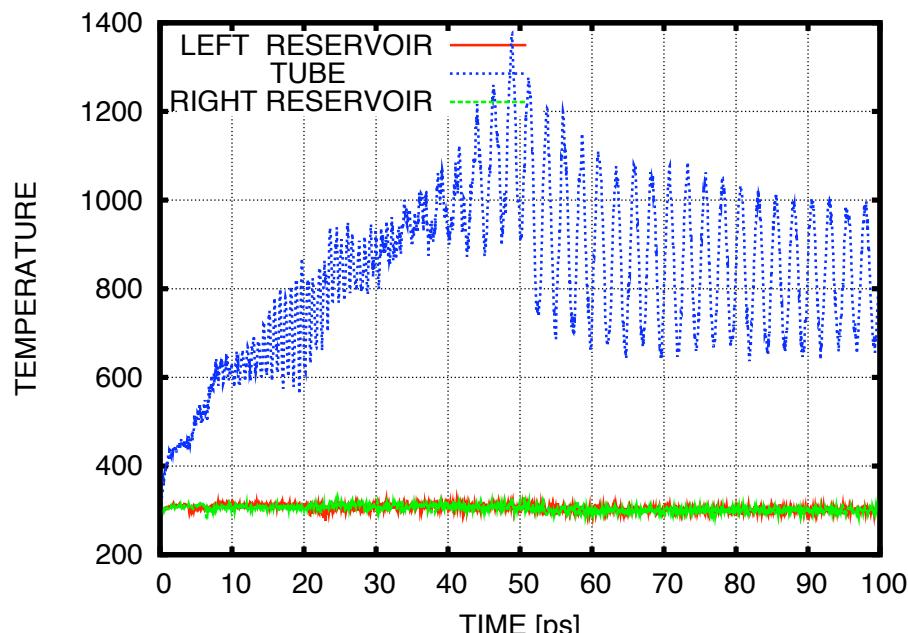
Energy exchange handled through thermostats as in the thermal-only problem



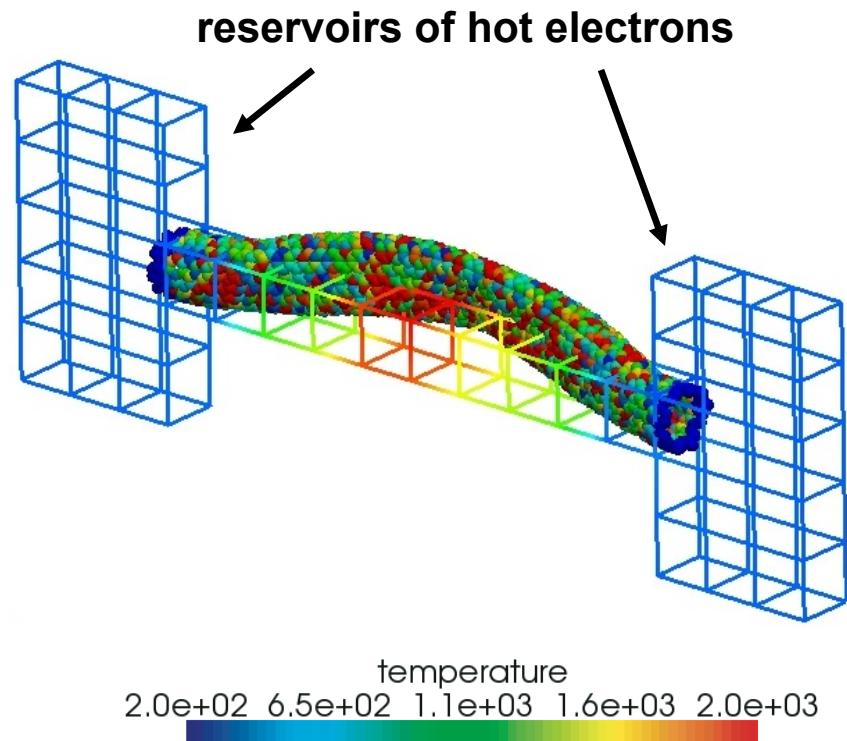


# Laser heating of a metallic CNT

- eMD can be used to model heating and thermal-induced vibration in nanostructures that possess a metallic character of thermal conduction, e.g. (8,8) armchair CNT.



