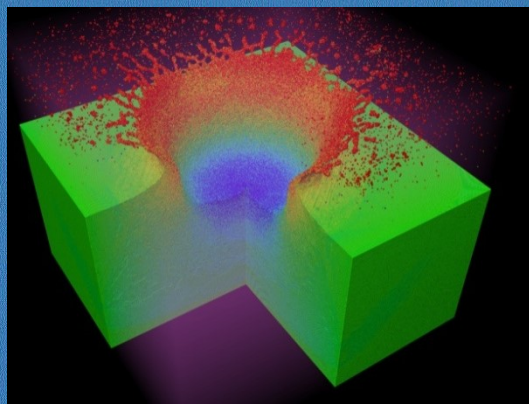


Introduction to Molecular Dynamics (MD) Simulations Part II: Advanced Applications



Eduardo M. Bringa
ebringa@yahoo.com

CONICET
FING, Universidad de
Mendoza, Argentina

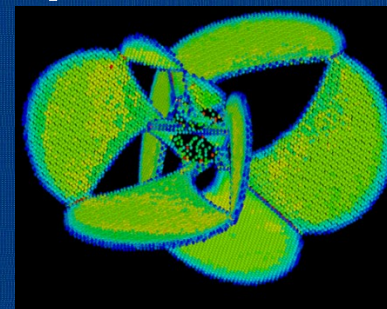
<https://sites.google.com/site/simafweb>

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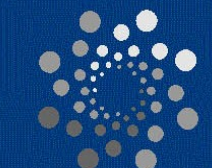
Aplicaciones de
simulaciones y
programación CUDA:
estudios a escala
atómica, fenómenos
climáticos y ópticos

Centro de Investigaciones
Hidráulicas e Hidrotécnicas
(CIHH)

UTP, Panamá
September 2019



COLABORATIONS: C. Ruestes, E. Millan (UN Cuyo), B. Planes, J. Grossi, A. Araguna, E. Aparicio, G. Mora, E. Miranda (U. Mendoza), N. Gunkelmann, C. Anders, H. Urbassek (TU Kaiserslautern), R. Gonzalez-Valdez (U. Mayor, Chile), F. Valencia, M. Kiwi, F. Munoz, E. Figueroa, S. Davis, G. Gutierrez (U. Chile), M.A. Meyers, Y. Tang, E. Hahn, S. Zhao, K. Olney, D. Benson (UCSD), B. Remington, J. H G. Moraawreliak, R. Rudd (LLNL), M. Ruda, G. Bertolino (Instituto Balseiro, Argentina), A. Stukowski (TU Darmstadt, Germany), P. Erhart (Chalmers U., Sweden), A. Higginbotham, J. Wark (University of Oxford, UK), R. Gonzales, A. Rivera, A. Prada (UP Madrid), S. Ramos, E. Crespo (U. Comahue), J. Kohanoff (QUB, N. Ireland).



SiMAF

Outline

- **Introduction**
- **Main caveats of MD simulations: potentials, time step, boundary conditions.**
- **Nano-thermodynamics and non-LTE conditions: temperature, pressure, melting, thermalization.**
- **Data analysis**
- **Simulation of “realistic” samples (not perfect crystals): dislocations, grains, impurities, porosity.**
- **Mechanical properties at high strain rate.**
- **Summary, conclusions and future perspective**

Two questions ...

Given all the approximations and limitations involved ...

➡ Can we hope for quantitative agreement between MD and experiments?

OR ...

➡ Is MD just pretty movies and pictures?

Atomistic simulations are extremely helpful but ... still have multiple limitations

With MD you can obtain....

“Real” time evolution of your system.

Thermodynamic properties, including $T(r,t)$ temperature profiles that can be used in rate equations.

Mechanical properties, including elastic and plastic behavior.

Surface/bulk/cluster growth and modification.

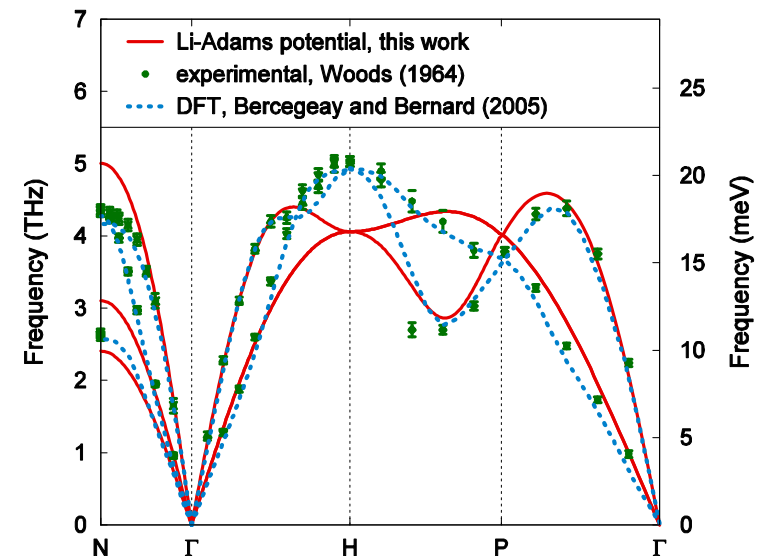
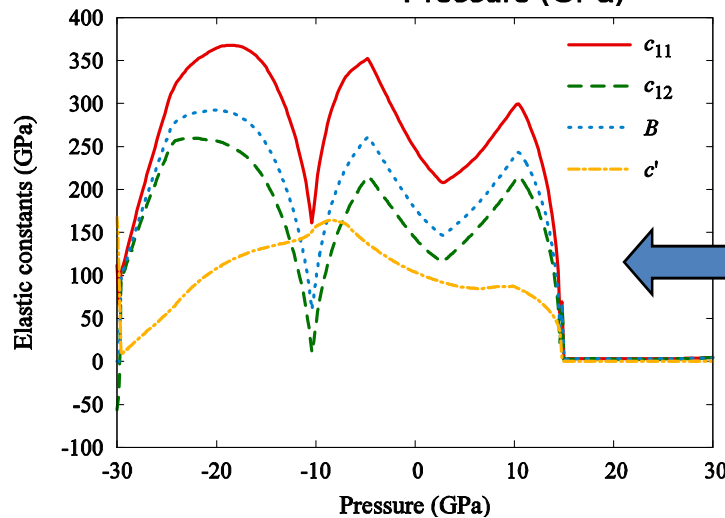
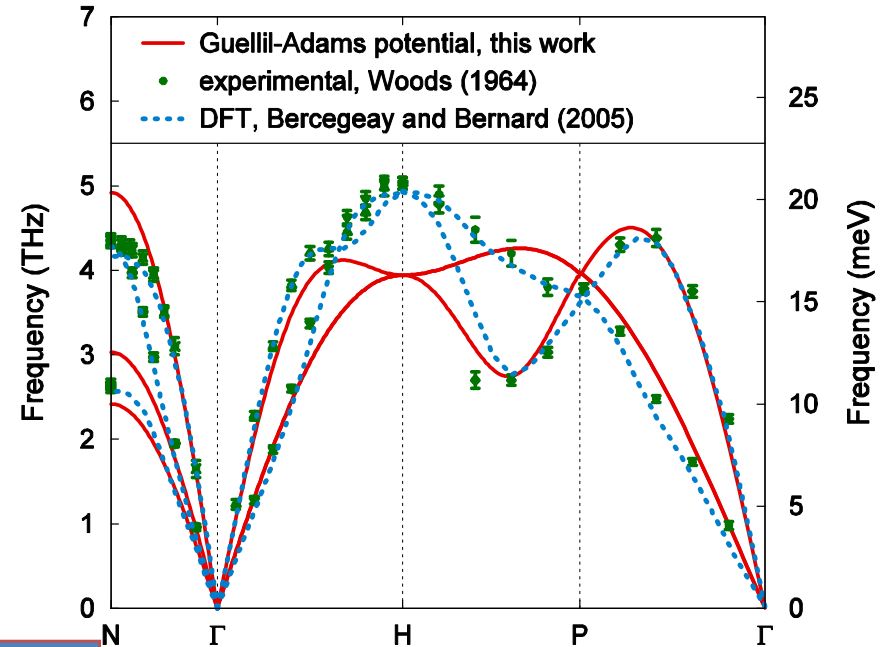
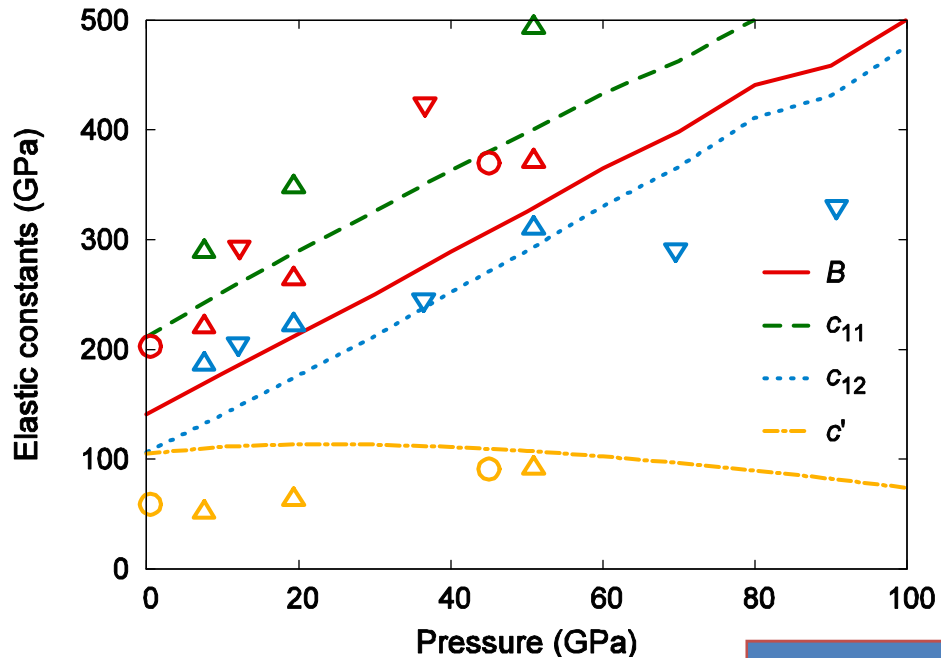
X-ray and “IR” spectra

