

# Predictive computational materials science

From nanoelectronics to explosives



*Ale Strachan*

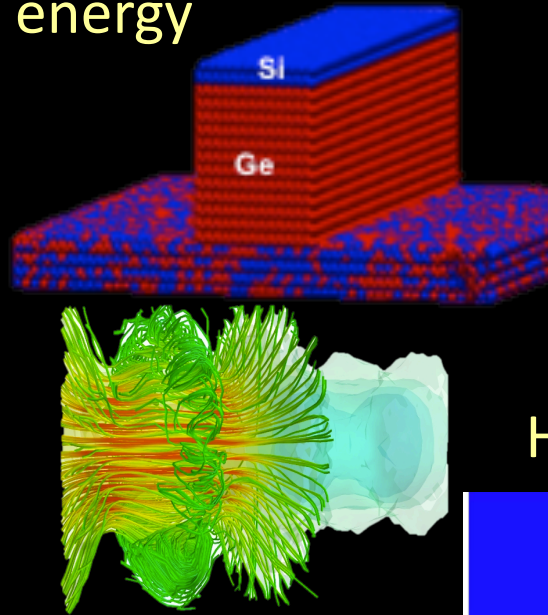
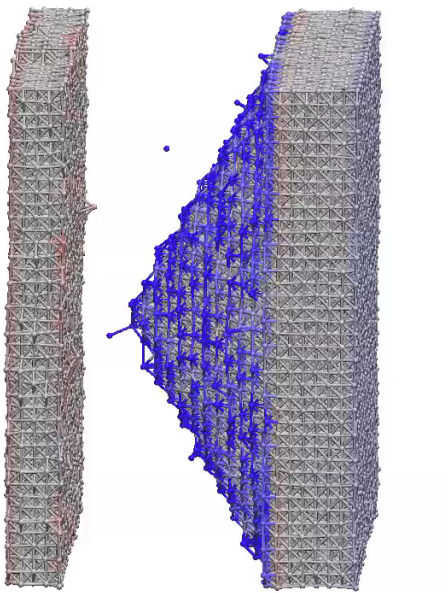
*Purdue University*

*strachan@purdue.edu*

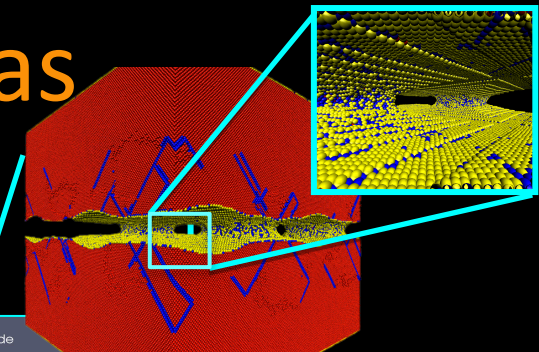
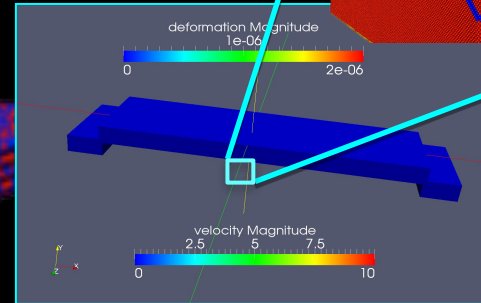
HUB usage 2016-01-01 00:00:00

# Strachan group application areas

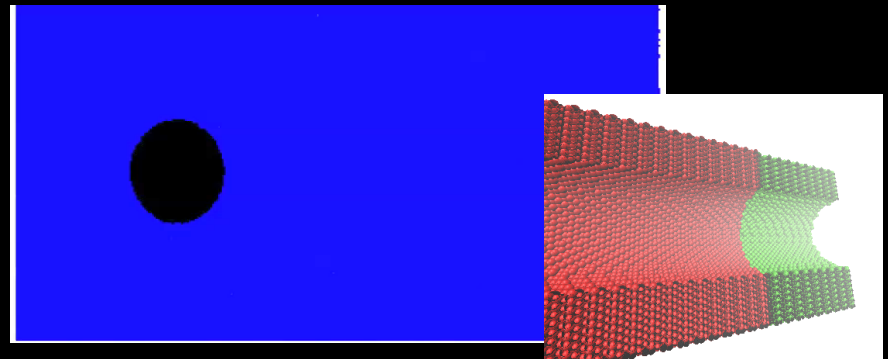
Nanoelectronics & energy



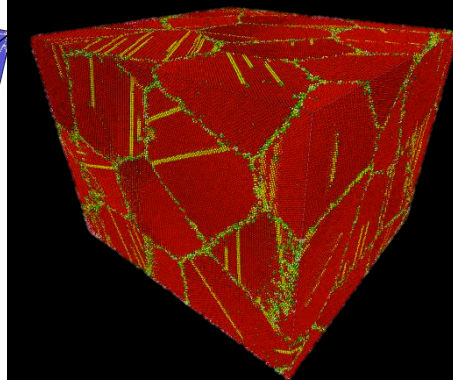
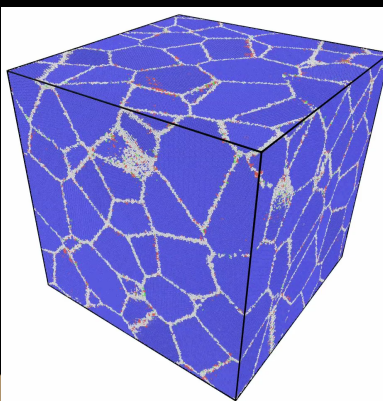
MEMS



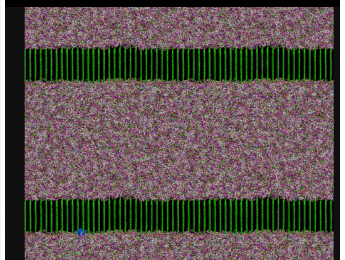
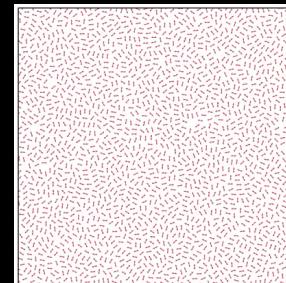
High-energy density materials



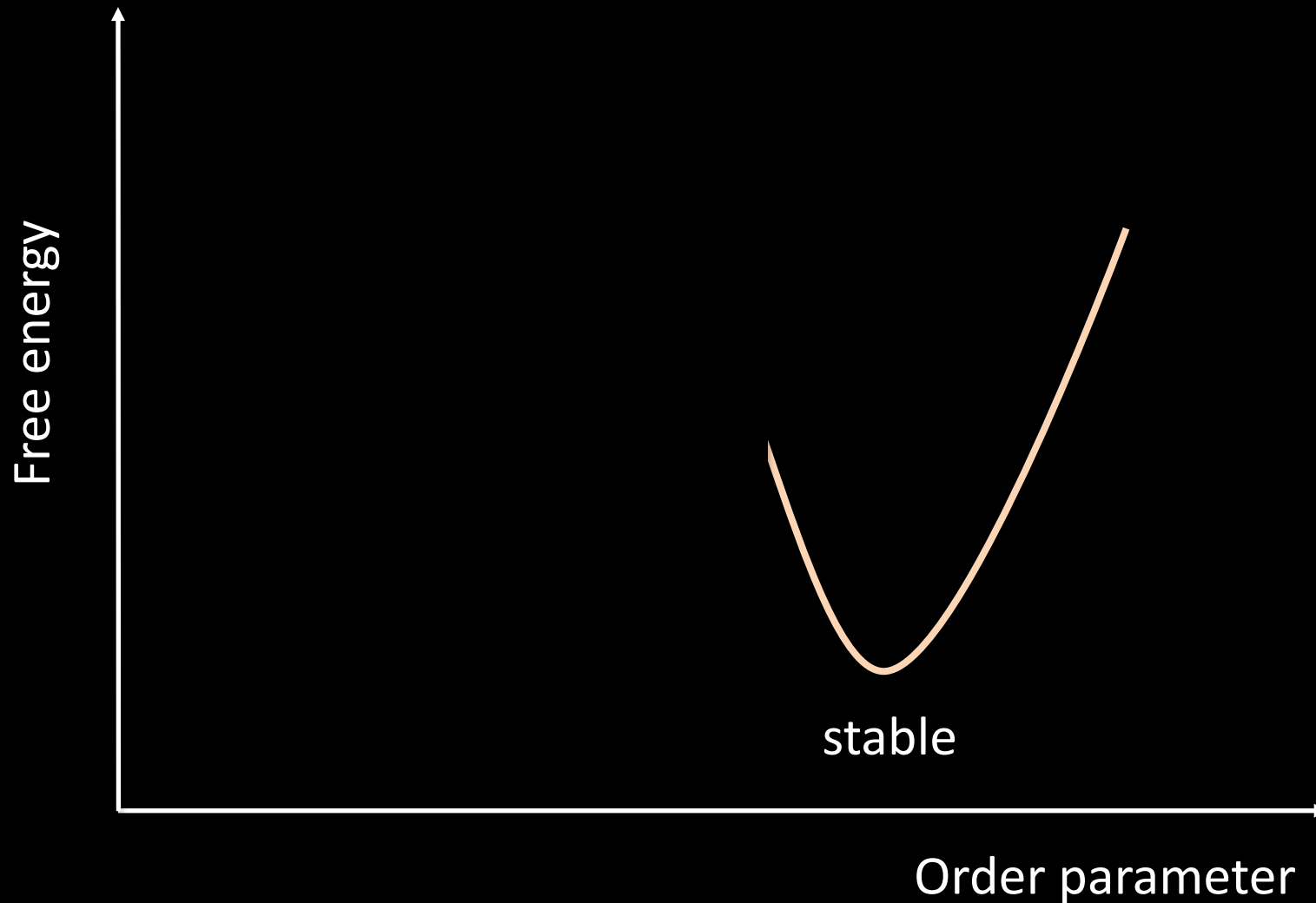
Thermo-mechanical response



Polymers, fibers & composites

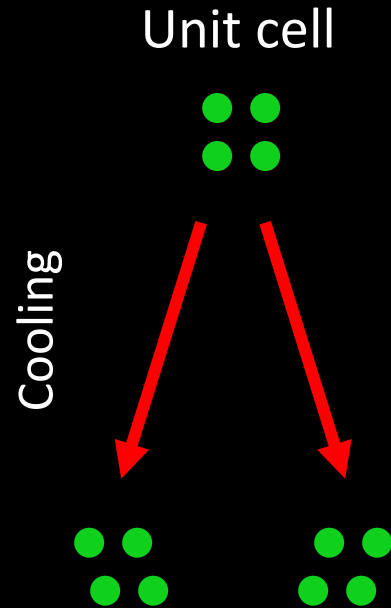
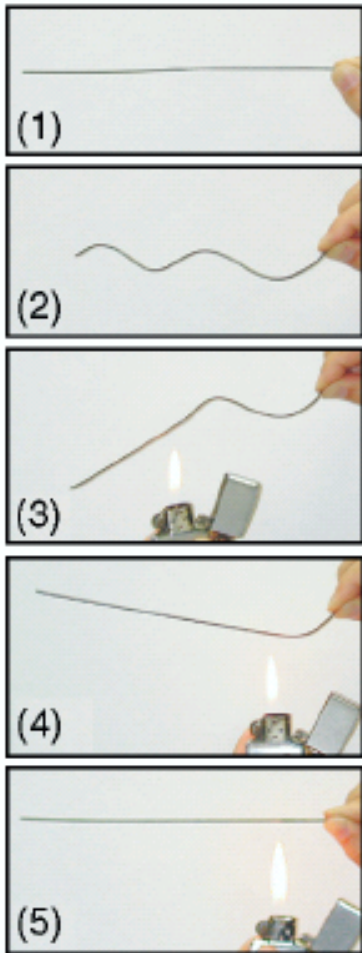