**Evolution of average temperatures  
of CNT and reservoirs**





## Ge/Si superlattice nanowires

- Our method captures the retarded phonon transmission observed for Ge/Si superlattice nanowires with application to thermoelectrics

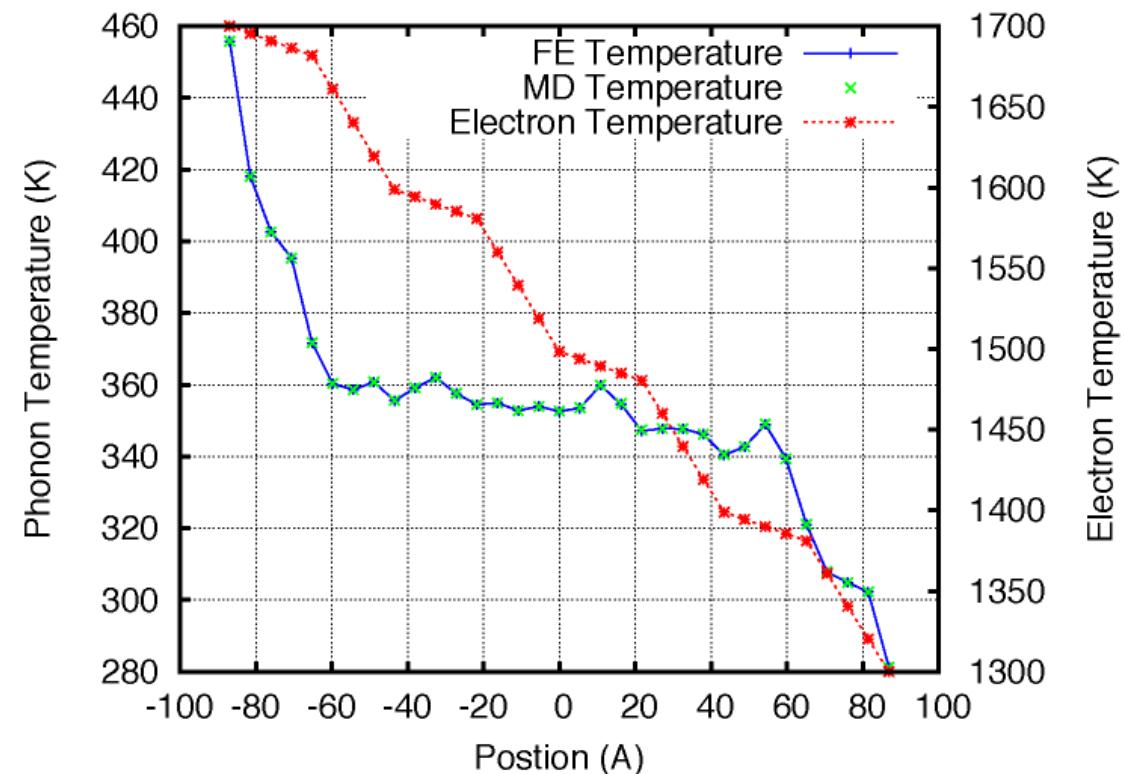
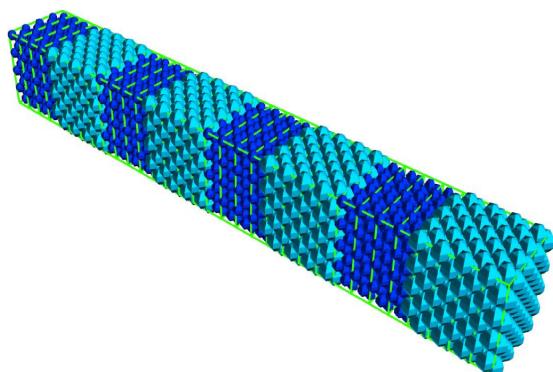
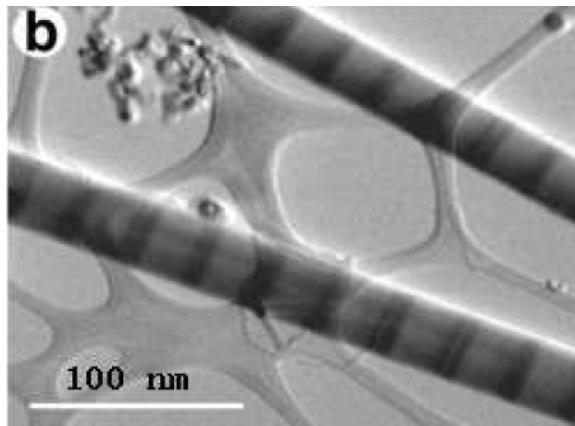
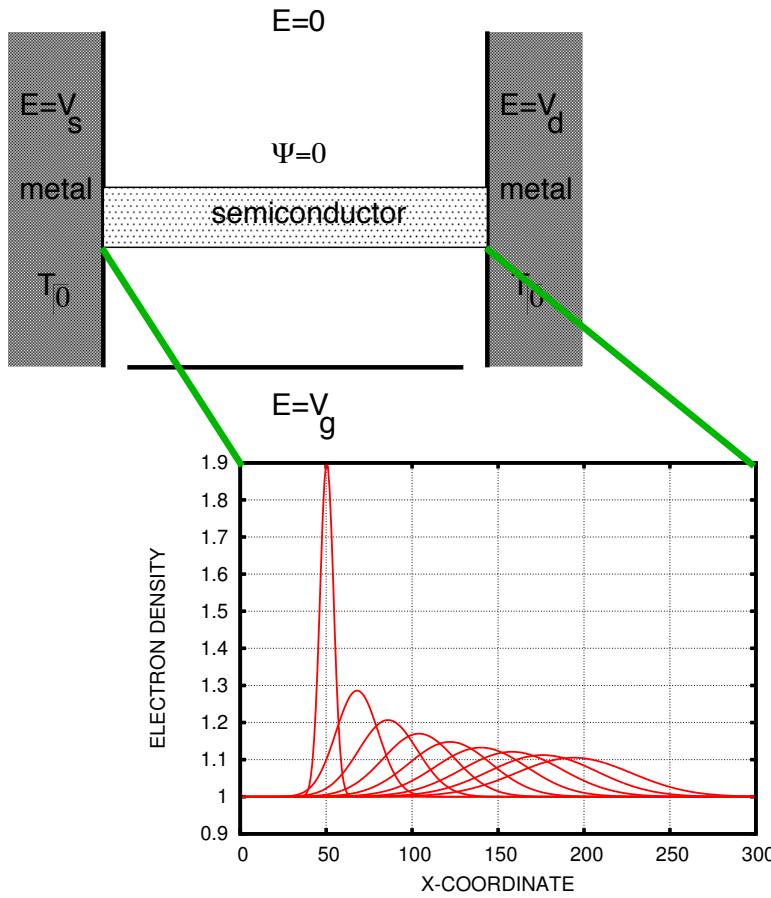