Etcetera ...

Limitations of MD

- Can simulate only small samples ($L < 1 \mu\text{m}$, up to $\sim 10^9$ atoms).
- Can simulate only short times ($t < 1 \mu\text{s}$, because $\Delta t \sim 1 \text{ fs}$).
- Computationally expensive (weeks).
- **Potential’s golden rule: trash in \rightarrow trash out.**
- Interaction potentials for alloys, molecular solids, and excited species not well known.
- Despite its limitations **MD** is a very **powerful tool** to study nanosystems.

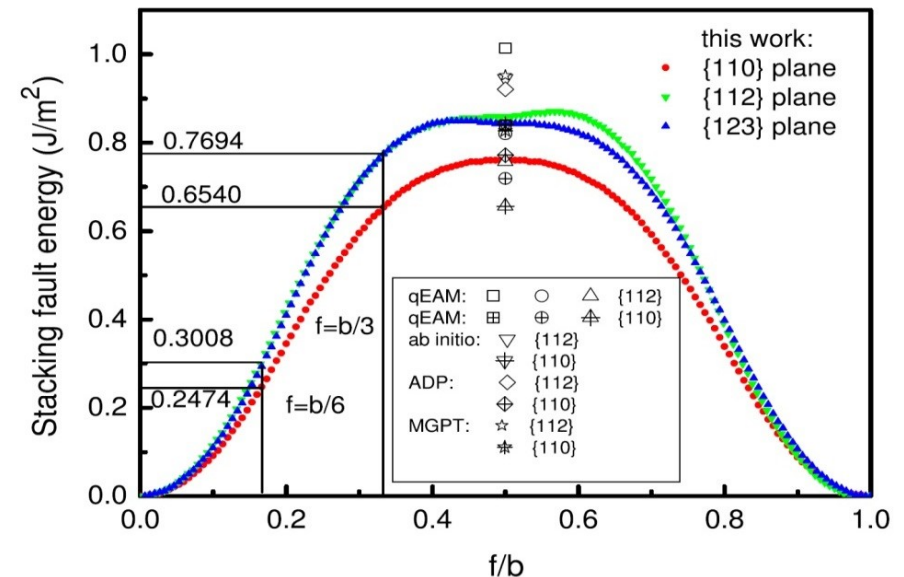
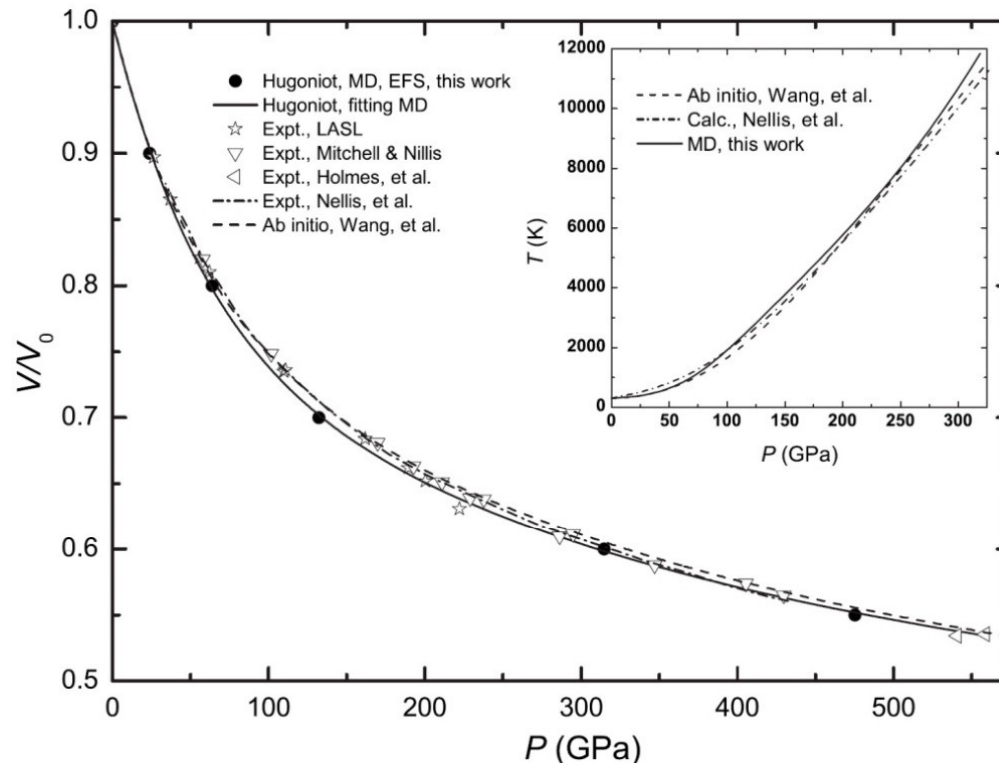
“Potential” problems: EAM potentials, phonons and elastic constants or when, even if the PV EOS is OK, other things can go wrong (Paul Erhart, LLNL)



Good agreement with phonons at $P=0$ GPa, but discontinuities in elastic constants, due to splines in the potential, lead to multiple elastic fronts

Another example: EFS Ta Potential

X.D. Dai, Y. Kong, J. Phys. Cond. Mat. **18** (2006) 4527



Tang, Bringa, Meyers, Acta Mat. **59** (2011) 1354

Z-L Liu, L-C Cai, Phys. Rev. B **77** (2008) 024103

- Excellent agreement with PV, equilibrium Hugoniot, **melt line**, etc.
- Elastic constants OK up to ~1 Mbar.
- **BUT...** BCC→HCP at ~65 GPa (Ravelo *et al.*, SCCM-2011).