# Materials with unprecedented properties

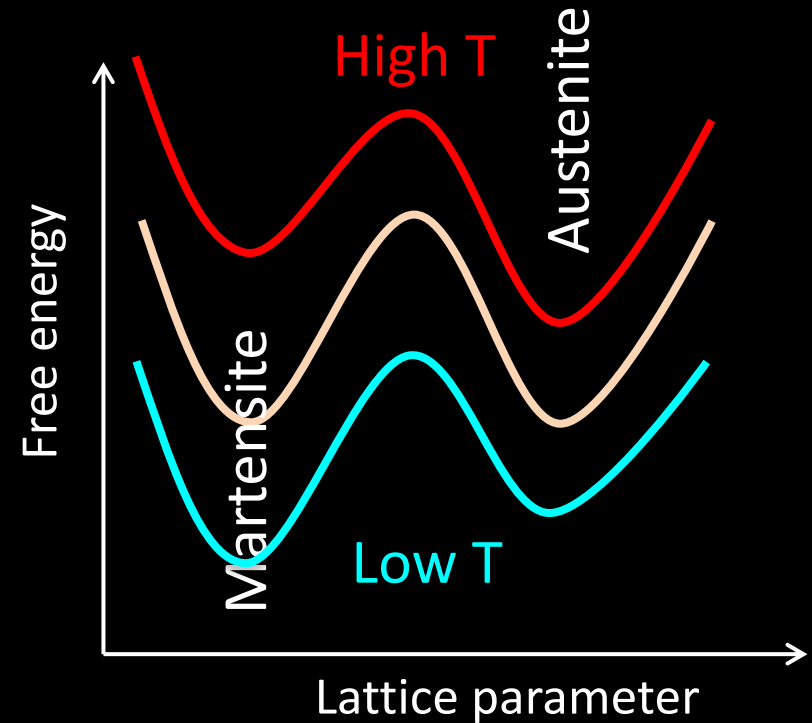




# Shape memory & superelasticity



Martensite microstructure in CuAlNi [Bhattacharya 2005]



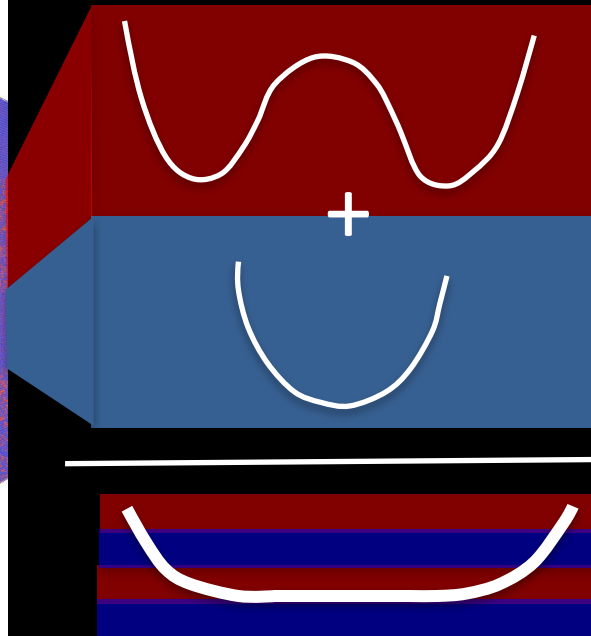
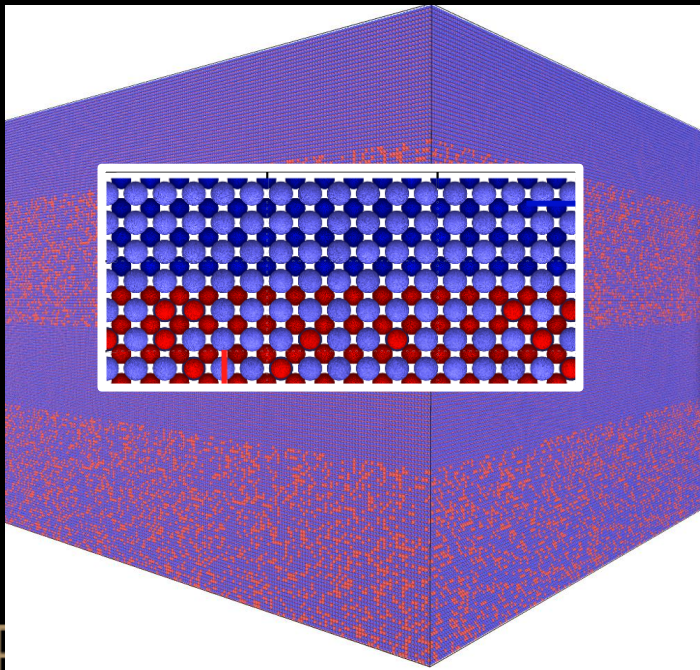
Multiple domains to accommodate elastic strains

Otsuka et al. MRS Bulletin,  
February, 2002



# A new class of composite

- Modify the underlying energy landscape to achieve desired properties
- Epitaxial integration of dissimilar materials
  - Force them to have the same in-plane lattice parameter
  - Can one stabilize thermodynamically unstable states
- Can we break away from standard bounds of composite design?



# NiAl alloys

- Disordered  $\text{Ni}_x\text{Al}_{1-x}$  ( $x \geq 0.61$ )
- Martensitic transition and shape memory

## DEVELOPMENT OF NiAl(B2)-BASE SHAPE MEMORY ALLOYS

R. KAINUMA\*, N. ONO\*\* and K. ISHIDA\*

\*Department of Materials Science, and \*\*Department of Machine Intelligence and Systems Engineering, Faculty of Engineering, Tohoku University, Sendai 980-77, Japan.

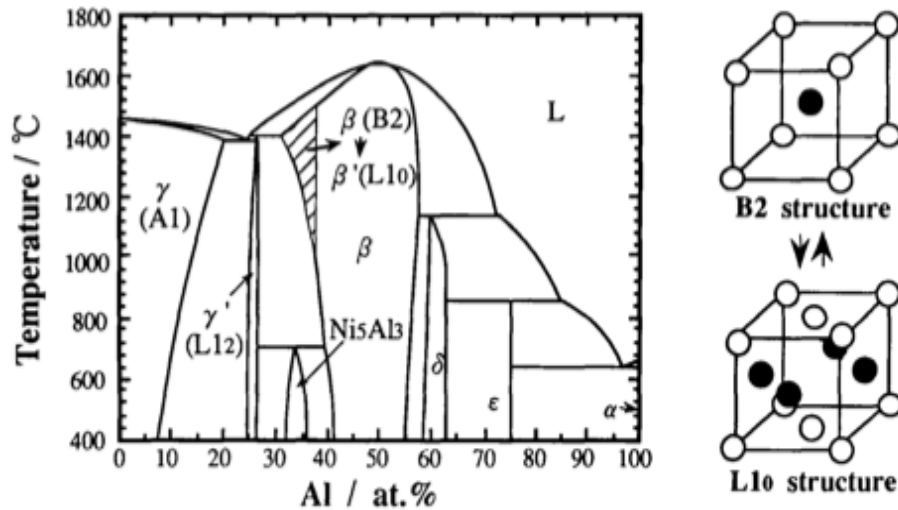
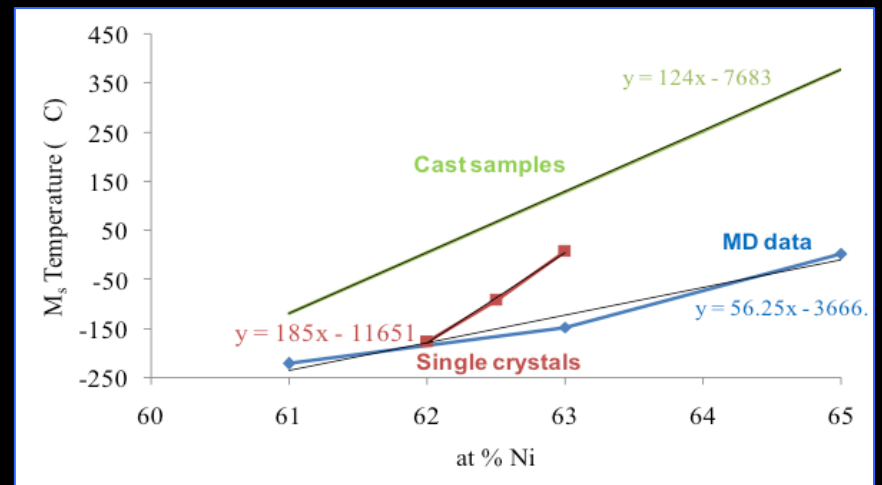
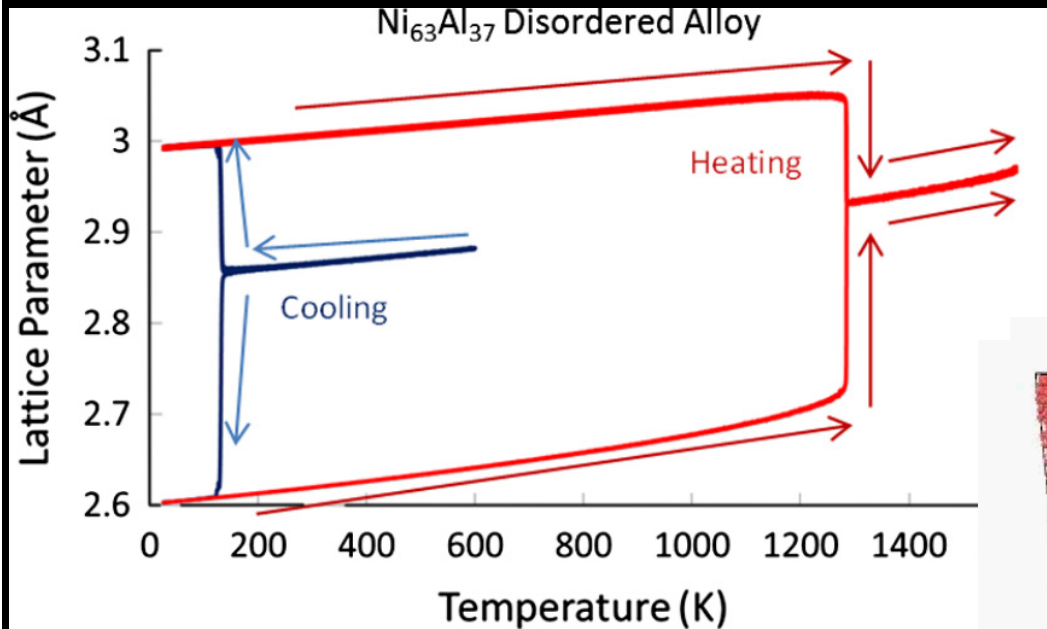


Fig.1 Phase diagram of the Ni-Al system.

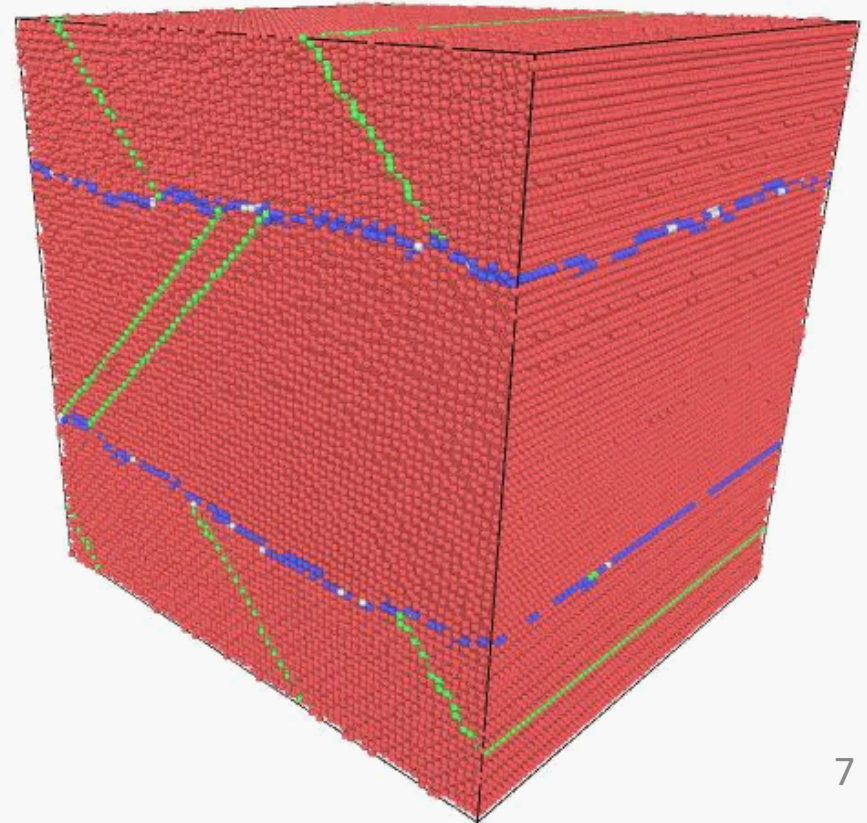
*EAM potential: Farkas et al.  
MSMSE, 3, 201-214 (1995)*