Figure 8: Temperature profiles in the superlattice

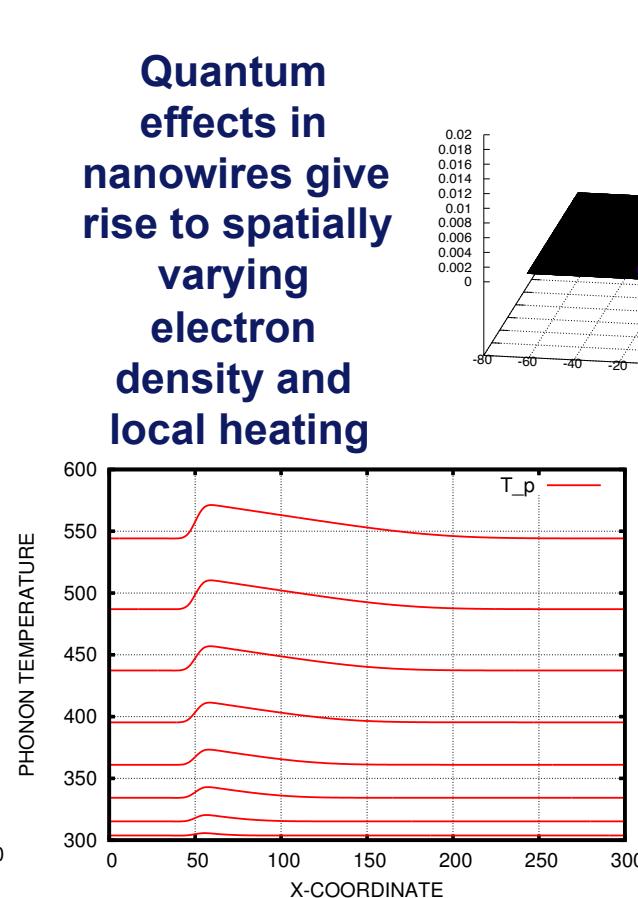


# Metallic and Semi-Conductor Powered Nanodevices

- Drift-diffusion models can be used to study powered nanowires and the interaction between current and heating