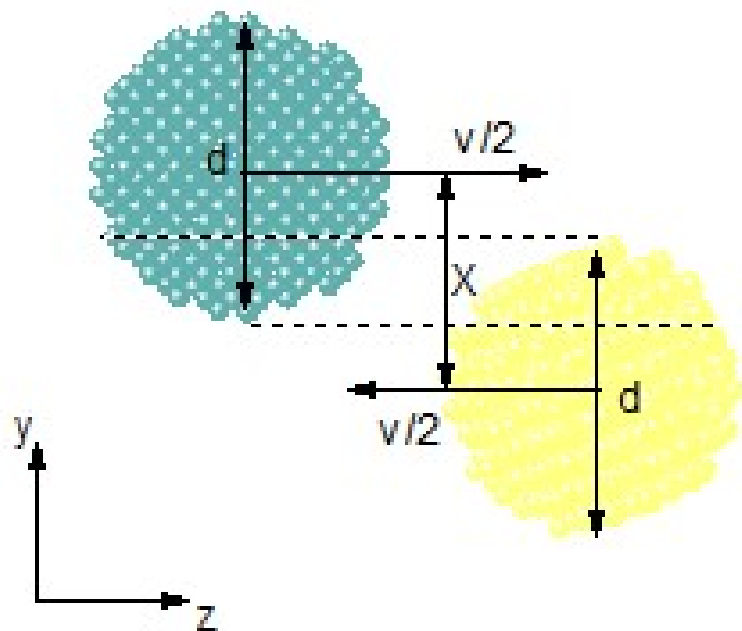
Potential validity depends strongly on type of fit, which can emphasize a certain property, temperature & pressure range, structure, etc.

Potentials are often non-transferable ☹

Time Evolution: be aware of possible energy drift

COLLISION DYNAMICS OF CARBON CLUSTERS, NVE (D. Bertoldi)

AIREBO potential (2011)



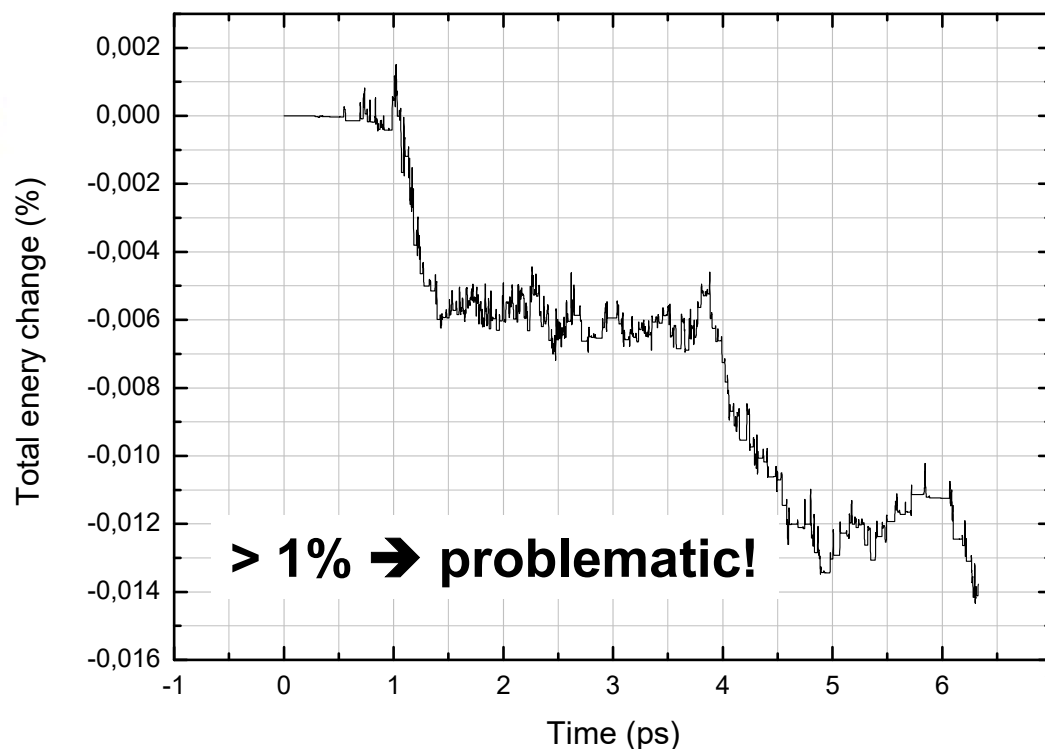
“dt reset”

$$t_{\min} = 1.E(-6) \text{ ps}$$

$$t_{\max} = 0,001 \text{ ps}$$

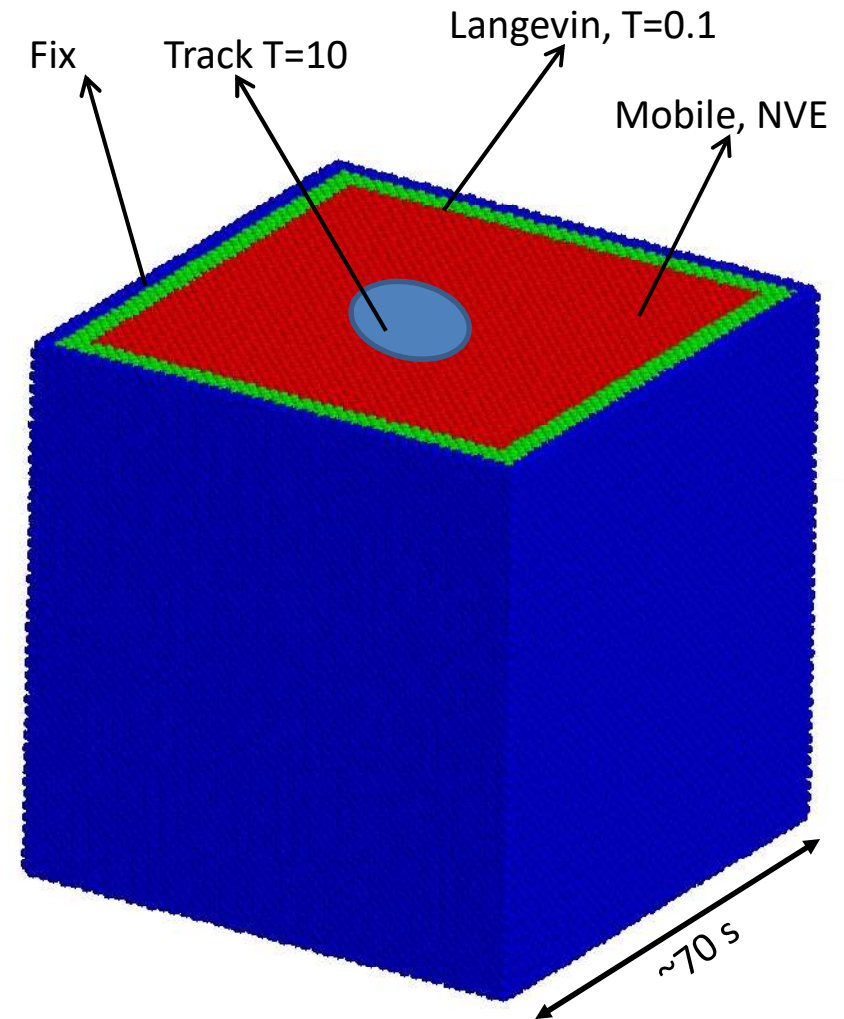
$$X_{\max} = 0,0001 \text{ \AA}$$

- Energy drift caused by integrator and computational errors.
- Simulations far from equilibrium have to use variable time step schemes,



