



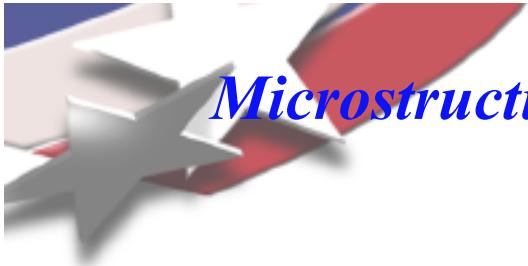
# *Bridging Time and Length Scales using Atomic-Scale Modeling*

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**Challenges in Computational Multiscale Materials Modeling (CCMMM)  
Westin Arlington Gateway Hotel  
Arlington, VA  
May 4, 2011**

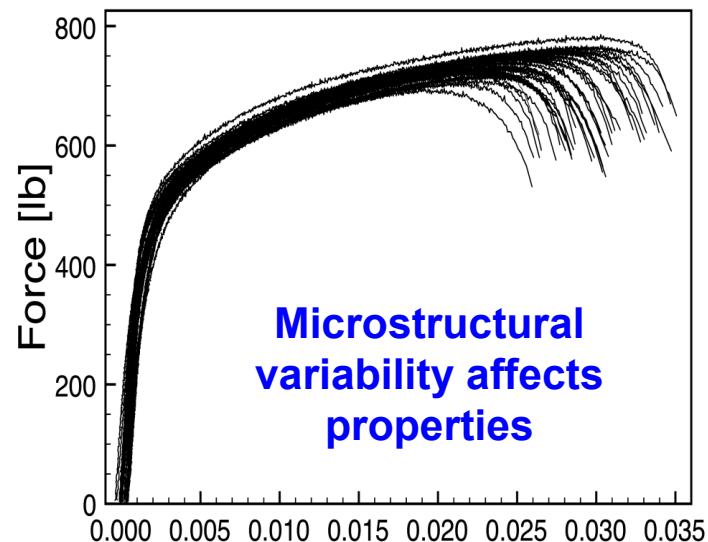
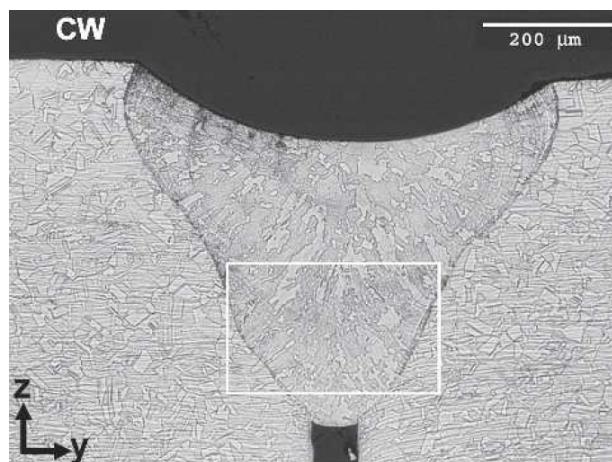
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National Nuclear Security Administration under contract DE-AC04-94AL85000.**





## Microstructure influences material properties and their variation

- Materials are intrinsically inhomogeneous
  - Predicting microstructure's influence on properties is an ongoing challenge
  - Relationship between microstructural *variability* and *property statistics* is **unknown**.



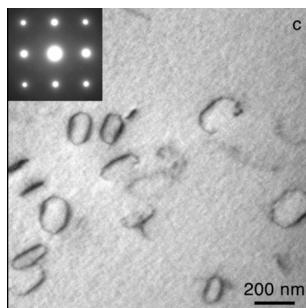
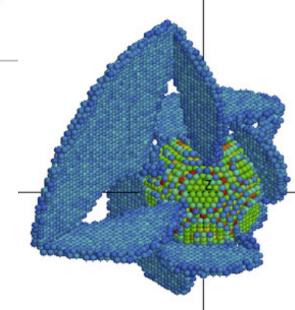
C.V. Robino, SNL

**Science-based, probabilistic engineering models must include microstructural effects.**

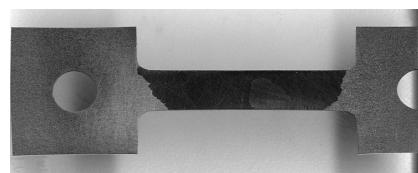
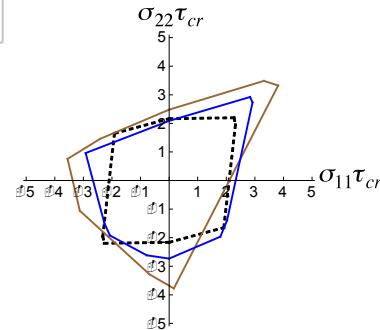
- Butt weld two 304L stainless plates
- Cut out 40 equivalent tensile specimens