**Quantum effects in nanowires give rise to spatially varying electron density and local heating**

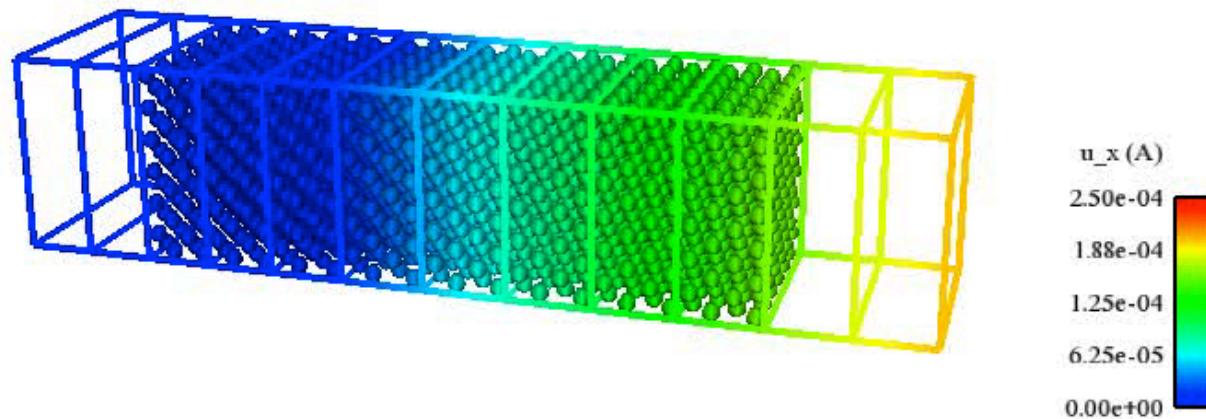


**Electron pulse gives rise to uniform and local heating**



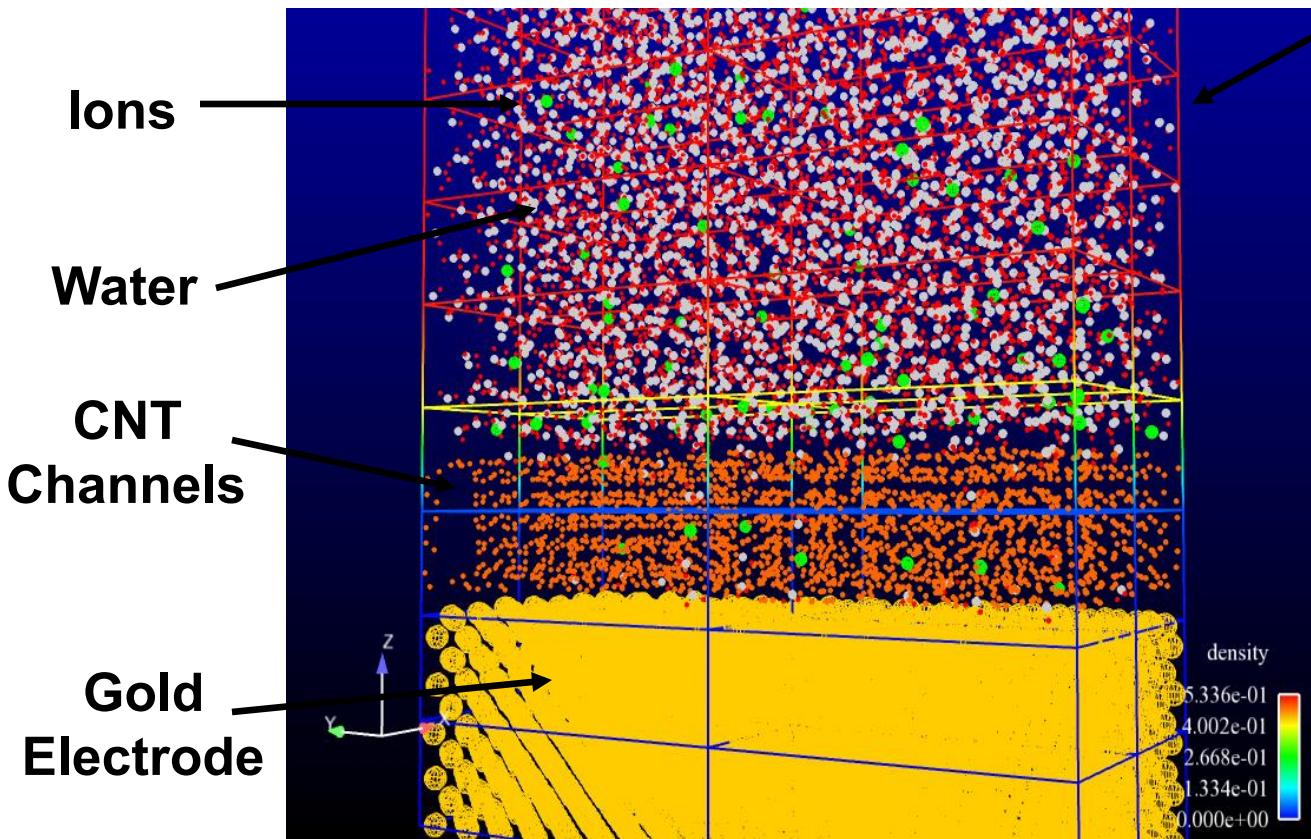
## Other Physical Models: Elasticity

- Many types of physics problems can use the same mathematical and algorithmic structure