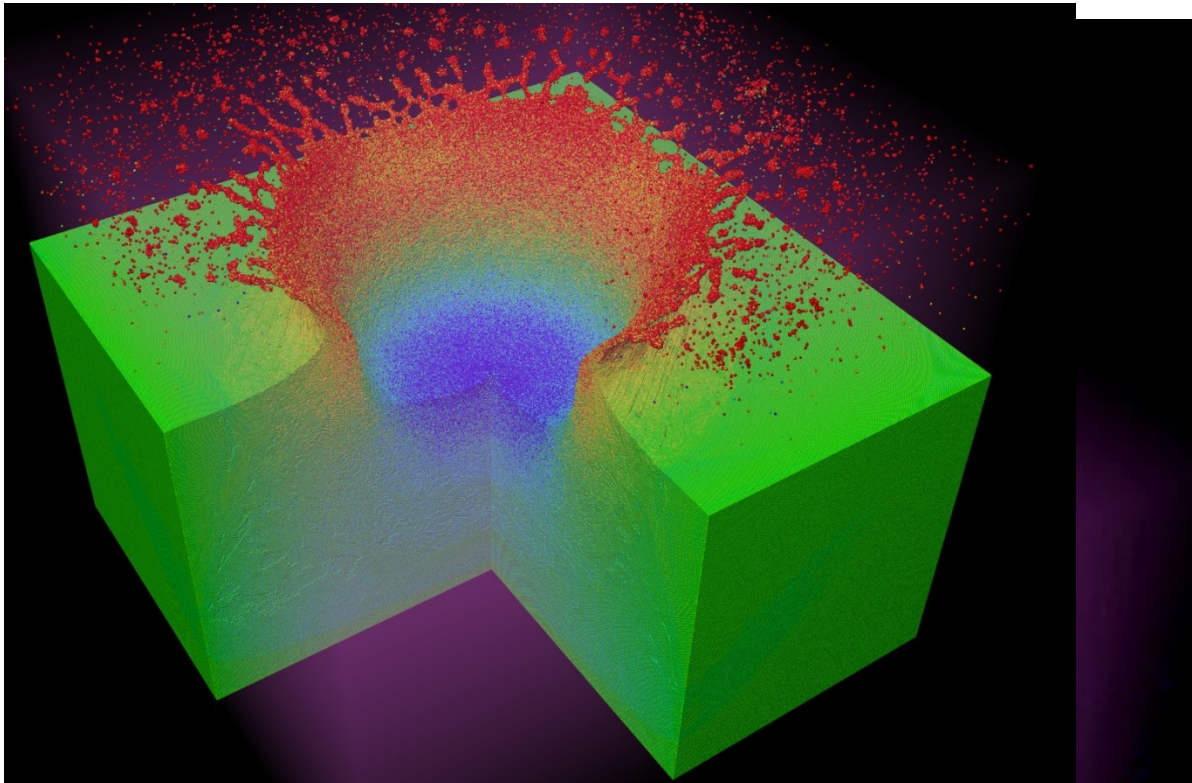
Simulation details need to include info on BC

- PBC in (x,y), free BC with expansion (z).
Langevin bath with critical damping at the sides.
- Need to re-calculate damping for each interatomic potential and bath condition.
- There are complex schemes to have impedance matching at boundaries, but none standard.
- Size has to be large enough to capture desired phenomena. Need to verify this by running simulations of different sizes: results should not change beyond certain size L , or they could be extrapolated versus $1/L$.



Simulation of hot spot

Large-scale MD links nano and microscales in damage induced by nanoprojectiles [C. Anders *et al.*, PRL 108, 027601 (2012)]

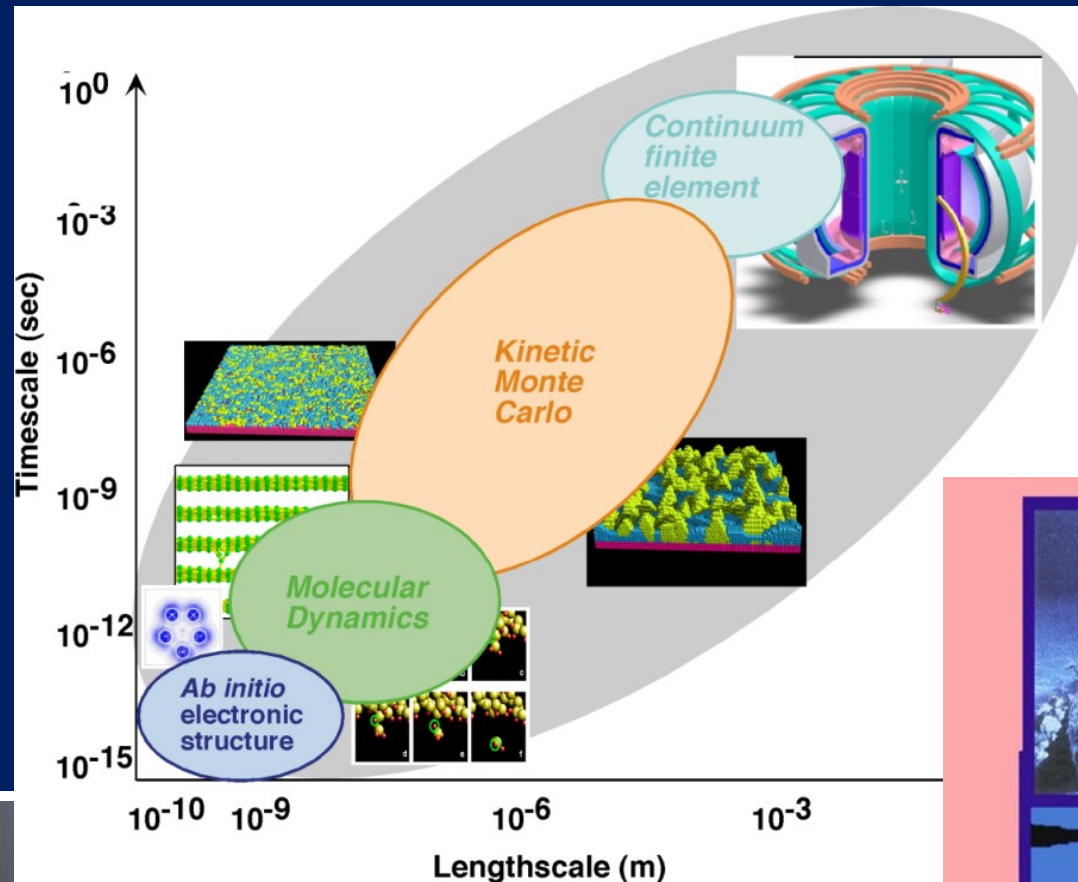


Only dislocations + liquid atoms are shown



$R_{\text{cluster}} = 20 \text{ nm}$, 20 ps after impact, $\sim 300 \times 10^6$ atoms,
15 hours using 3,840 CPU's in Thunder (LLNL)

¿Do we really need multiscale simulations?