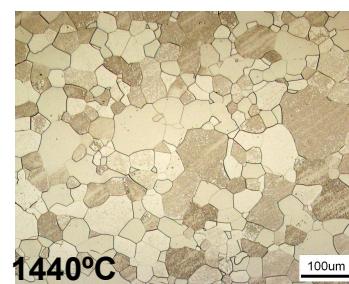
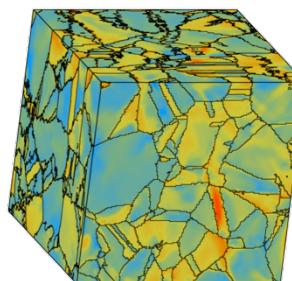
## *Microstructure is the critical link between atomic-scale processes and engineering applications*



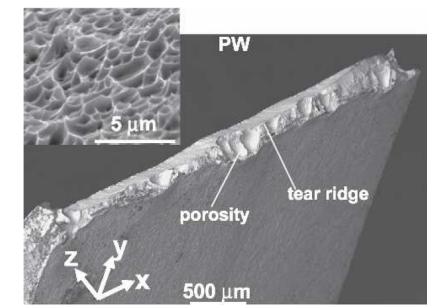
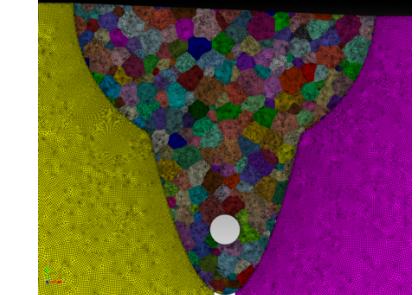
Atomic scale phenomena



Single crystal behavior



Microstructural effects



Material performance

$10^{-9}$  m  
 $10^{-9}$  s

$10^{-6}$  m  
 $10^0$  s

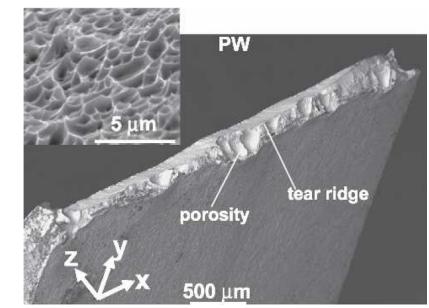
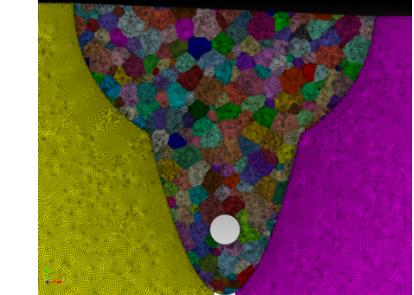
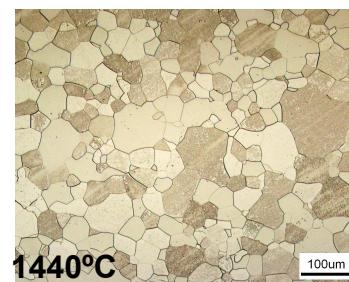
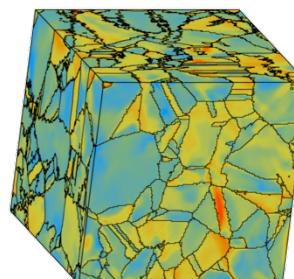
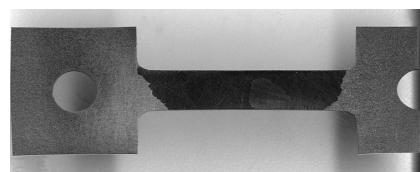
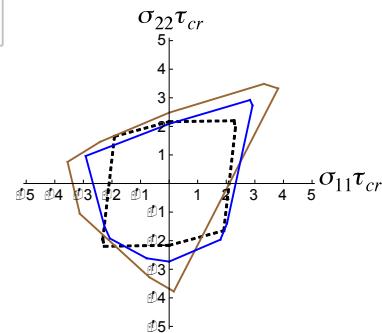
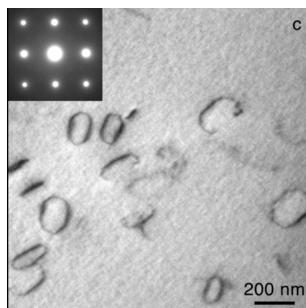
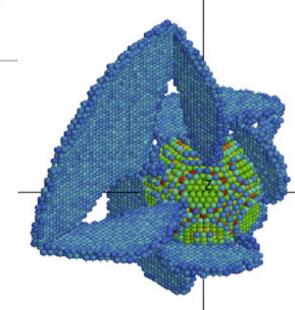
$10^{-3}$  m  
 $10^3$  s