- Elasticity dynamics of a bar at the nano-scale:





# AtC Model for Long-range Electrostatics



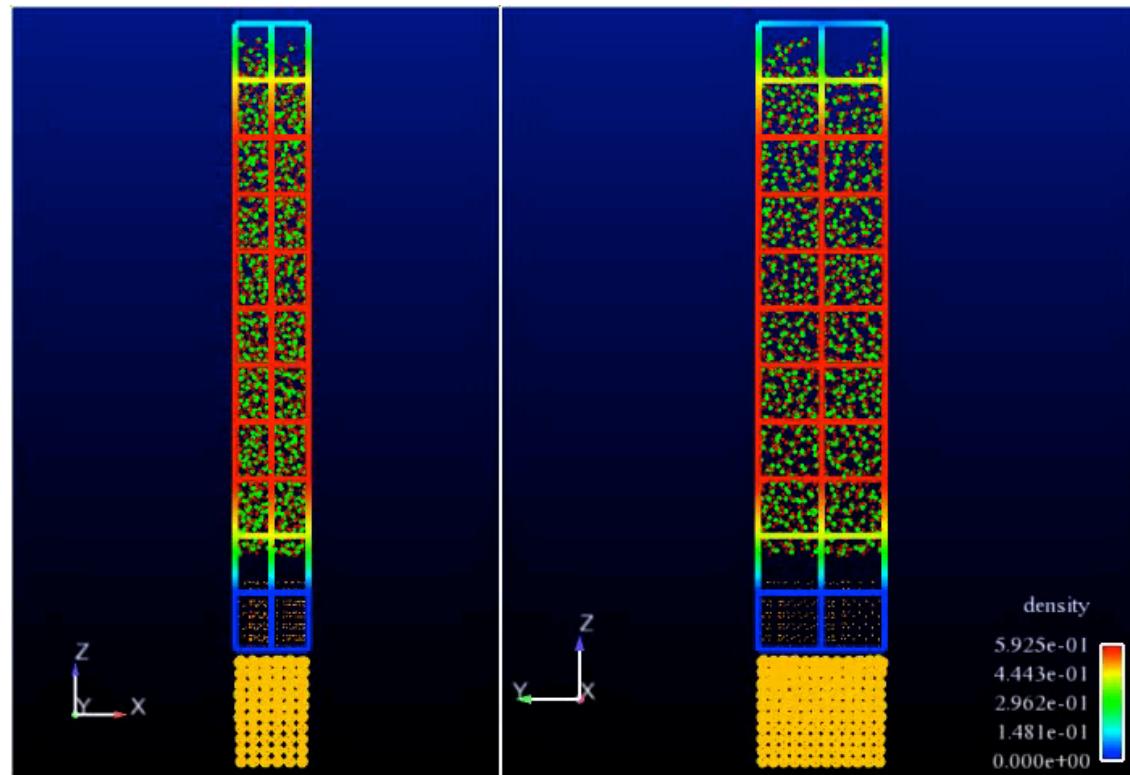
**FE Mesh Enables**

- 1. Coarse-scaling MD for increased physical understanding**
- 2. Solves for electric field with**
  - a) Upscale FE source terms**
  - b) Downscale MD electric forces**