1 meter = 1,000,000 microns

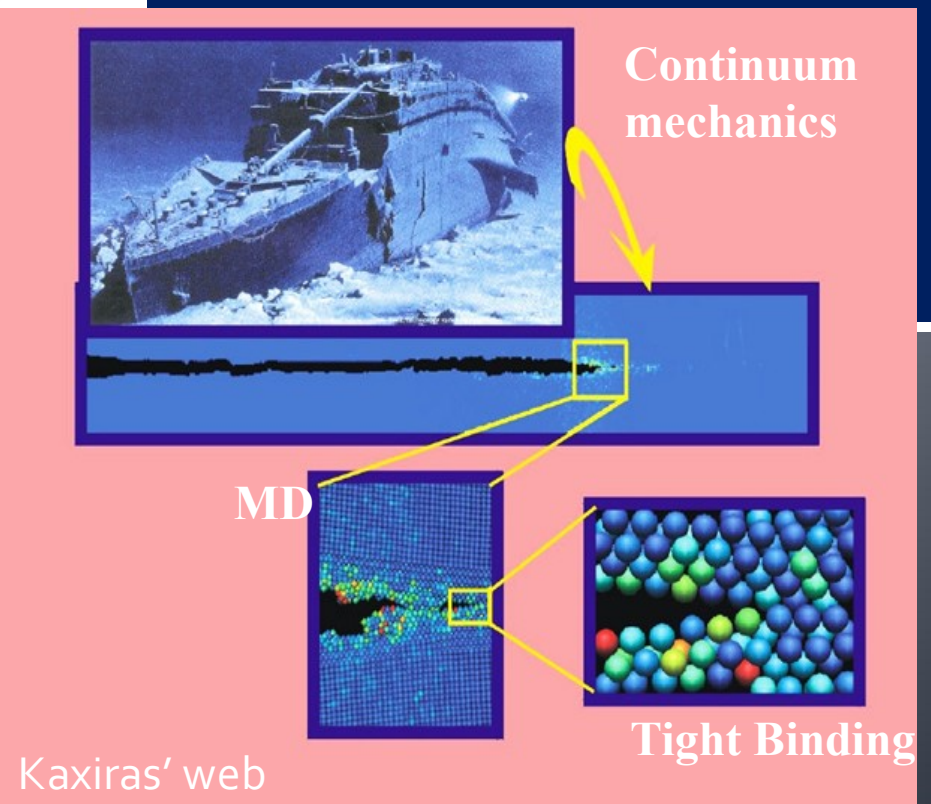
1 meter = 1,000,000,000 nanometers

Human hair's width ~ 200 μm

Staphylococcus ~ 1 μm

Rhinovirus ~ 200 nm

Nanoscale does affect macro scale and properties of materials.



Coupling TIME and length scales

- Concurrent coupling methods have many caveats
- Choose set of parameters from MD, save those parameters and “pass” them to a “higher” level code. Example: calculate defect concentrations as the initial configuration for a kinetic Monte Carlo code.
- Use some accelerated technique, which boost the time step, for instance “TAD” by A. Voter (LANL). Very expensive computationally, generally practical only for “2D” simulations or small 3D simulations.

**Have to be smart to avoid large/long simulations if possible.
Several people currently working on improved scale-coupling.
Keep tuned!**

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(a) Definition of temperature in nano systems

Usual: $(3/2) N k_B T = E_{\text{kin}}$

Nano Systems: $T_{\omega} = \frac{1}{k} \left[\left(\frac{3N}{2} - 1 \right) \langle E_{\text{kin}}^{-1} \rangle_{\mu} \right]^{-1}$

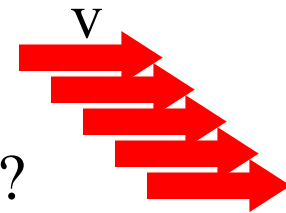
Jellinek & Goldberg, Chem Phys. (2000)

Pearson et al, PRB (1985)

Correction due to non-zero flow velocity $\langle v \rangle$:

$$E_{\text{kin}} \rightarrow (m/2) (v - \langle v \rangle)^2$$

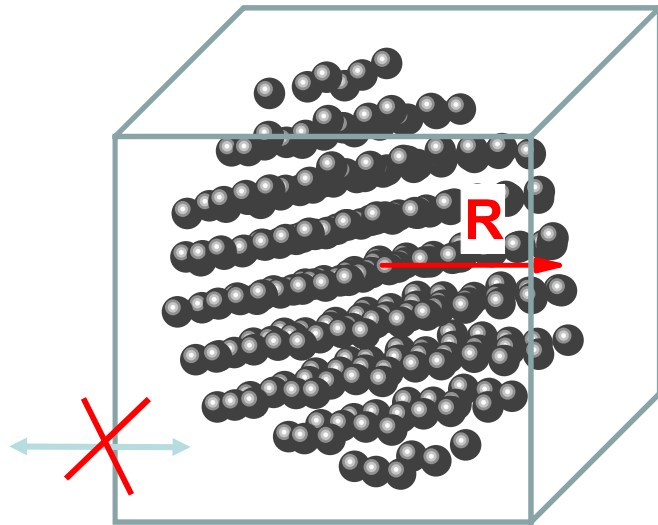
$E_{\text{kin}} > 0$, but $T = ??$



“Partial” T’s: T_{rot} , T_{vib} , T_{ij}

(b) Al Nanoclusters

D. Bertoldi (ICB)



MD using LAMMPS^[1] -

Microcanonical ensemble (N,V,E)
Temperature $\sim 300\text{K}$

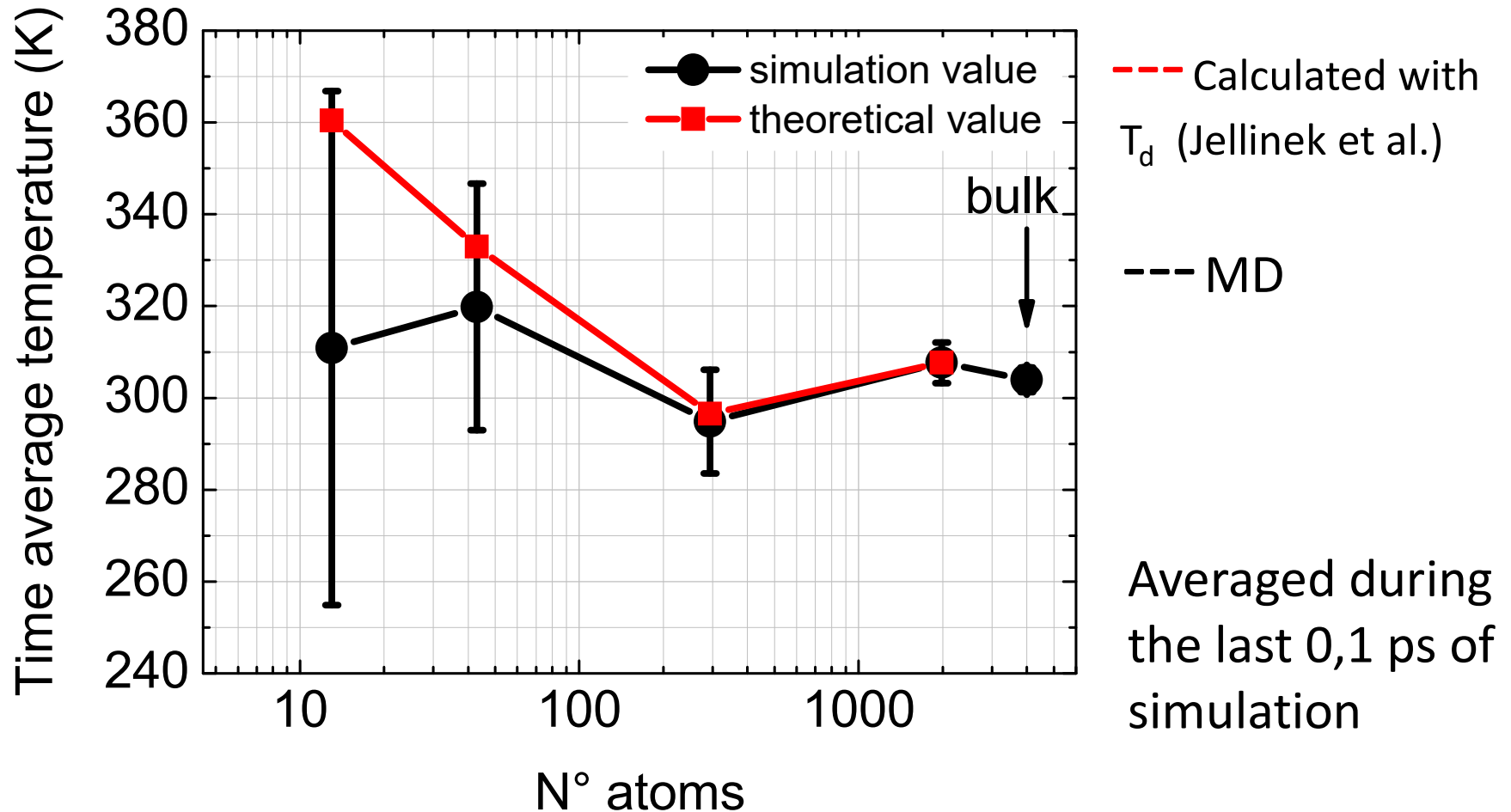
EAM potencial by **Mishin**^[2]

$$R = \begin{cases} 0,3\text{nm} \rightarrow 13 \text{ atoms} \\ 0,5\text{nm} \rightarrow 43 \text{ atoms} \\ 1\text{nm} \rightarrow 249 \text{ atoms} \\ 2\text{nm} \rightarrow 1985 \text{ atoms} \end{cases}$$

[1] www.lammps.sandia.gov

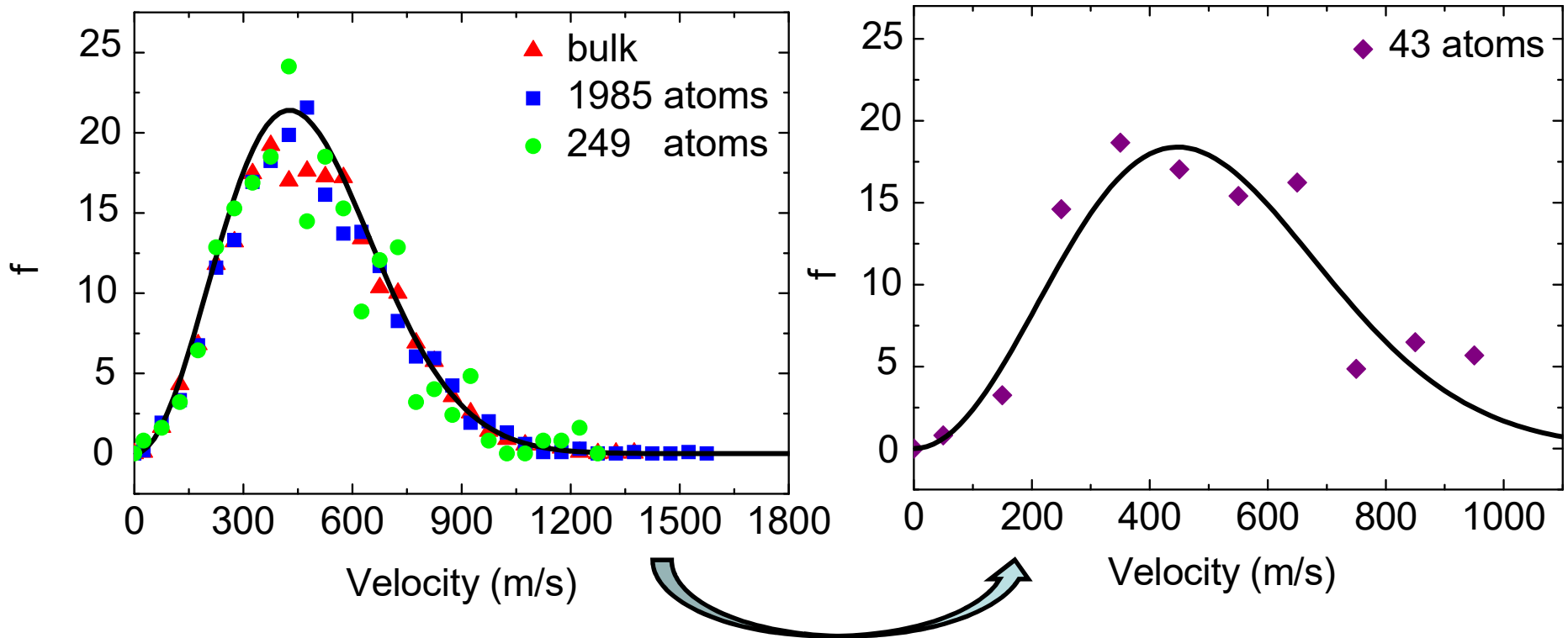
[2] Y. Mishin *et al.*, "Embedded-atom potential for B2-NiAl" PRB **65** (2002)

Cluster Temperature



Velocity Distribution in clusters

Aproximate with a Maxwell-Boltzmann distribution



When there are not enough atoms, distribution have to be averaged over time, but M-B still works reasonably well.