# $\text{Ni}_x\text{Al}_{1-x}$ martensitic transformation



Austenite  
Martensite  
Stacking Fault

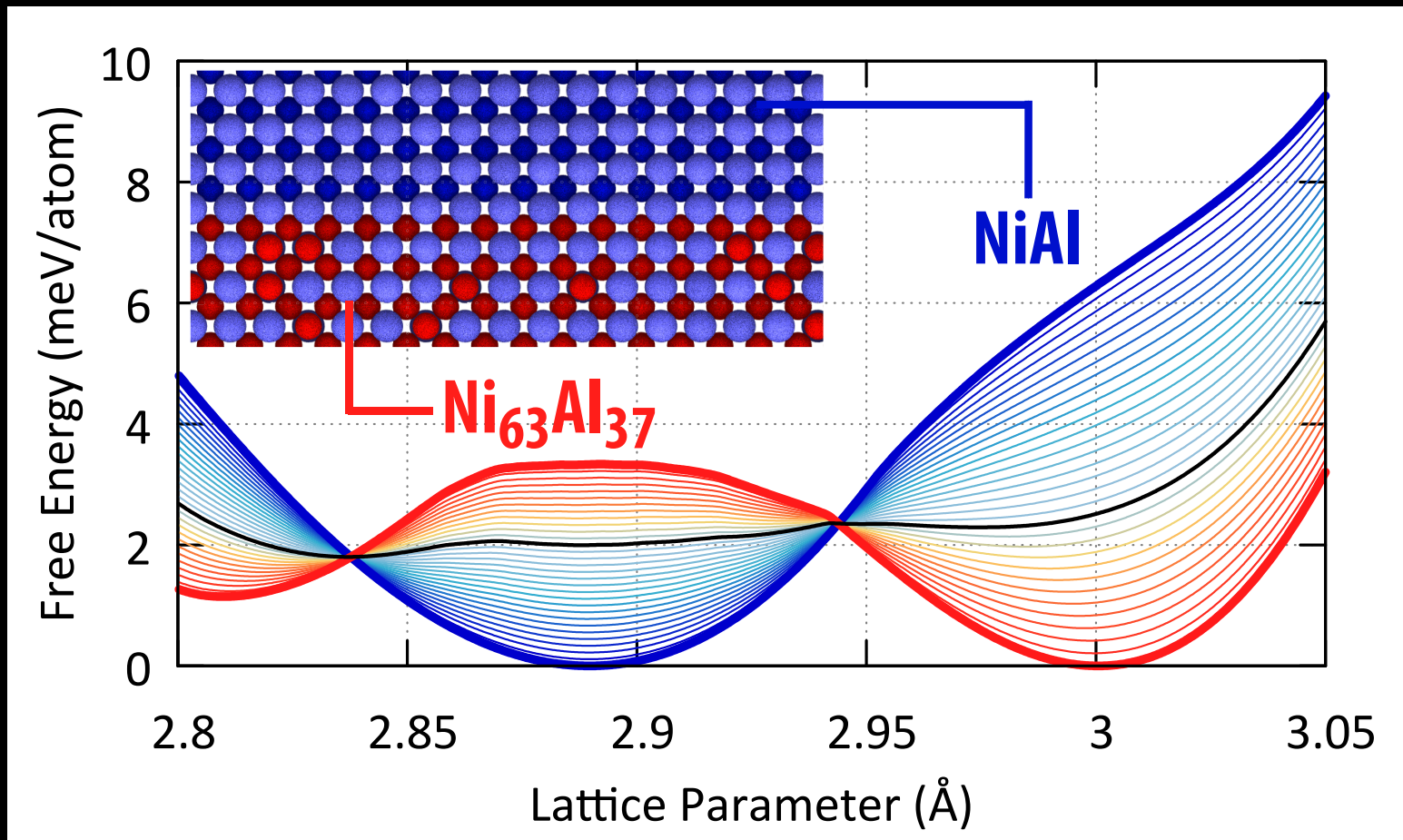


Austenite: cubic B2  
Martensite: monoclinic structure  
(similar but not identical to the  
experimental 14M structure)

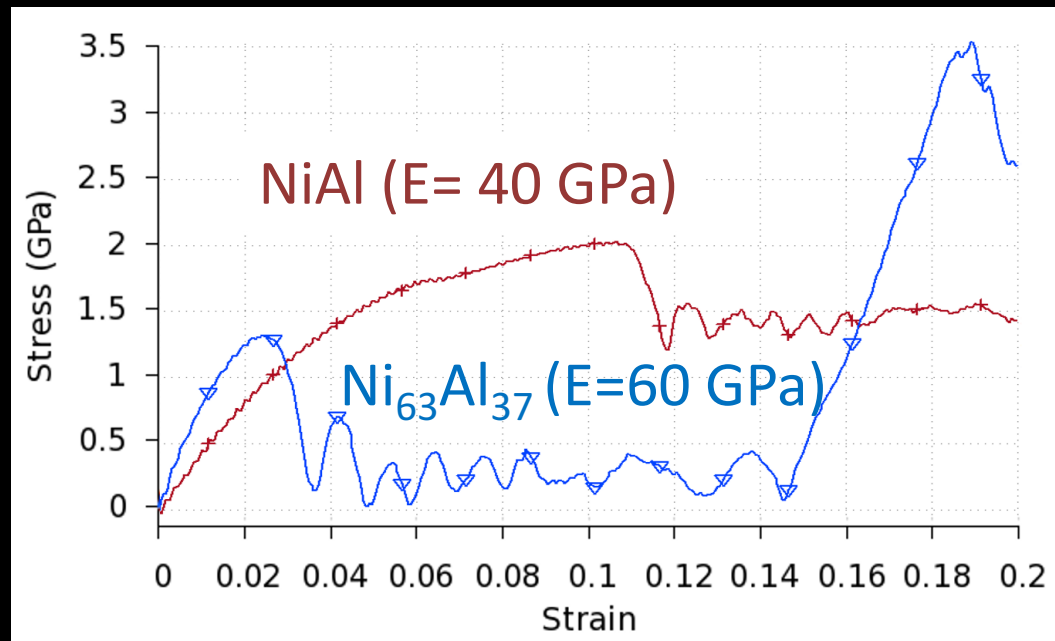
Morrison, Cherukara, and Strachan, Acta  
Materialia 69 30–36 (2014).



# NiAl alloys and metamaterials

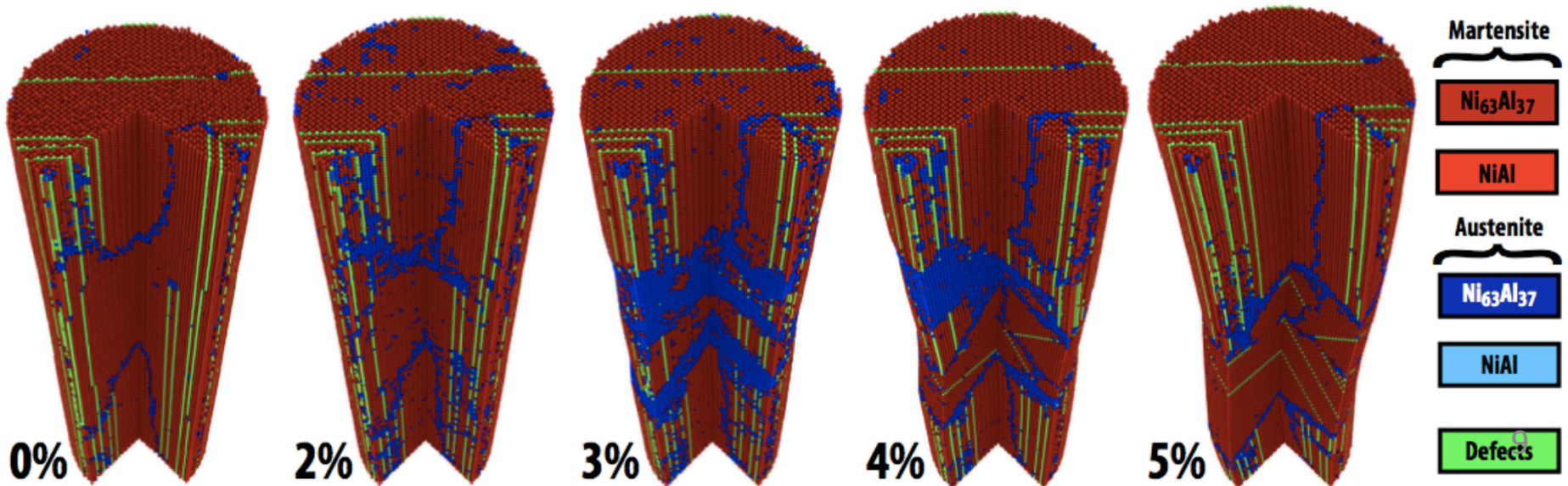


# Mechanical properties of pure phases



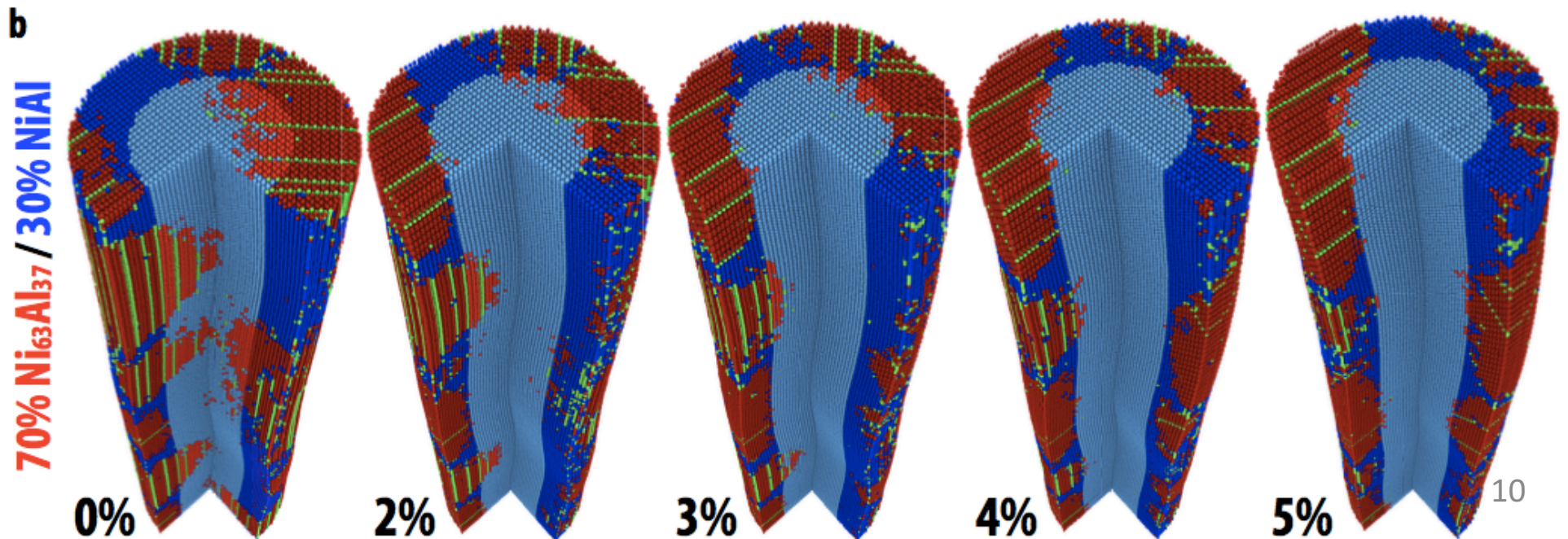
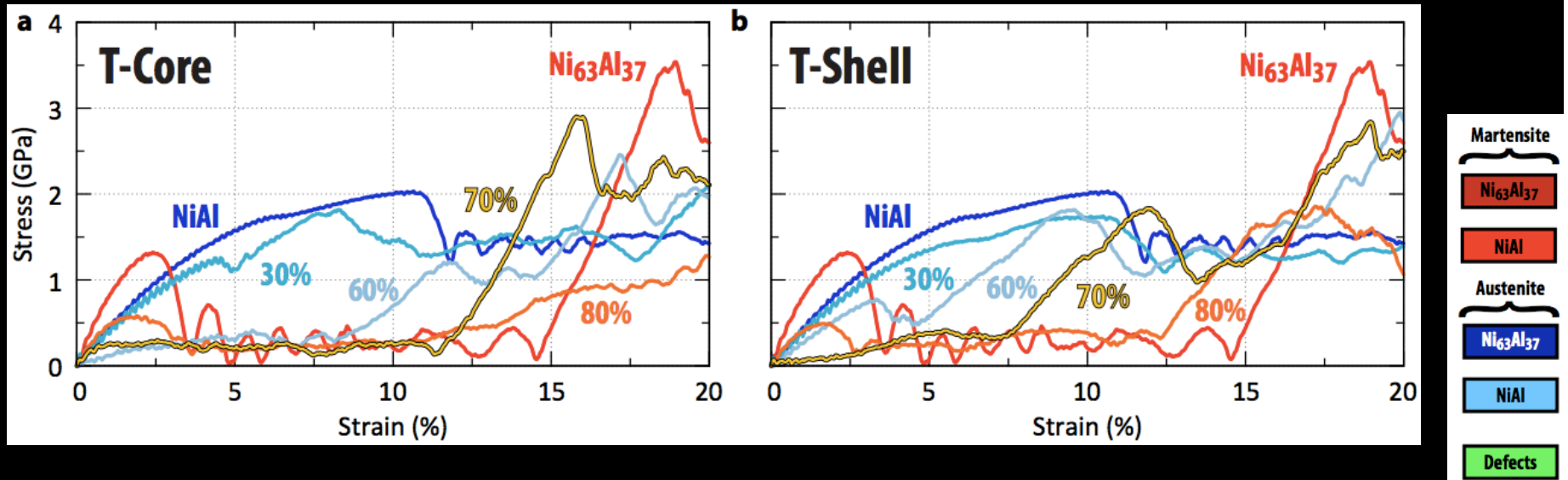
a