$10^0$  m  
 $10^6$  s





## *Microstructure is the critical link between atomic-scale processes and engineering applications*



### Atomic scale phenomena

DFT, MD, DD

TEM, APT, PAS

### Single crystal behavior

crystal plasticity

XRD, EBSD,  
μmachining, μtesting

### Microstructural effects

kMC, PPFEM

EBSD, FIB, DIC,  
μmachining, μtesting

### Material performance

FEM, QMU

mechanical testing,  
microscopy





*Atomic-level simulations can study small groups of the entities that comprise the microstructure*

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## Classes of defects

- “0-dimensional” defects
  - Impurities, vacancies, interstitials, defect clusters...
- “1-dimensional” defects
  - Dislocations
- “2-dimensional” defects
  - Twins, fault planes, grain boundaries, interphase interfaces, surfaces, ...

## Properties of interest

- Thermodynamics
- Motion
- Interaction between defects
  - Energetics: e.g. binding
  - Dynamics: e.g. barriers
- Collective motion of defects

## General challenges:

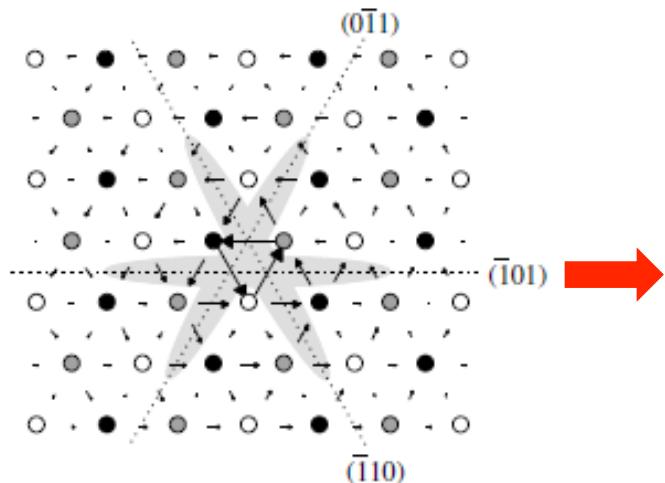
- **Can only explicitly treat a ‘few’ defects for a ‘short’ time**
- **Real materials are incredibly complex**



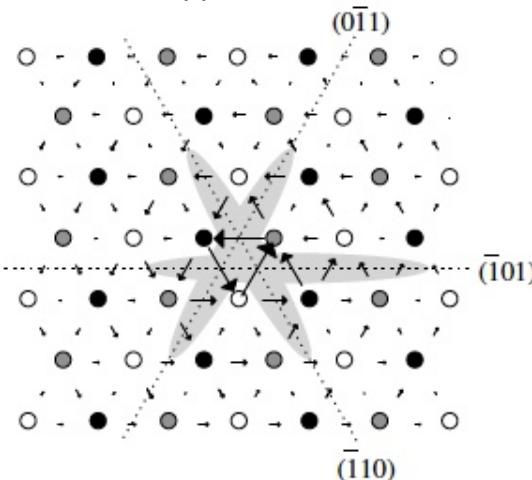
## Atomic-scale to single crystal properties: Dislocation behavior in BCC metals

- Atomic scale simulations show dislocation core spreading onto adjacent (110) planes in BCC metals.
  - Core spreading creates a **significant Peierls barrier** to dislocation motion.
  - Because the dislocation spreads onto three planes, motion can be affected by stress components outside the preferred slip plane, i.e. **non-Schmid stresses**.