(c) Can we define an atomic stress tensor? Only with caveats

Virial stress
for atom I
(lammmps)

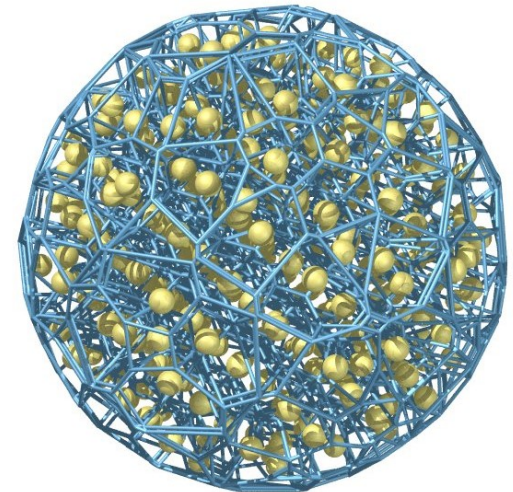
$$S_{ab} = - \left[mv_a v_b + \frac{1}{2} \sum_{n=1}^{N_p} (r_{1a} F_{1b} + r_{2a} F_{2b}) + \frac{1}{2} \sum_{n=1}^{N_b} (r_{1a} F_{1b} + r_{2a} F_{2b}) + \frac{1}{3} \sum_{n=1}^{N_a} (r_{1a} F_{1b} + r_{2a} F_{2b} + r_{3a} F_{3b}) + \frac{1}{4} \sum_{n=1}^{N_d} (r_{1a} F_{1b} + r_{2a} F_{2b} + r_{3a} F_{3b} + r_{4a} F_{4b}) + \frac{1}{4} \sum_{n=1}^{N_i} (r_{1a} F_{1b} + r_{2a} F_{2b} + r_{3a} F_{3b} + r_{4a} F_{4b}) + \sum_{n=1}^{N_f} r_{ia} F_{ib} \right]$$

a, b= x,y,z . Includes thermal, pair, bond, angle, dihedral, improper, and “fix”
Be careful with $Nk_B T$ term ...it should discount flow velocity in calculation of T

$\mathbf{S} = \sigma \mathbf{V} \rightarrow$ how do we define “atomic” volume to calculate momentum flux?

Possible solution: use Voronoi polyhedra

PdH nanoclusters. Using Voronoi or mean volume gives roughly the same results. Work with G. Bertolino, M. Ruda (Centro Atomico Bariloche), S. Ramos, E. Crespo (UN Comahue, Neuquen)
Int. J. Hydrogen Energy (2012)



(d) Phase Diagram for carbon clusters

Diagram for bulk sample

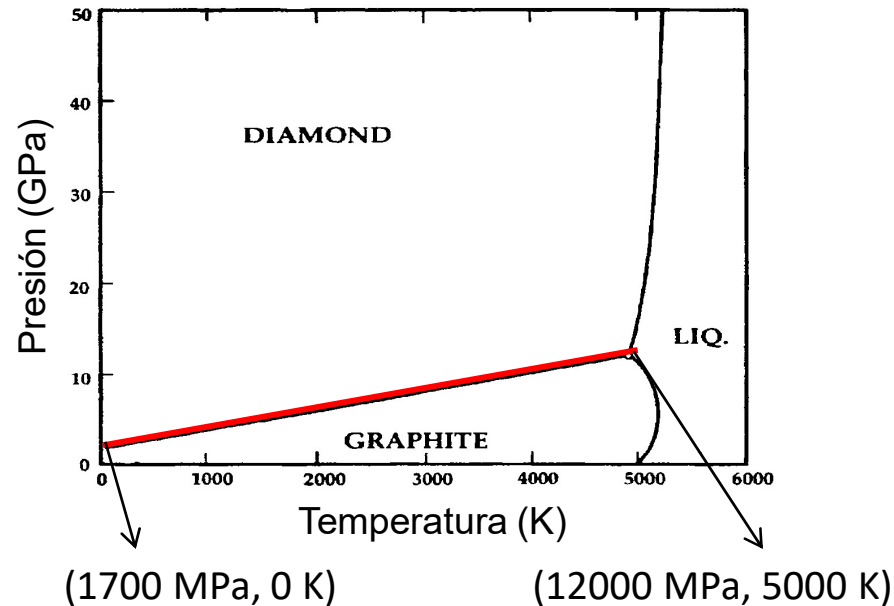
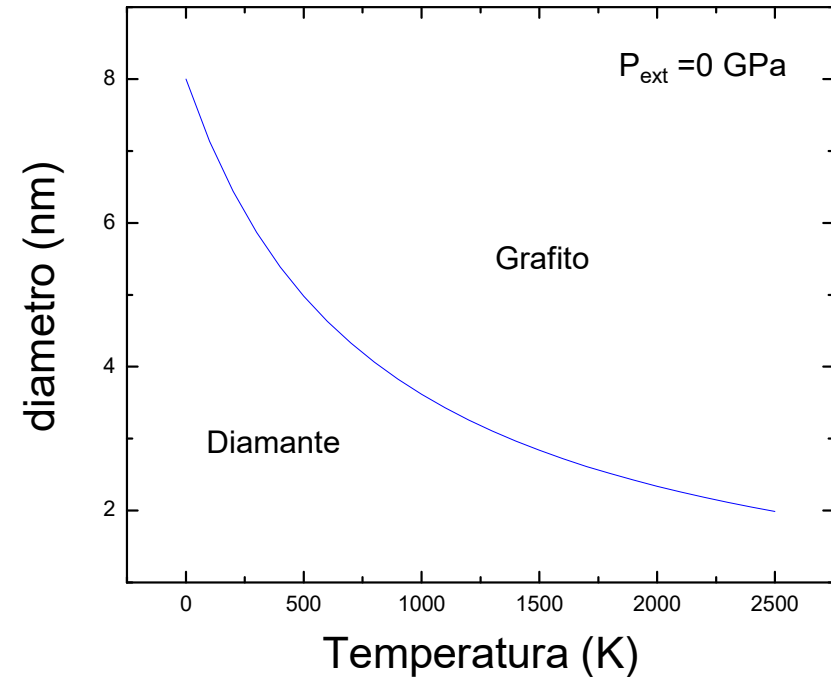