100% Ni<sub>63</sub>Al<sub>37</sub>





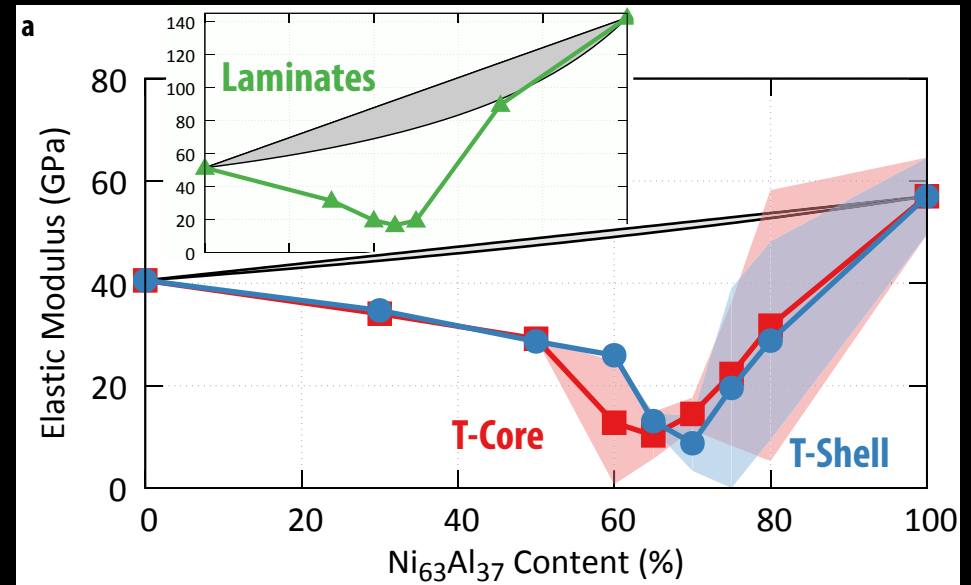
# Ultralow stiffness materials





# Defy composites design rules

- Epitaxial integration stabilizes negative stiffness states
- Defies traditional composite design bounds
- Fully dense metal with ultra-low stiffness (reaching ~2GPa)
- Works for different configurations and interatomic potentials

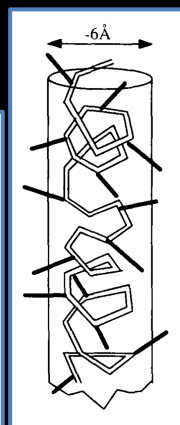
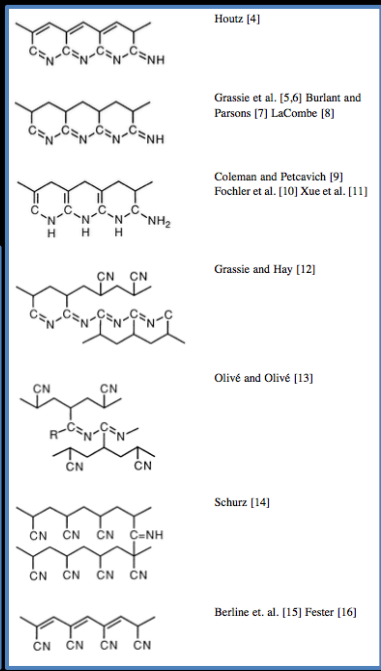


# Beyond $F=ma$

- Length and timescales achievable
  - Rare events
  - Effect of microstructure
- Lack of explicit description of electrons
  - Thermal conduction in metals
  - Electrochemical reactions

# Carbon fibers: processing-properties

## Oxidation & stabilization



*Gupta et al. Carbon (1996)*

*Dalton et al. Polymer(1999)*

## Carbonization & graphitization

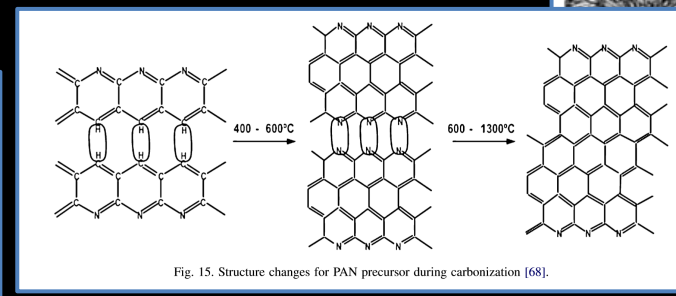
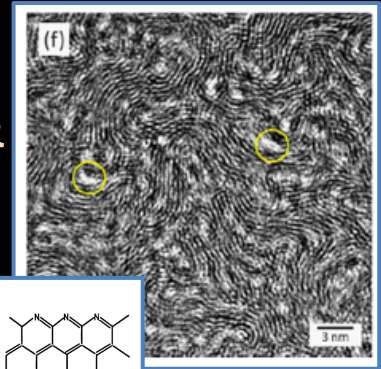


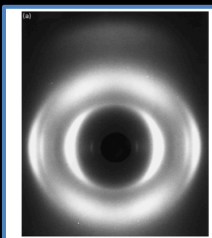
Fig. 15. Structure changes for PAN precursor during carbonization [68].