[111] zone depiction of a relaxed screw dislocation core in Mo



Distortion of the dislocation core under an applied shear stress



Groger, Vitek et al. *Acta Mat.* **56** (2008) 5412

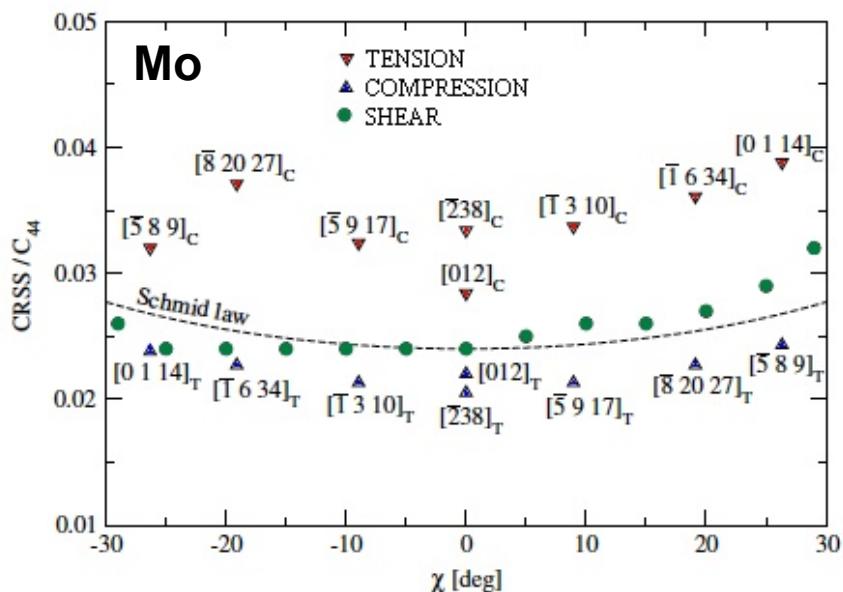


## Implications of non-Schmid deformation

- The non-Schmid stress components arise from two causes:
  - Asymmetry within the slip plane (twinning/anti-twinning) is a minor effect.
  - Contributions by stress components outside the slip plane are significant.

*“...glide of the 1/2[111] screw dislocation [on the (-101) plane] depends on shear stresses both parallel and perpendicular to the Burgers vector that act not only in the slip plane but also in other {110} planes of the [111] zone.”*

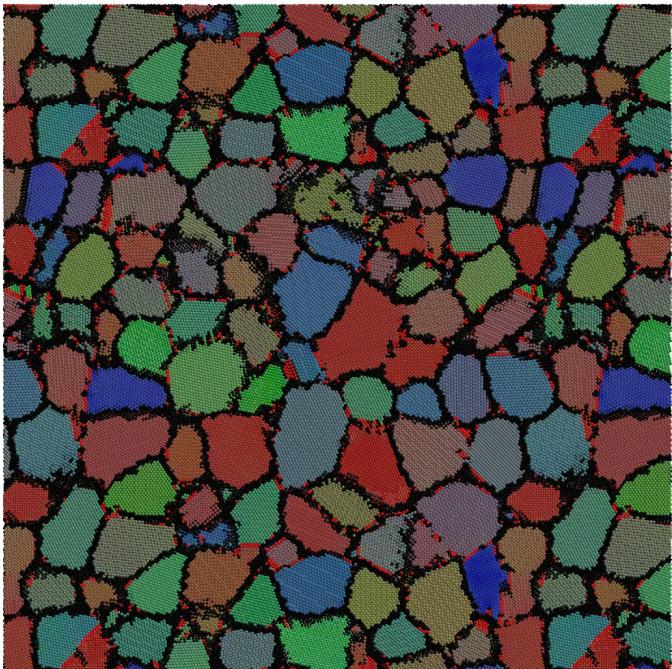
-Groger, Vitek et al. *Acta Mat.* **56** (2008) 5412.



