# Materials Defects: Tutorial and Workshop Overview

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## **Program Overview**

The program is built around two major themes:

- Materials Defects:
  - Defects are those things we often neglect so that our calculations are easier.
  - Defects present a huge challenge for mathematical modeling and simulation, as anything that breaks up the regular, homogeneous structure of a calculation requires special consideration.
  - Examples include grain boundaries, dislocations, cracks, surface reconstructions, impurities, vacancies, ...
- Multiscale Modeling and Computation

### **Grain Boundaries**



Zoontjens, Schulze, Hendy PRE 2008

# **Dislocations**



### **Multiscale Modeling Paradigms**





- Quantum Mechanics and DFT
- Classical Mechanics and MD
- Statistical Mechanics and MC
- Continuum Mechanics and Numerical PDE

### **Molecular Dynamics**

• In the classical regime, MD is the fundamental model

$$m_{i}\ddot{\mathbf{x}}_{i} = -\nabla_{i}\Phi\left(\{\mathbf{x}_{i}\}\right) \quad i = 1, 2, \dots, N.$$

$$\Phi(\{\mathbf{x}_{i}\}) = \sum_{i \neq j} \Phi_{ij} = 4\epsilon \sum_{i \neq j} \left[\left(\frac{\sigma}{r_{ij}}\right)^{12} - \left(\frac{\sigma}{r_{ij}}\right)^{6}\right]$$

$$\Phi_{ij}$$

#### Failure of MD at Small Scales

- MD would be sufficient for Materials Science applications at small scales if the potentials  $\phi(\mathbf{x})$  were accurate.
- One reason these fail, is that they are limited to two-, three-, etc. body interactions:

$$\phi = \sum_{ij} \phi_{ij} + \sum_{ijk} \phi_{ijk} + \dots$$

- They are typically fit to model particular materials in particular regimes, and they do not transfer well to other scenarios.
- When new potentials are being fit, new regimes are encountered or greater accuracy is desired, one must turn away from this empirical approach and use a "first principles" approach.

#### **Electronic Structure**

- This means solving some version of the many-body Schrodinger equation.
- In the Born-Oppenheimer approximation, the heavy, atomic nuclei are treated as classical, stationary point particles, and only the relatively light electrons are treated in the non-localized, quantum mechanical way.
- This reduces the many-body problem to:

$$\widehat{H}_{bo}\Psi = E\Psi,$$

$$\widehat{H}_{bo} = -\sum_{i}^{N_e} rac{1}{2} 
abla_i^2 - \sum_{i}^{N_e} \sum_{j}^{N_n} rac{Z_j}{r_{ij}} + \sum_{i}^{N_e} \sum_{j>i}^{N_e} rac{1}{r_{ij}}.$$

where  $\Psi$  is a function of the coordinates of *just* the electrons, i.e. a 3\*(number of electrons) dimensional eigenvalue problem!

### **Variational Principle**

• The expected value of the energy is a functional of the manybody wavefunction:

$$E[\Psi] = \frac{\int \Psi^* \widehat{H} \Psi d\mathbf{x}}{\langle \Psi | \Psi \rangle} \equiv \frac{\langle \Psi | \widehat{H} | \Psi \rangle}{\langle \Psi | \Psi \rangle}$$

- If one takes  $\Psi_0$  to be the ground-state, one can use this to construct a "first-principles" energy landscape.
- It is easy to show, that for any choice of  $\Psi$ , one has

 $E[\Psi] \geq E_0.$ 

## **Density Functional Theory**

- Solving the electronic structure problem is hopeless for large systems of particles.
- The vast majority of materials science energy-landscape calculations approximate the ground state energy via the *electron density*:

$$\rho(\mathbf{r}_1) = N \int \int \dots \int ||\Psi(\mathbf{x}_1, \mathbf{x}_2, \dots, \mathbf{x}_N)||^2 ds_1 d\mathbf{x}_2 \dots d\mathbf{x}_N.$$

- The function  $\rho \ge 0$  is the number-density of electrons.
- The Hohnberg-Kohn theorems guarantee the existence of functionals that are equivalent to the many-body Schrodinger electronic structure problem:

$$E_v[\rho] \ge E_0.$$

 While standard approximations are widely used, the functionals are not actually known, nor are there any rigorous estimates of their accuracy.