*Rahaman et al 2007.*

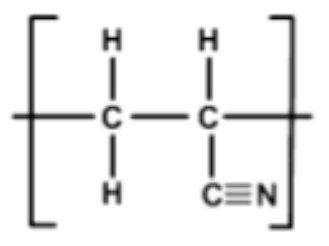


*Kumar*

## Spinning



PAN

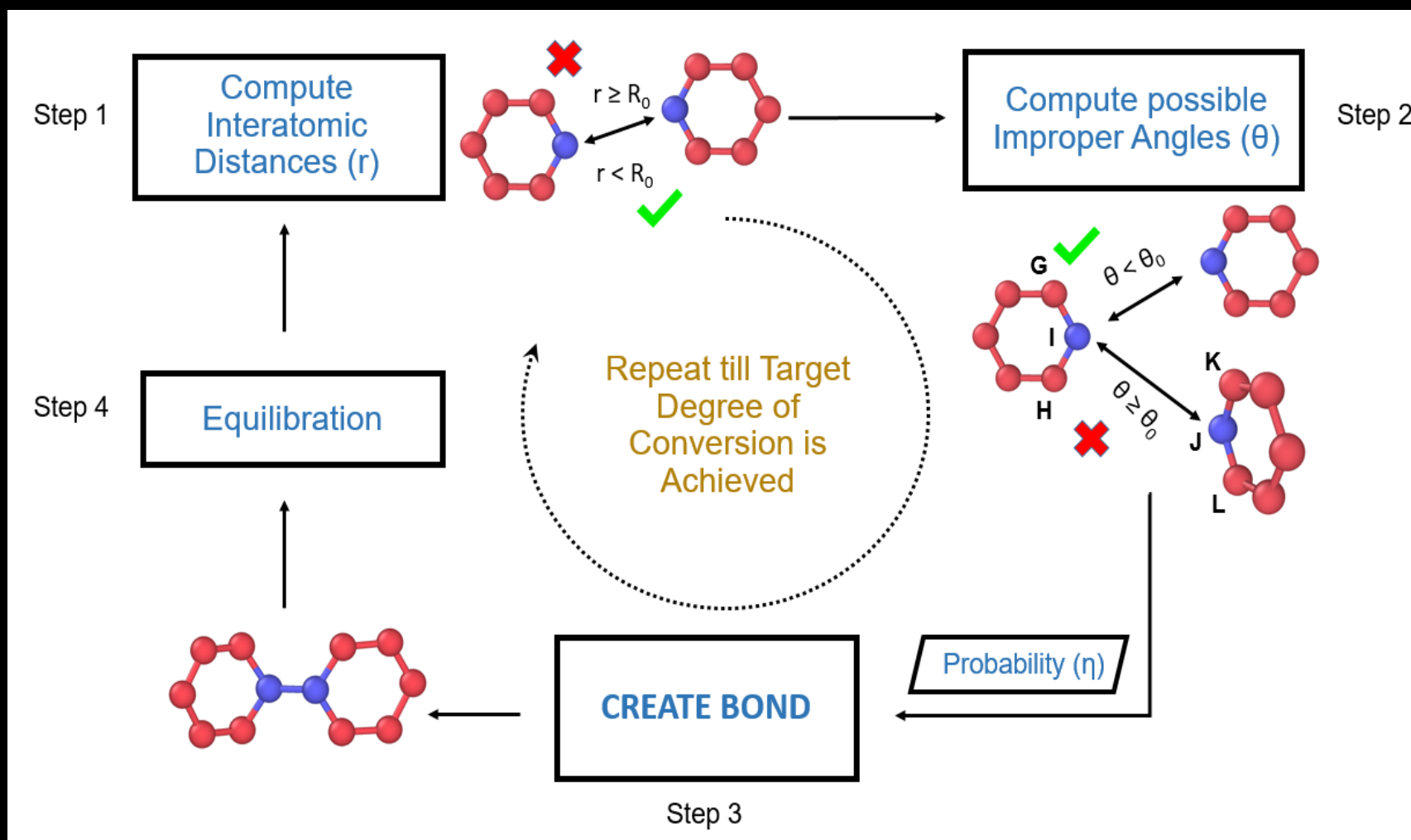


*Dalton et al. Polymer(1999)*

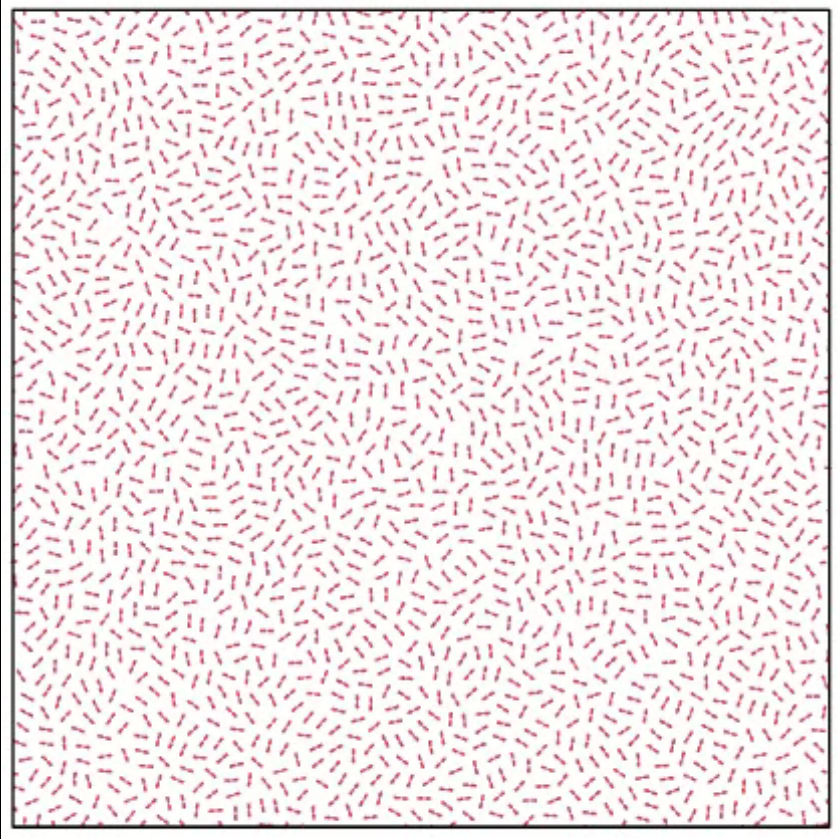




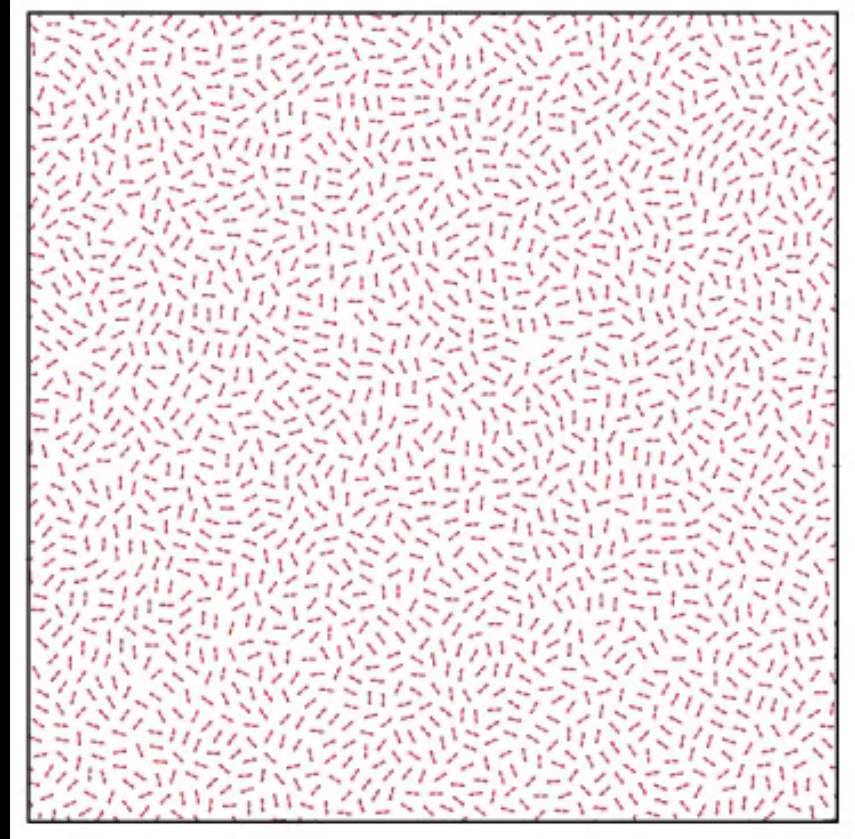
# kMCC + MD to mimic carbonization



# The birth of a carbon fiber

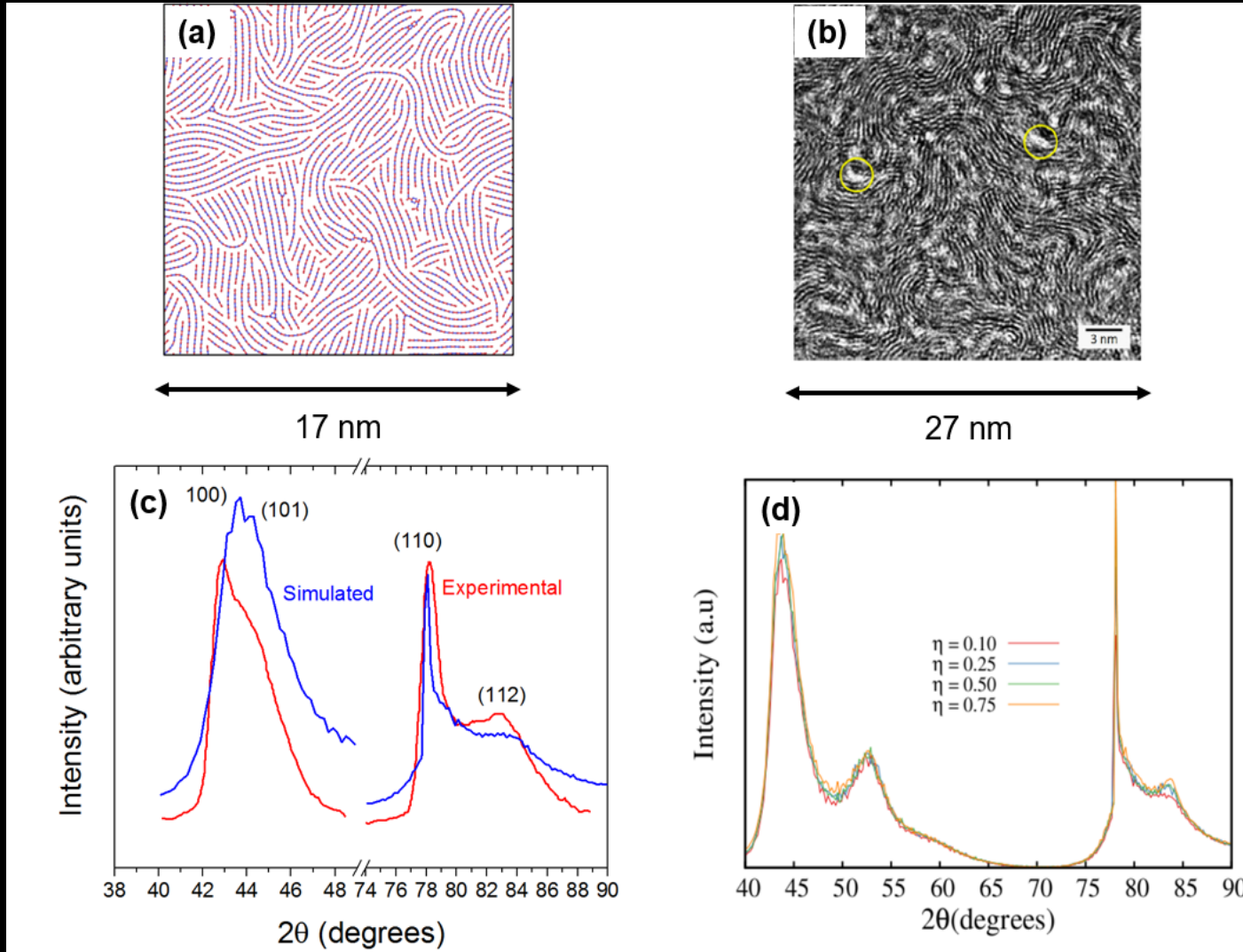


- Distance cutoff = 4.5 Å
- Angle cutoff < 20°
- Temp = 300K



- Distance cutoff = 5.0 Å
- Angle cutoff < 20°
- Temp = 300K

# Good agreement with experiments





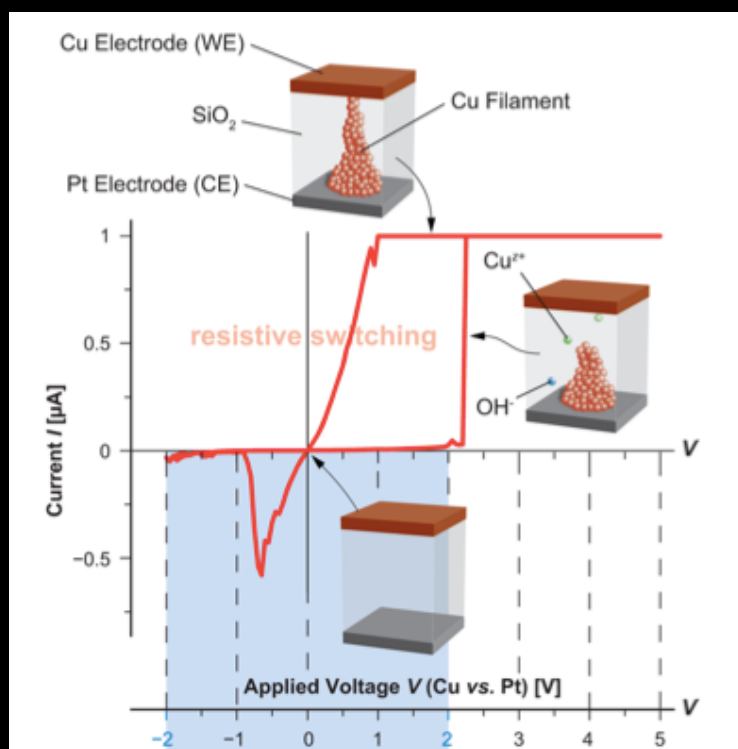
# Resistive switching memory

Electrochemistry metallization cells

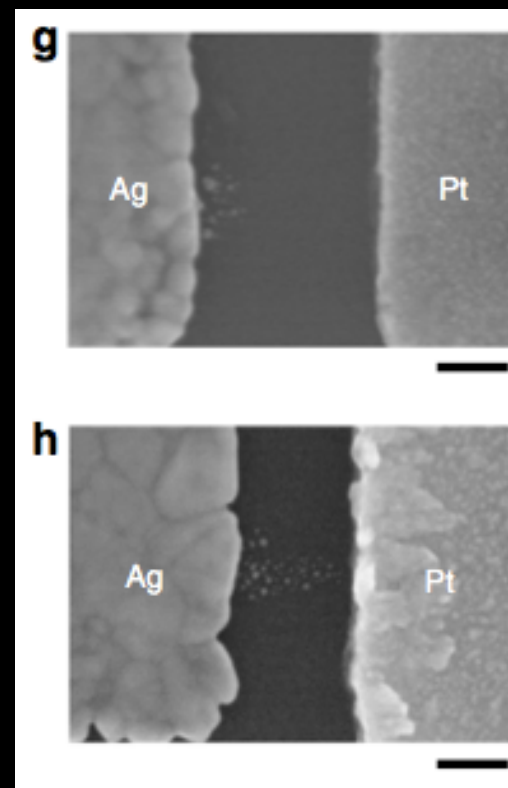
- Switching times in the nanoseconds
- Scalability down to the nanometer scale



STARnet



Tappertzhofen et al.  
*ACS Nano* (2013)



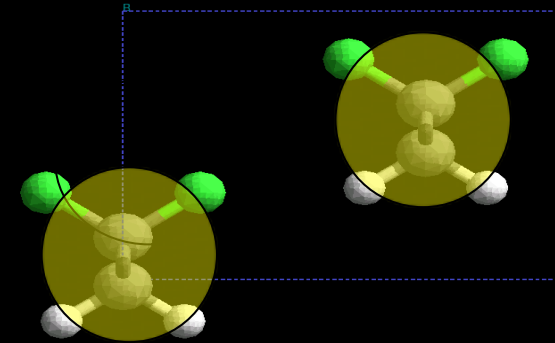
Lu group, *Nat. Comm.* (2012)

# Dynamics with implicit degrees of freedom

$$\dot{R}_i = V_i$$

$$\dot{V}_i = F_i/M_i$$

$$\chi_i = v \frac{T_i^{part} - T_i^{int}}{T_0}$$



Other variables may play important roles:

- Internal degrees of freedom in coarse grain simulations
- Conduction electrons in simulations of metals
- Electrochemical potential in EMCs

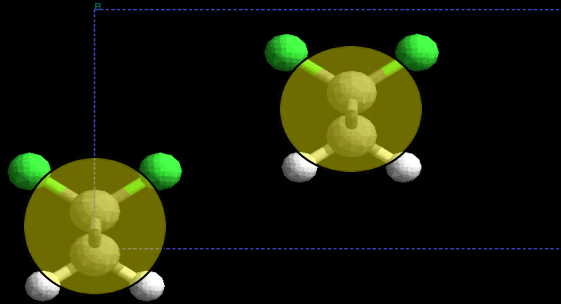
## Key features of DID

- Total energy (meso + internal) is conserved
- c.m. velocity is conserved
- Galilean invariant
- Correct description of the ballistic regime