**The non-Schmid stress components cause the widely observed tension-compression asymmetry in BCC metals**

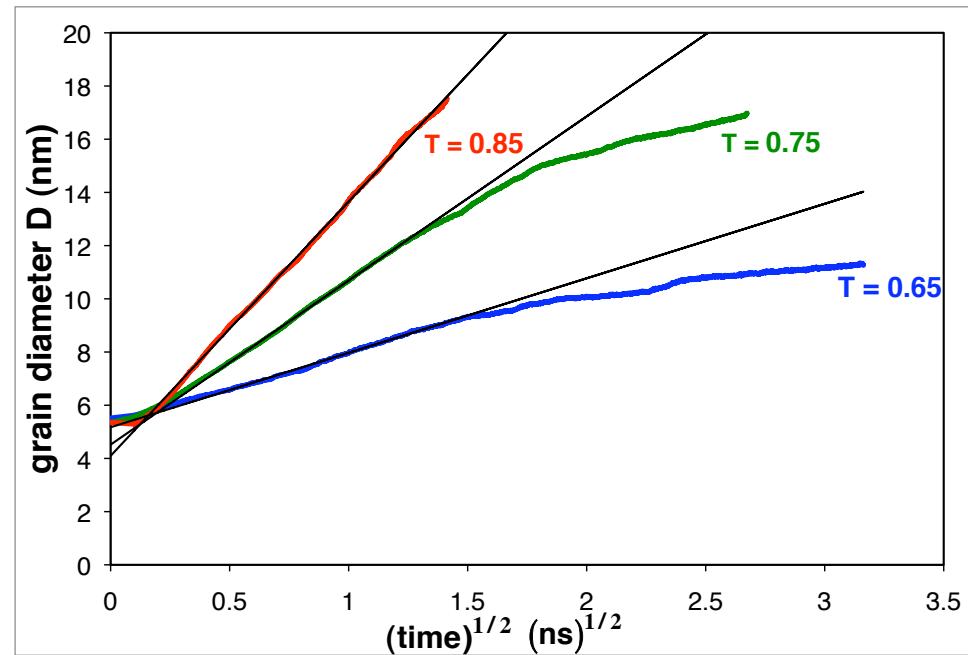


## *Brute Force MD can follow grain growth in nanocrystals What do we learn?*



$T = 0.75 T_M$ ; 39 nm cube; 7.0 ns

- Formation of twin boundaries
- Vacancies seen in grain interior

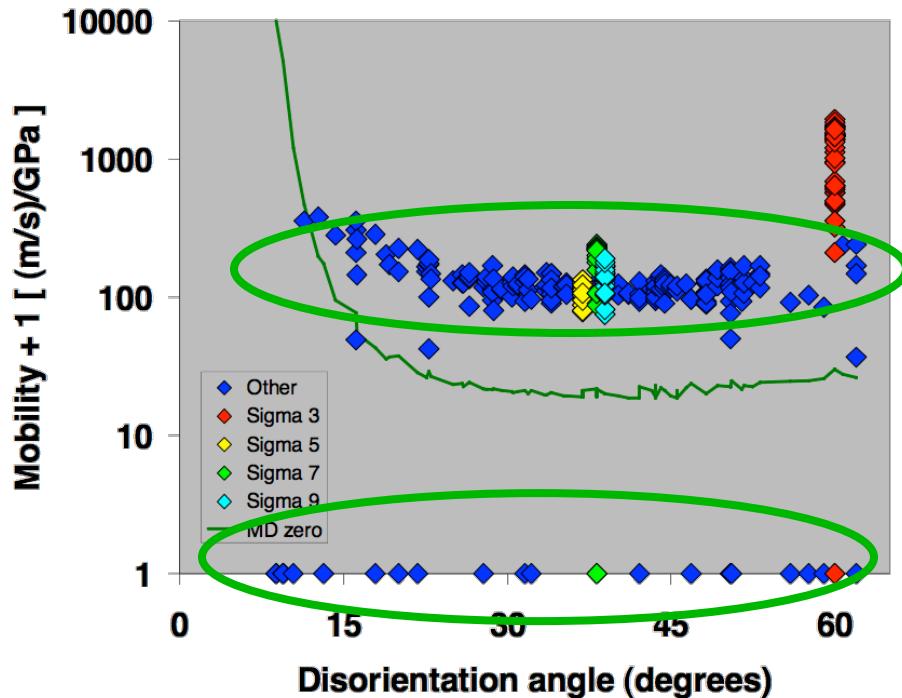


- Initial transient is not physical
- Conventional scaling of grain size with  $\text{time}^{1/2}$  observed for significant period
- Why does the growth slow down?!?



## MD simulations can study individual boundaries: Catalog of mobility for 388 Ni grain boundaries

**How could one use such data?**



- Relative fraction of High and Low mobility boundaries is temperature dependent
- In many boundaries, associated with roughening

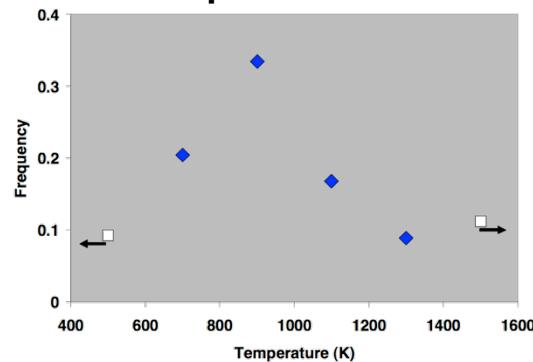
**Could consider crystallographic dependence of mobility.**

- But no trends in  $M$  found
- But not enough data to interpolate

**Could look for groups of similar boundaries, regardless of crystallography**

- High mobility boundaries
- Low mobility boundaries

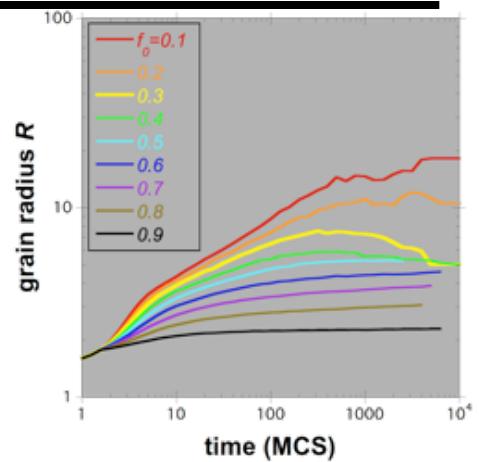
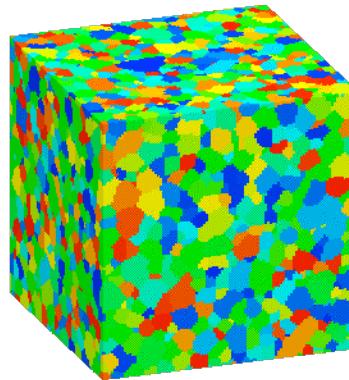
Transition temperature between low/high mobility