## Other Physical Models: Fluidic Species Transport

- Define coupling in Eulerian frame rather than Lagrangian
- Track individual species to understand particle agglomeration and diffusion
- Example problem: transport of saltwater into nanotubes



- Future work: energy storage devices



## Other Physical Models: Electrostatics

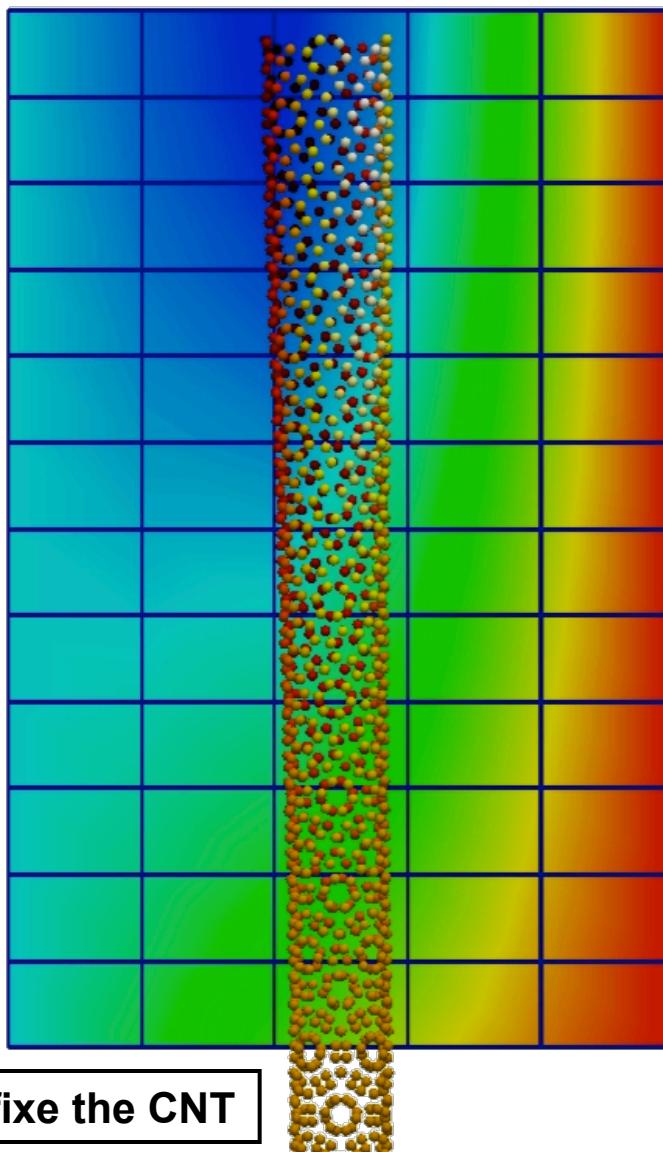
Mutual repulsion opens tip

Potential drop across short axis

Electrons segregate to tip

Atoms anchored to fix the CNT

Net charge causes net tip displacement





## References

- Thermal coupling
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  - Templeton, Jones, & Wagner, *Model. Simul. Mater. Sci. Eng* (2010)
- Hardy post-processing
  - Zimmerman, Jones, & Templeton, *J. Comp. Phys.* (2010)
  - Jones & Zimmerman, *J. Mech. Phys. Solids* (2010)
  - Jones *et al.*, *Phys. Condens. Matter* (2010)
- Two-temperature modeling
  - Jones *et al.*, *Int'l J. Numer. Meth. Eng.* (2010)
- Long-range electrostatics
  - Templeton *et al.*, *J. Comput. Theor. Chem.* (in press)

**Simulations performed with LAMMPS MD code:**

**<http://lammps.sandia.gov>**

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