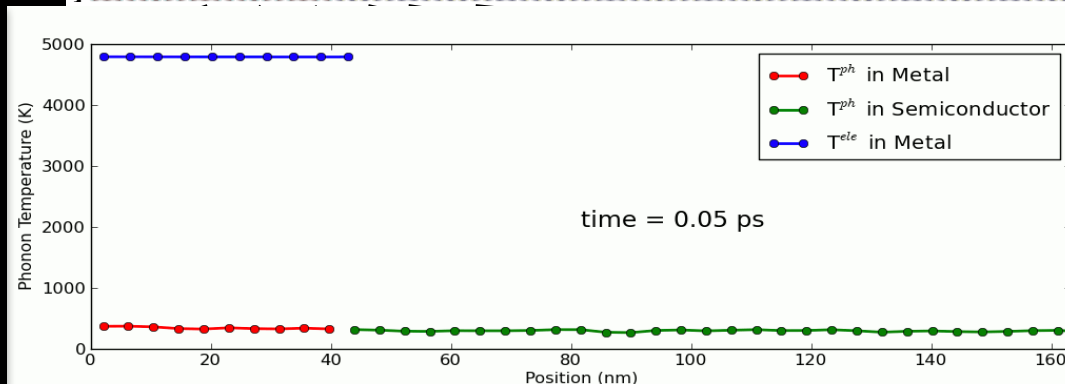
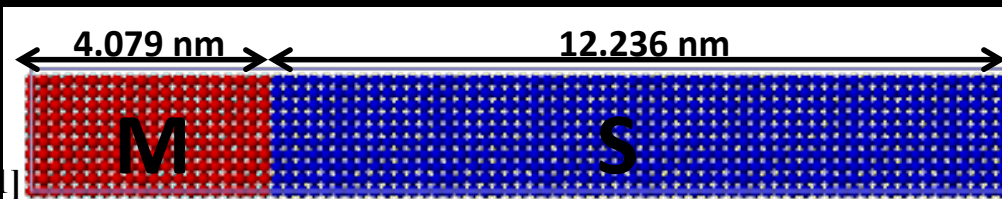
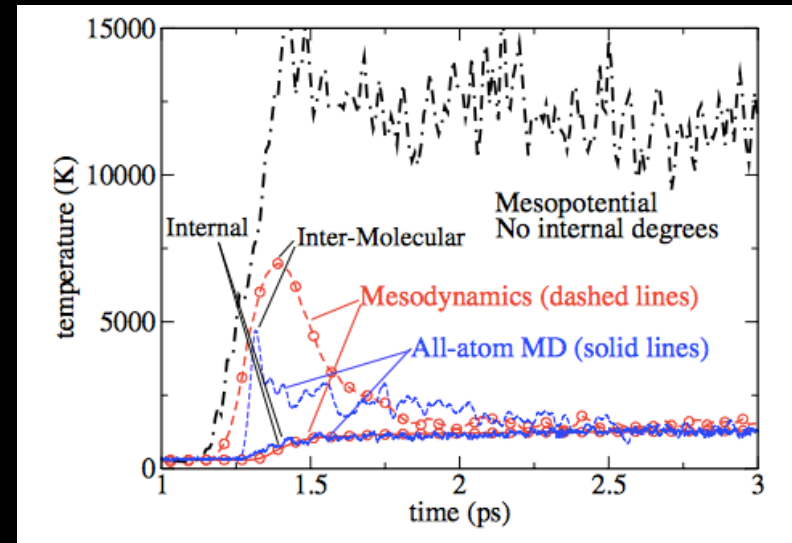
*Strachan & Holian, Phys. Rev. Lett. (2005)*  
*Lynch, Thompson, & Strachan, MSMSE, (2009)*  
*Zhou, Anglin, Strachan, J. Chem. Phys. (2009)*  
*Lin, Holian, Germann, Strachan, J Chem. Phys. (2014)*

# Sample DID applications

Shock wave propagation



Strachan & Holian, *Phys. Rev. Lett.* (2005)

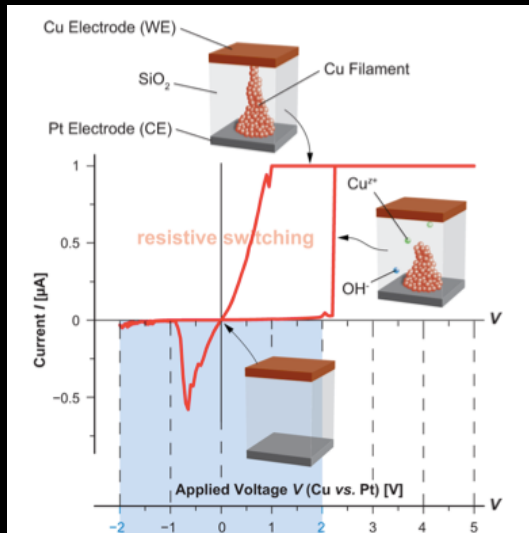


Laser heating experiments

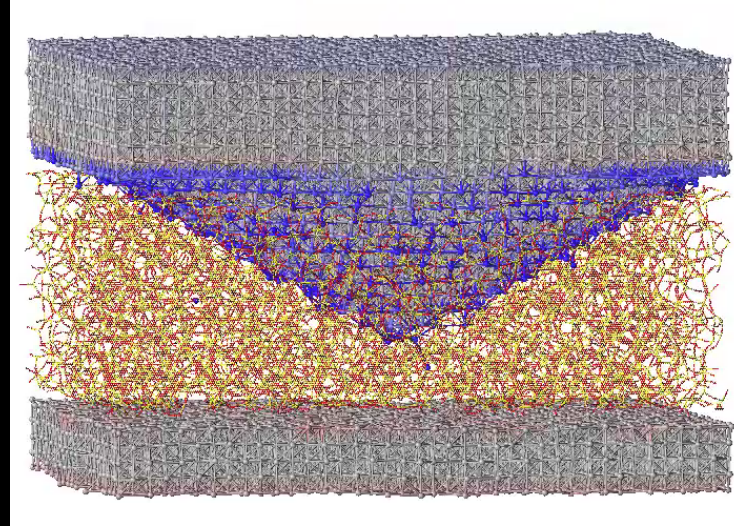
Lin et al. *J. Chem. Phys.* (2015)

Lin, Holian, Germann, Strachan, *J Chem. Phys.* (2014)

# Modeling electrochemical reactions



Electro-metallization cells for nanoelectronics



Tappertzhofen et al. ACS Nano (2013)

Self-consistent atomic charges in reactive MD simulations

Total electronic energy:

$$E(\{q_i\}; \{R_i\}) = \sum_i \left( \chi_i^0 q_i + \frac{1}{2} H_i q_i^2 \right) + \sum_{i < j} q_i q_j J(|R_i - R_j|)$$

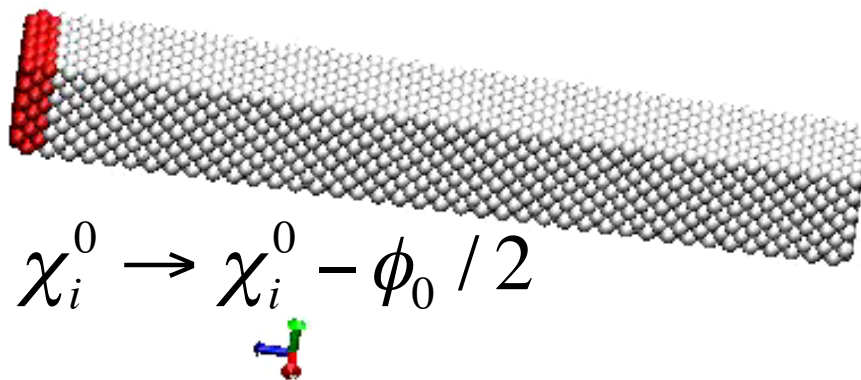
Electronegativity equilibration:

$$\chi_i = \chi_0 = \frac{\partial E(\{q_i\}; \{R_i\})}{\partial q_i} = \chi_i^0 + H_i q_i + \sum_{j \neq i} q_j J(|R_i - R_j|)$$

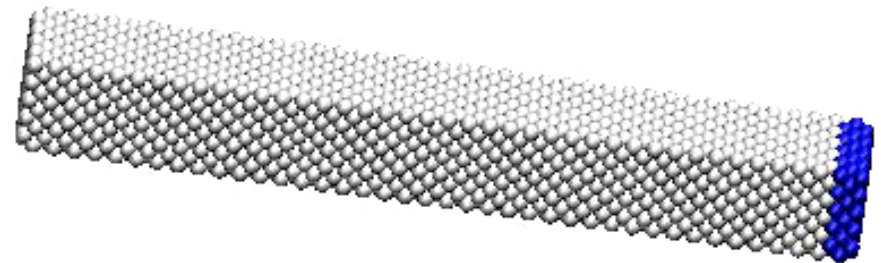
# Electrochemical potential equalization

Total electronic energy: 
$$E(\{q_i\}; \{R_i\}) = \sum_i \left( \chi_i^0 q_i + \frac{1}{2} H_i q_i^2 \right) + \sum_{i < j} q_i q_j J(|R_i - R_j|)$$

Application of an external electrochemical potential by modifying the local atomic electronegativity



$$\chi_i^0 \rightarrow \chi_i^0 + \phi_0 / 2$$



Voltage equilibration within metallic electrodes:

$$\dot{\phi} = k \nabla^2 \phi$$

$$\dot{\phi}_i(t) = \sum_{j \neq i} \frac{\phi_i(t) - \phi_j(t)}{|R_{ij}|^2} w(R_{ij})$$