# *Mesoscale Microstructure Simulations reveal the consequences of temperature dependent population of High/Low mobility boundaries*

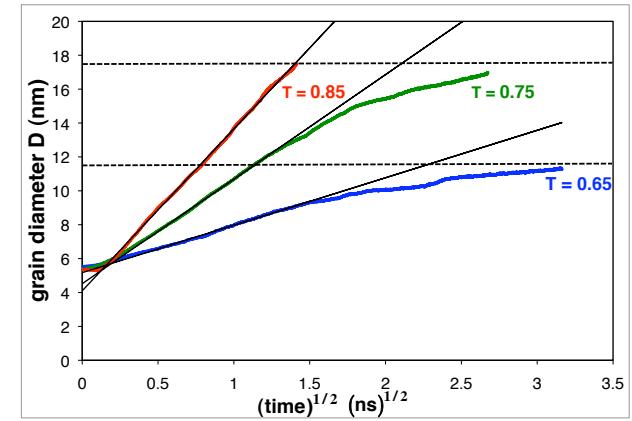
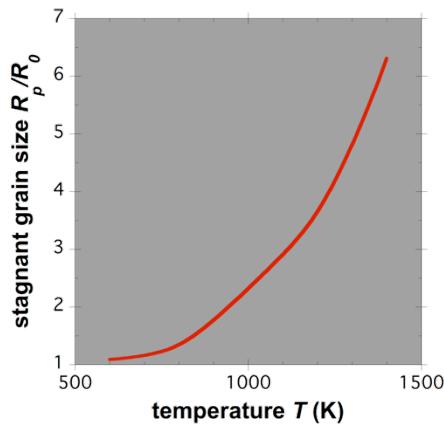
- Monte Carlo Potts Model simulations
  - Low mobility:  $M \sim 0$
  - High Mobility:  $M \sim 1$
  - Fraction,  $f_0$ , of High/Low mobility
  - Allow system to evolve via normal grain growth physics



- Grain size stagnates
- $f_0$  determines final size

$T$ (K)	$f_0$
600	0.9
800	0.7
1000	0.35
1200	0.2
1400	0.1

Convert temperature to fraction of low mobility boundaries



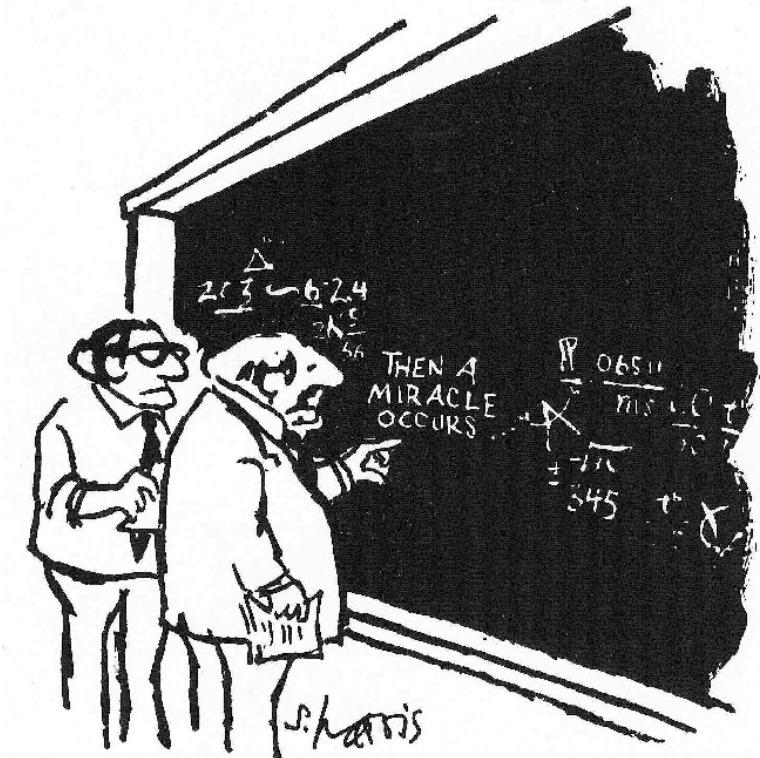
Explanation of grain growth stagnation in pure metals?  
Holm, Foiles, Science **328**, 1138 (2010)



## *Availability of appropriate interatomic potentials is the Achilles Heel of molecular dynamics*

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- Quality of interatomic potentials determines the quality of the results
  - **No GIGO!!**
- Keep the goal of the simulations in mind
  - Quantitative vs Illustrative
- Typical potential development process
  - Assume functional forms (ad hoc or physically based)
  - Adjust functions/parameters to fit a set of training data
  - Publish it and watch it get used for problems it was *not intended for!*
  - Highly time and labor intensive
    - » “Will the potential be ready in time?”
- Potentials for multiple materials classes are rare and often suspect



"I think you should be more explicit here in step two."