### Failure of MD at Large Scales

- MD would be sufficient for Materials Science applications at large scales if it were faster.
- The reason for the failure is the extremely small time-steps that are needed to resolve the chaotic motion that invariably arises with many body interactions:
- This makes determining even the equilibrium behavior difficult, and nonequilibrium even harder.



### Monte Carlo

There are two broad classes of statistical approaches:

- (Equilibrium) Monte Carlo
- Dynamic or Kinetic Monte Carlo

Often, these methods are appropriate for bridging length and time scales between MD and Continuum Mechanics.

# Equilibrium Monte Carlo

This approach is based directly on statistical mechanics and allows one to compute average properties of a collection particles, producing thermodynamic quantities.

- Canonical Ensemble This is by far the most common type of simulation, aiming to evaluate the average properties of a collection of N particles in a volume V interacting with an environment at a fixed temperature T.
- Other commonly used ensembles include the *micro-canonical Ensemble* (N-V-E) and *Grand/ macro-canonical*  $(\mu-V-T)$  ensemble.

### **Kinetic Monte-Carlo Simulations**



- Configuration space is typically discrete, e.g. occupation arrays for a fixed lattice.
- Dynamics are imposed via a Markov Chain model
- Transition rates are based on configuration changes

• Example: 
$$q_i = \nu \exp\left(-\frac{\Delta\phi}{k_bT}\right), \quad \Delta\phi = E_S + mE_N$$

### **Continuum Models**

- Includes fluid dynamics, elasticity, thermodynamics, diffusion processes, porous media, ...
- Common threads are
  - a continuum assumption—the idea that mass, velocity, etc. can be represented at each point in space by a continuous and smoothly varying field rather than a discrete system of particles.
  - one or more *conservation laws*.
- Similarly, *interfaces* are often modeled as smooth curves or "phase" fields.
- $\Rightarrow$  PDE's in 3D space & time
- The bulk of traditional applied math/numerical analysis/front tracking methods are focused on this regime.

# Larger Scale Defects



- At larger scales, models are often further coarse-grained.
- For example, *mushy zones* are arrays of dendrites.
- These are often modeled as reactive porous media.
- Chimneys are sold-free channels caused by convection.
- This leaves behind larger scale defects known as *freckles*.

## **Tutorial Schedule**

- Peter Voorhees (Northwestern University) "Line and Planar Defects in Materials"
- Danny Perez (Los Alamos National Laboratory) "Introduction to Molecular Dynamics"
- Kristen Fichthorn (Pennsylvania State University) "An Introduction to Theoretical Methods for Describing Rare Events"
- Tony Lelivre (Ecole des Ponts ParisTech) "Monte Carlo methods in molecular dynamics"
- Maria Emelianenko (George Mason University) "Mathematical modeling of interfacial dynamics in polycrystals"
- Peter Smereka (University of Michigan) "Theory and Application of Simplified Kinetic Monte Carlo Models"
- Gabor Csanyi (University of Cambridge) "State of the art: a broad-brush survey of interatomic potentials"

#### Program

- Materials Defects: Tutorials. September 11 14, 2012.
- Workshop I: Quantum and Atomistic Modeling of Materials Defects. October 1 5, 2012.
- Workshop II: Atomistic and Mesoscale Modeling of Materials Defects. October 22 - 26, 2012.
- Workshop III: Mesoscale and Continuum Scale Modeling of Materials Defects. November 13 16, 2012.
- Workshop IV: Computational Methods for Multiscale Modeling of Materials Defects. December 3 - 7, 2012.
- Culminating Workshop at Lake Arrowhead (by invitation only).
   December 9 14, 2012.