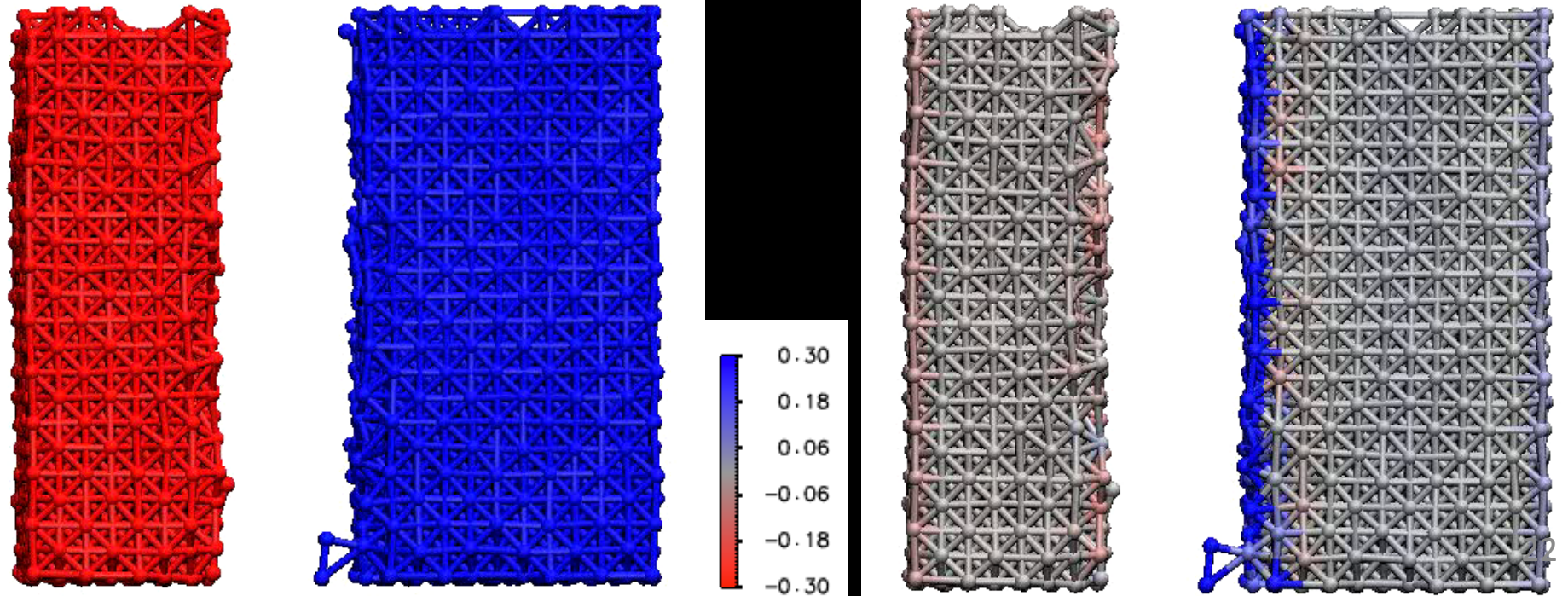


# EChemDID at work

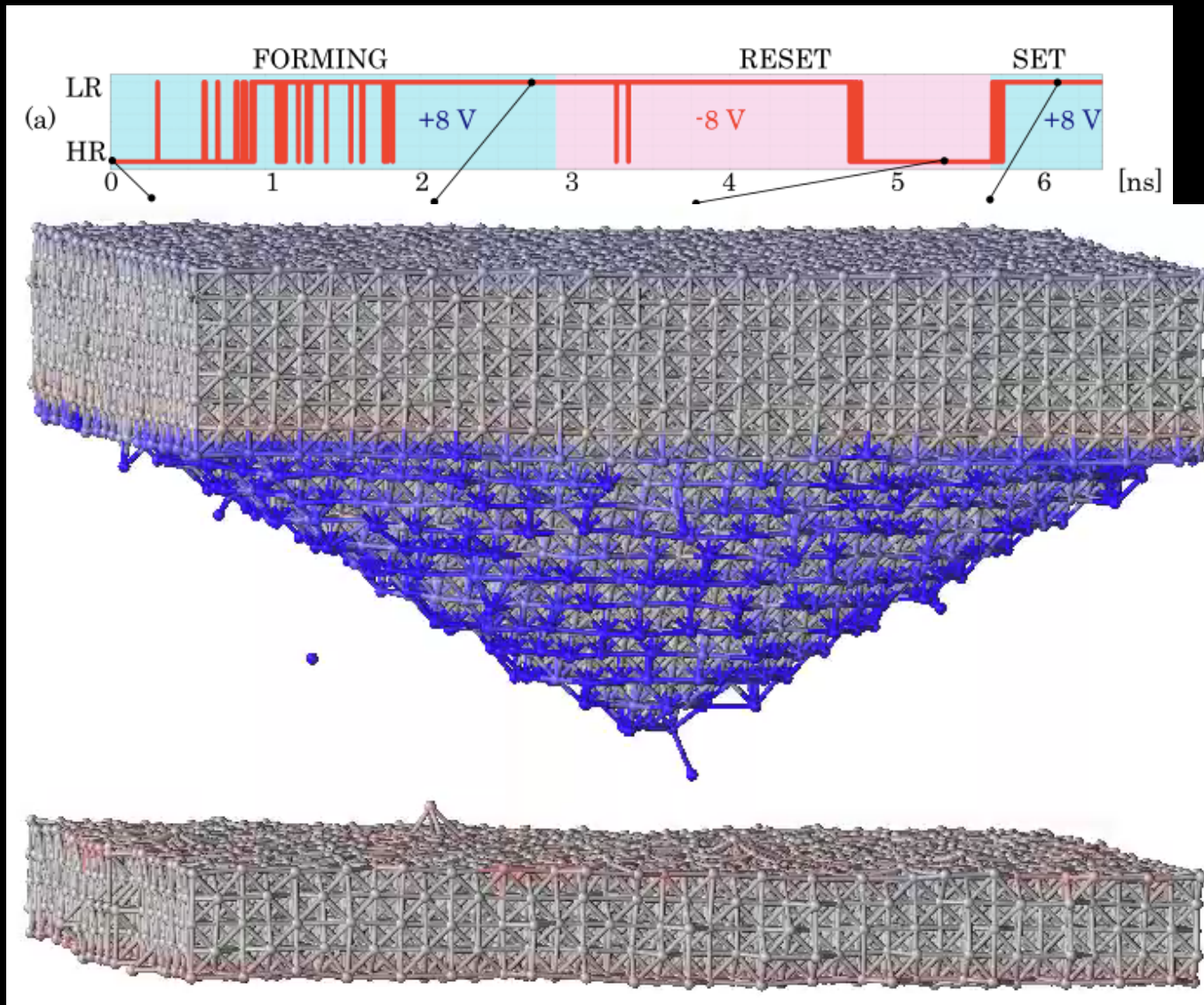
- Reactive interatomic potentials enable chemical reactions
- Charge transfer using charge equilibration (Qeq)
- **EChem-DID**: external voltage affects atomic electronegativity

Local electrochemical potential

Partial charges



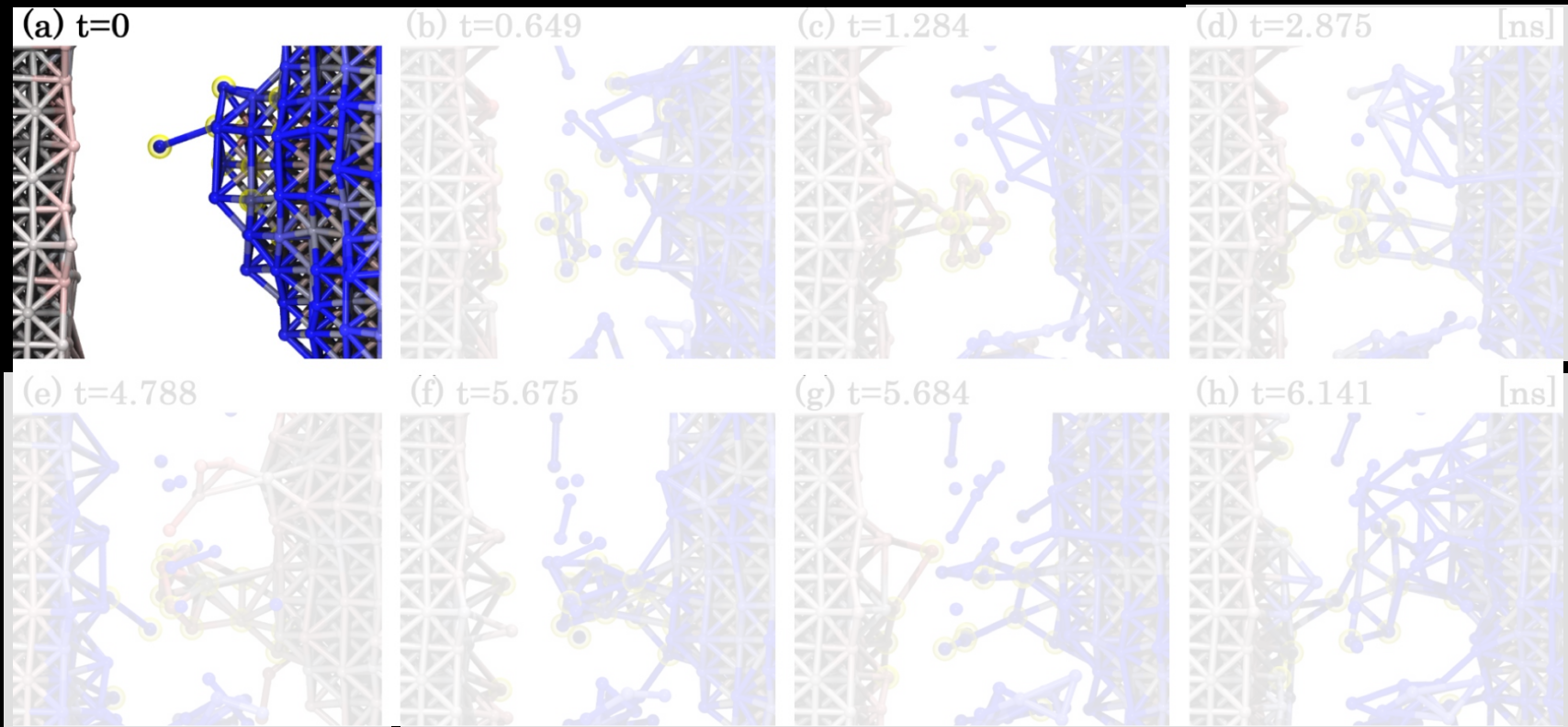
# Atomistic simulations of switching





# Mechanism of switching

1. FORMING: Cluster formation
2. FORMING: Reduction stabilizes dissolved Cu

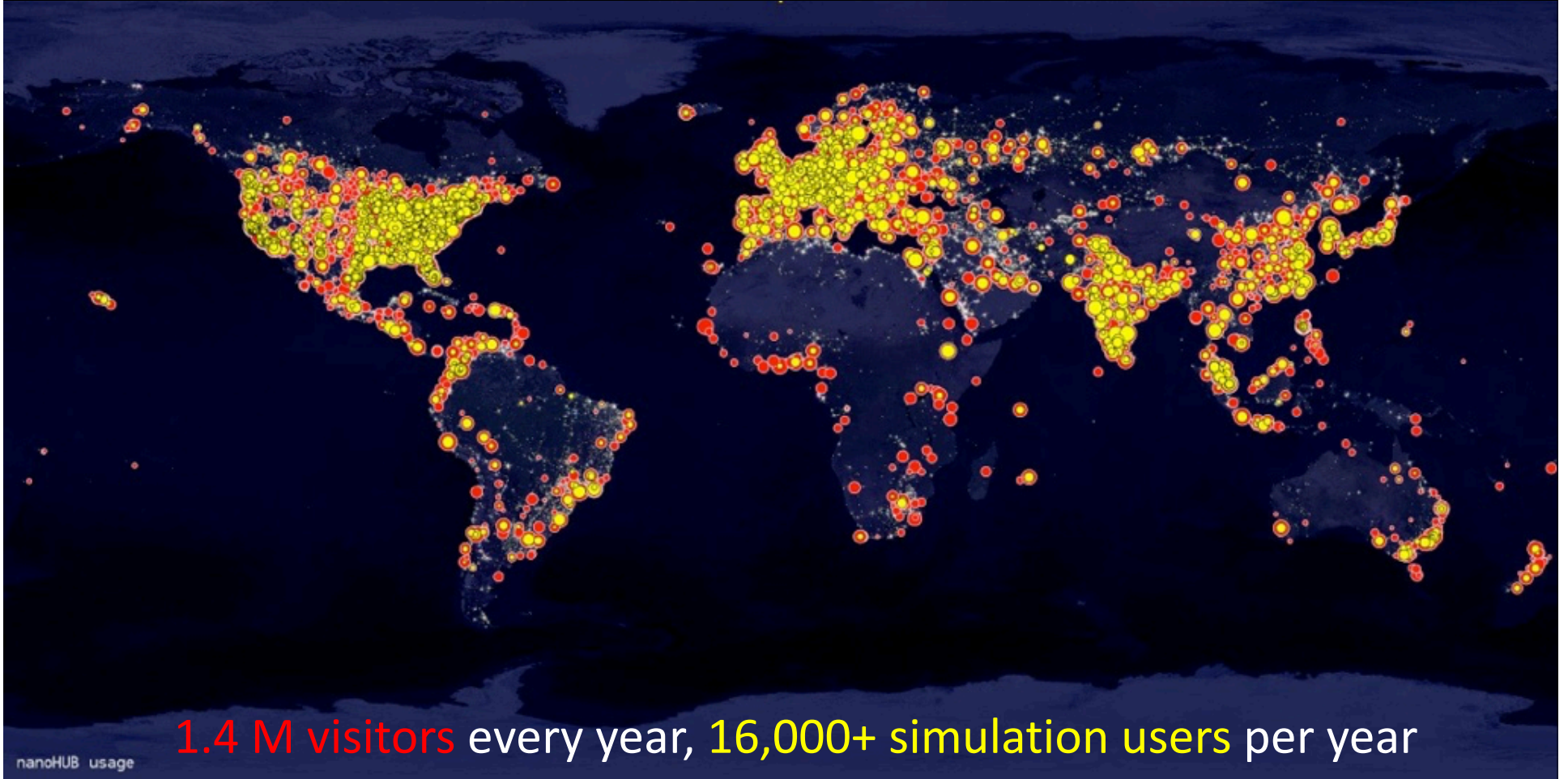


3. RESET: Filament breaks near inactive electrode
4. SET: Filament attached to active electrode dissolves

5 SET: cluster formation & reduction <sup>24</sup>

# Online simulations using nanoHUB

Developed & operated by the Network for Computational Nanotechnology  
Supported by the US National Science Foundation