## *Interatomic Potential Wish List*

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- A full spectrum of approximations for computing the energy/forces in simulations
  - Highly accurate quantum techniques for specific critical quantities
    - » Will naturally be computationally expensive and only able to treat a small number of atoms
  - Highly efficient techniques that get the essential features
    - » Will allow for the treatment of complex processes with the goal of qualitative insight
  - Spectrum of intermediate methods
    - » This is not a “one size fits all” problem!!
- Ability to develop potentials ‘quickly’
  - Currently potentials often available too late to contribute

### Need New Ideas!

PRL 104, 136403 (2010)

PHYSICAL REVIEW LETTERS

week ending  
2 APRIL 2010

Gaussian Approximation Potentials: The Accuracy of Quantum Mechanics, without the Electrons



Knowledgebase of Interatomic Models

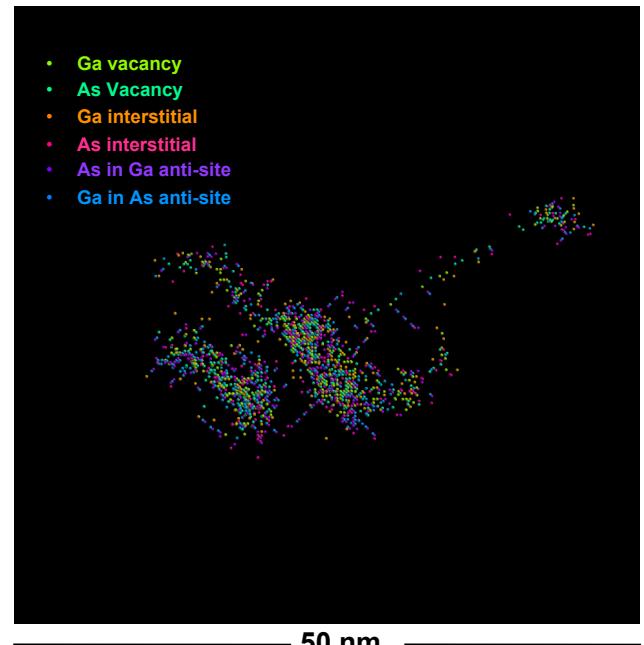




## *Analysis/Visualization of Atomic-level simulation data is often an ad hoc, inefficient process*

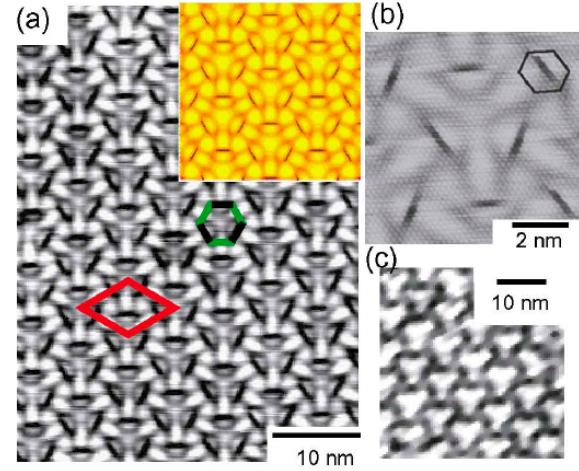
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- Large-scale molecular dynamics simulation
  - Raw Output: Time evolution of  $10^{6+}$  coordinates
  - Desired Output: Behavior/properties of higher-length-scale objects
    - » Examples: dislocations, grain boundaries
- Substantial effort has been made to create efficient, massively-parallel codes for MD simulations such as LAMMPS
- Analysis and visualization has received substantially less effort
  - Analysis of MD data can require compute resources that are a substantial fraction of basic MD run
  - Methods and code are home-grown and highly problem specific
    - » Choice of analysis often dictated by availability of codes rather than most useful approach