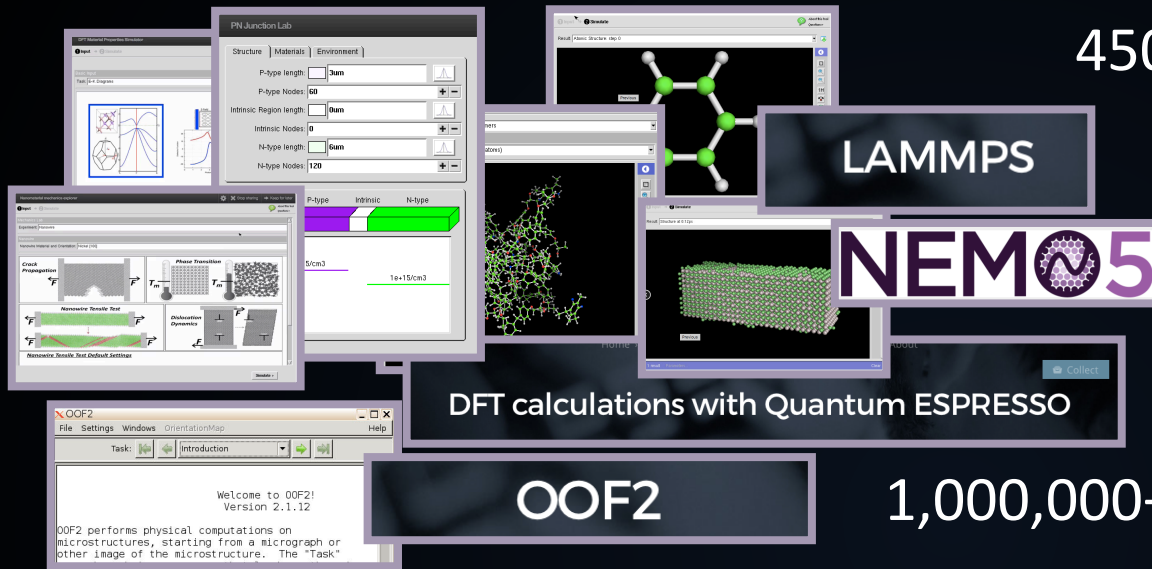
# nanoHUB online simulations

450+ simulation tools

1,800+ contributors

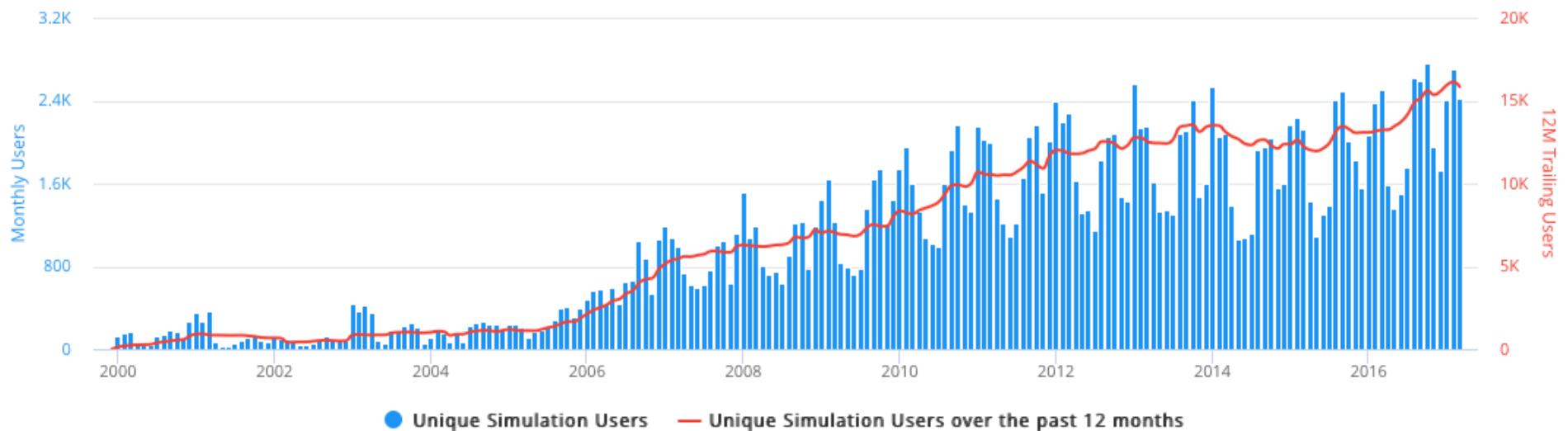
16,000+ annual simulation users

1,000,000+ simulations per year



nanoHUB Simulation Users

12 Trailing and Monthly



# Tools designed for end users

<https://nanohub.org/tools/nanomatmech>

Nanomaterial mechanics explorer

1 Input → 2 Simulate

Mechanics Lab

Experiment: Nanowire

Nanowire

Nanowire Material and Orientation: Nickel [100]

Crack Propagation

Phase Transition

Nanowire Tensile Test

Dislocation Dynamics

Nanowire Tensile Test Default Settings

Simulate >

*Powered by LAMMPS*

<https://nanohub.org/tools/dftmatprop>

DFT Material Properties Simulator

1 Input → 2 Simulate

Basic Input

Task: E-K Diagrams

Material Type: Semiconductor

Semiconductors: Si

Advanced Options:  no

Simulate >

Storage (manage) 56% of 20GB

850 x 650

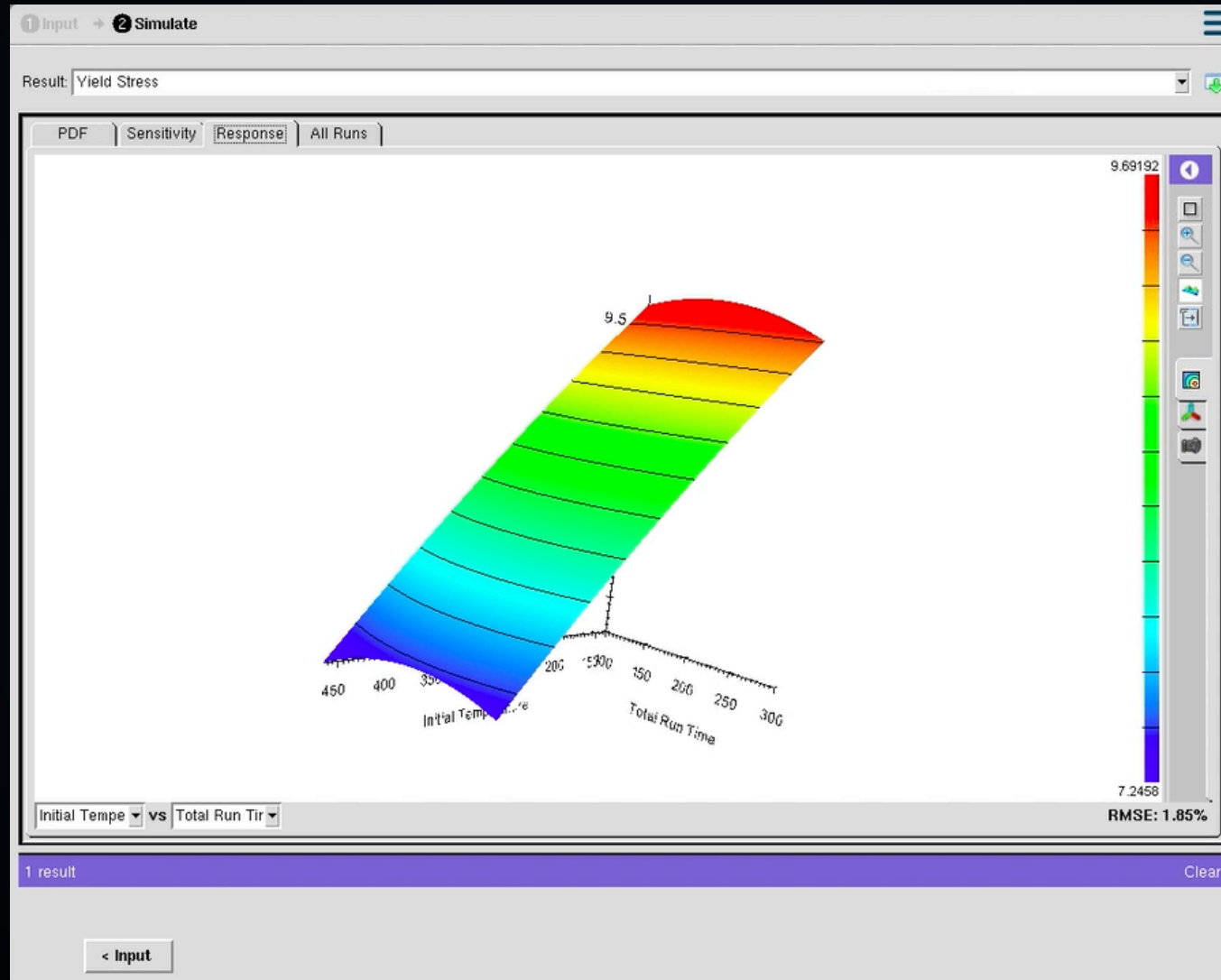
*Powered by Quantum Espresso*

- Tool outputs stated at the outset
- Powerful visualization
- Experts can customize the simulation



# Your tool ... more powerful in nanoHUB

- Automatic UQ available for all Rapture tools



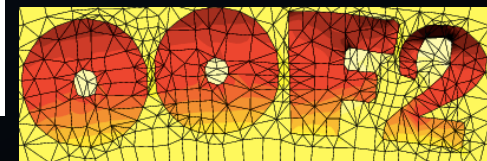
# Jupyter notebooks in nanoHUB

```
File Edit View Insert Cell Kernel Widgets Help Python2 O
Dashboard View: </>
Calculate Tg using nanoHUB PolymerModeler and LAMMPS
By Ben Haley, Purdue University
Import libraries and setup LAMMPS
In [ ]: # Setup
import sys
import subprocess as sp
sys.path.append('/apps/share64/debian7')
from hubwf import RapptureTask
import nglview
from ipywidgets import Label, VBox
import hublib.use
%use lammps-15May15
sys.path.append('/home/nanohub/strachan')
from Tgcalc import getVDT, getVDTdata, getTg_BL, getHyperb
import matplotlib.pyplot as plt
%matplotlib notebook
Setup PolymerModeler variables
Setup monomer, number of monomers per chain and number of chains.
PolymerModeler uses Configurational Bias Continuous Monte Carlo to build relaxed polymer structures
In [ ]: # First task: run PolymerModeler to pack chains into a box
task1 = RapptureTask('polymod')
```

1. PolymerModeler (Rappture)
  - Amorphous builder
2. nglview
  - Visualizer
3. LAMMPS
  - Molecular dynamics



Ben Haley

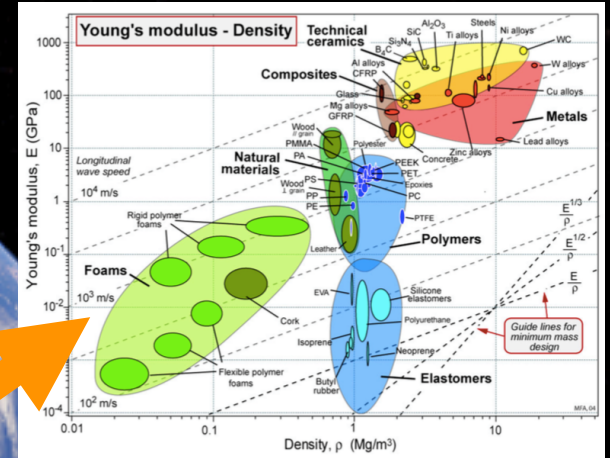




# Connecting to other infrastructures



NSF Knowledge of Interatomic Models



Granta MI, UK



# nanoHUB -KIM collaboration



Knowledge of Interatomic Models  
NSF Cyberenabled Discovery & Innovation  
Ellad Tadmor, Ryan Elliot, J. Sethna

## KIM Models

Click on an element in the periodic table for which you need an interatomic model.

KIM Models (interatomic potentials and force fields) are software packages for describing atomic interactions that can be used with a variety of simulation codes, including LAMMPS, DL\_POLY, IMD, ASE and GULP, that are compatible with the KIM API standard.

H																	He
Li	Be											B	C	N	O	F	Ne
Na	Mg											Al	Si	P	S	Cl	Ar
K	Ca	Sc	Ti	V	Cr	Mn	Fe	Co	Ni	Cu	Zn	Ga	Ge	As	Se	Br	Kr
Rb	Sr	Y	Zr	Nb	Mo	Tc	Ru	Rh	Pd	Ag	Cd	In	Sn	Sb	Te	I	Xe
Cs	Ba		Hf	Ta	W	Re	Os	Ir	Pt	Au	Hg	Tl	Pb	Bi	Po	At	Rn
Fr	Ra		Rf	Db	Sg	Bh	Hs	Mt	Ds	Rg	Cn	Uut	Fl	Uup	Lv	Uus	Uuo



# Explore KIM potentials & run MD

OpenKIM Explorer

Query

KIM object type: Models

Model

Elements: Enter element symbols here

Run LAMMPS with results of query:  no

Simulate new input parameters

OpenKIM Explorer

Explore the OpenKIM repository and use it to drive LAMMPS

Researcher	C11 (GPa)	C12 (GPa)	C44 (GPa)
Angelo Moody	240	160	150
Mishin Mehl	90	60	160
Mishin	320	220	170
Purja Pun Mishin	210	150	140
Schopf AlNiCo	340	170	140

Storage (manage) 68% of 20GB 780 x 600



Dan Karls



Ryan Elliott



Ellad Tadmor



Ben Haley



Steve Clark





# Thanks