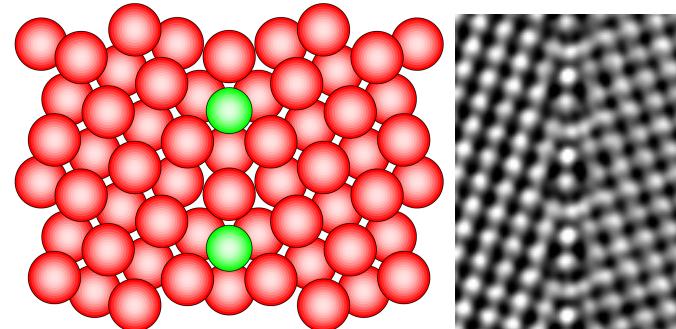


# *Determination of Defect Structure is often very difficult and frequently given insufficient care*

- One typically knows the bulk structure, but must guess/compute the actual structure of defect
  - **Nota Bene!** Incorrect structure means wrong results!
- Typical approaches use local minimum searches (e.g. conjugate gradient) plus, in good cases, multiple initial states
  - Major effort in grain boundary work discussed earlier
- **Global optimization problem involving both continuous and discrete variables**
  - “Relaxation” of atomic coordinates
  - Optimize species at each site in alloys
  - “Add/Remove” atoms
  - Interstitial atoms – where and how many



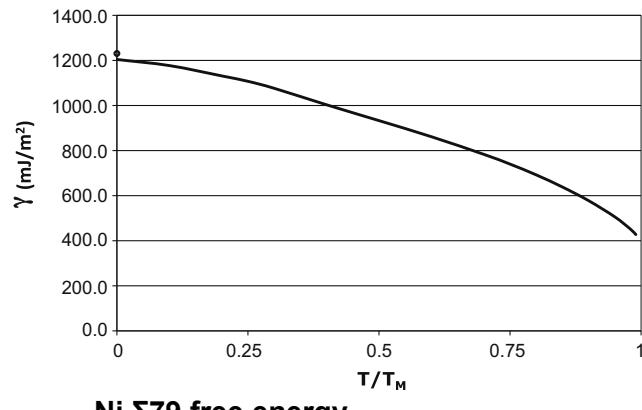
Ag(111)/Ru(0001)  
Ling, et al., PRL 92 116102 (2004)



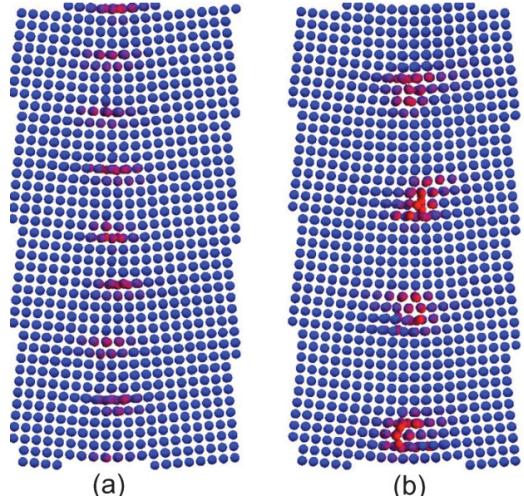
Cu/Al  $\Sigma 5(310)$   
Campbell, et al., Interface Science 12, 165 (2004)



## Finite-temperature effects are often underexplored



Ni  $\Sigma$ 79 free energy  
Foiles, Scripta Mater. 62, 231 (2010)



T-dependent grain boundary in Fe  
Olmsted, et al., PRL 106, 046101 (2011)

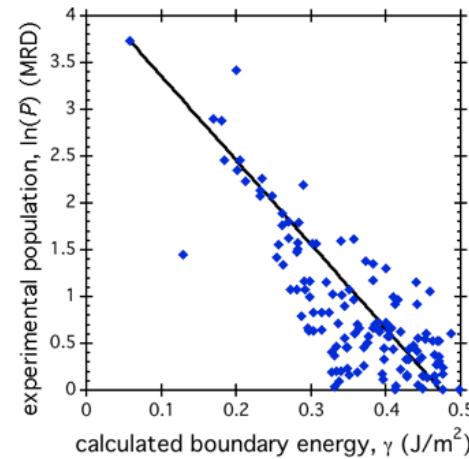
- Connection to higher length scales is often through thermodynamic quantities such as interfacial *free-energy*
  - Clearly temperature dependent
  - Often calculated at  $T = 0$
- Structures and properties may change with temperatures
  - Elastic constants are temperature dependent
    - » Leads to gb structure change on left
  - Variations of dynamic properties with temperature may not be what one expects
    - » Currently exploring this for the case of grain boundary motion



## Opportunities/Future

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- Increased validation and discovery from the detailed comparison of computations and experiments at the nanoscale
  - Advances in experimental methodology that permit examination at smaller scales
  - Advances in computation that permit simulations at larger scales
- Understand the *variability* of materials properties
  - “Paradigm shift, from the idealistic view that all parts are created equal, to the realistic view that structure, properties, and performance are probabilistic”
    - » Corbette Battaile, SNL
  - This variability originates at the atomic/mesoscale
  - Increasingly important as structures move to ever smaller sizes



Comparison of calculated and experimental gb energy  
Holm, et al., *Acta Mater.*, in press.