Diagram for a spherical cluster



Ec. Laplace-Young : $P = 4 \gamma / d$

$$P = 1700 + 2.06T$$

$$d = 4 \gamma / (1700 + 2.06T)$$

in equilibrium

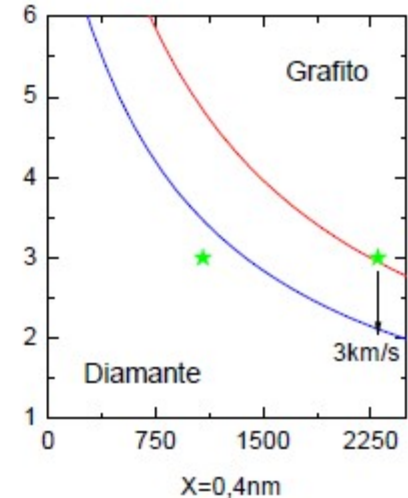
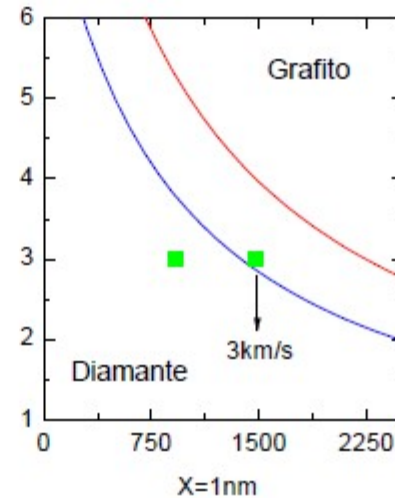
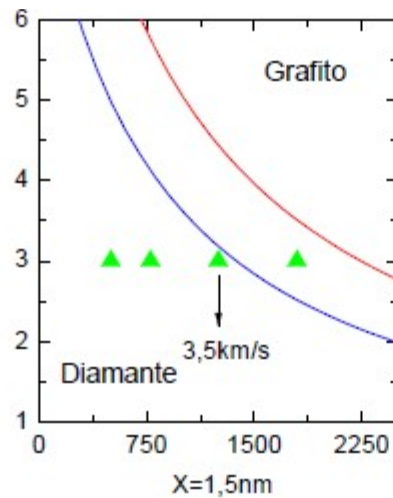
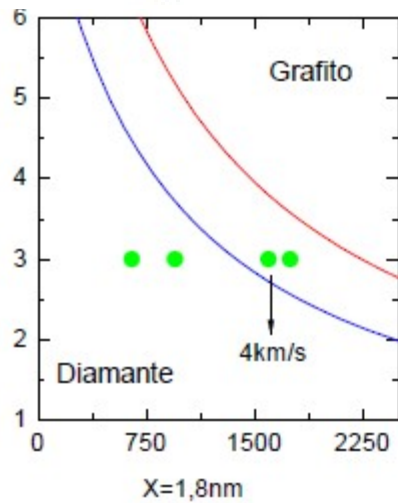
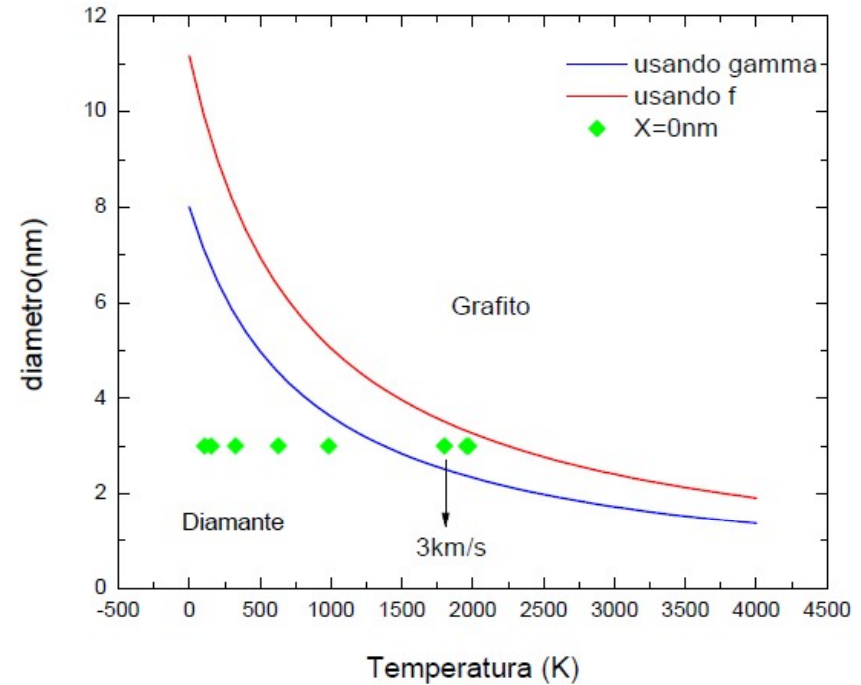
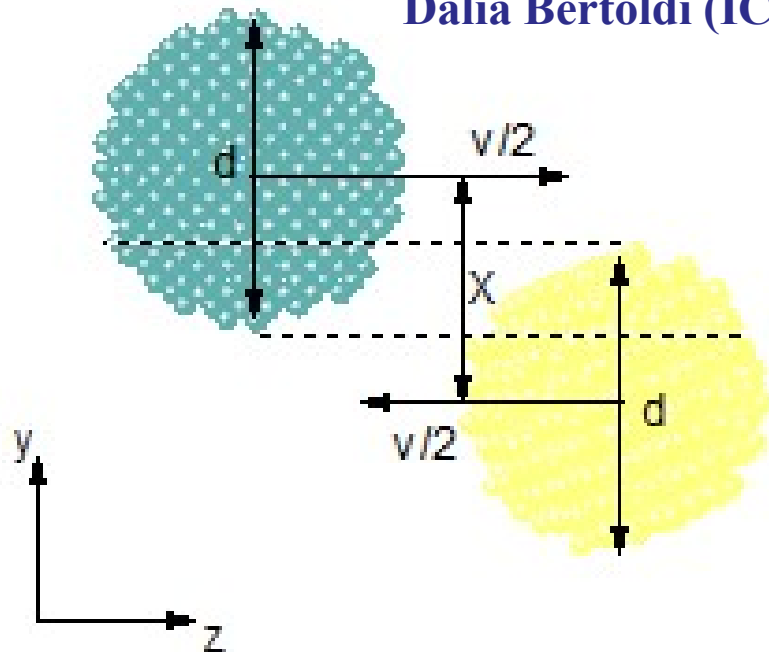
$$\gamma = (\gamma_D + \gamma_G) / 2$$

Transitions diamond \rightarrow graphite and graphite \rightarrow diamond , have different kinetics

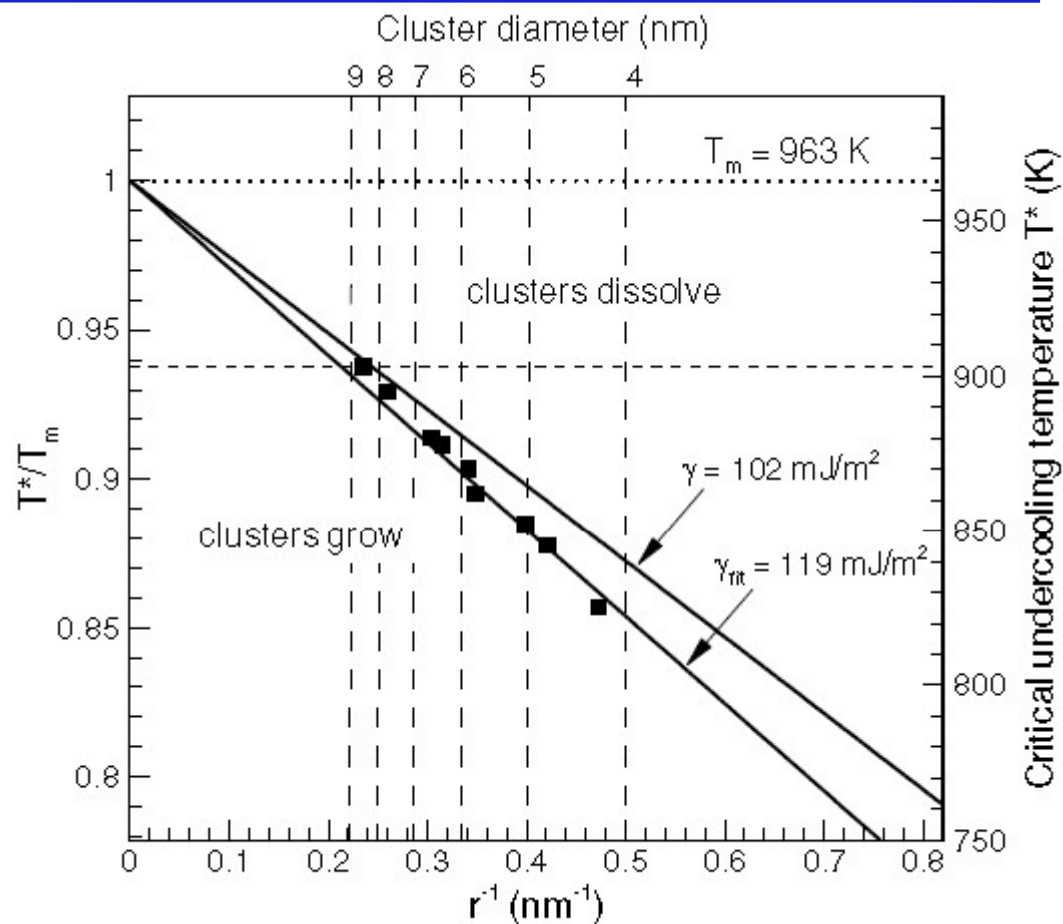
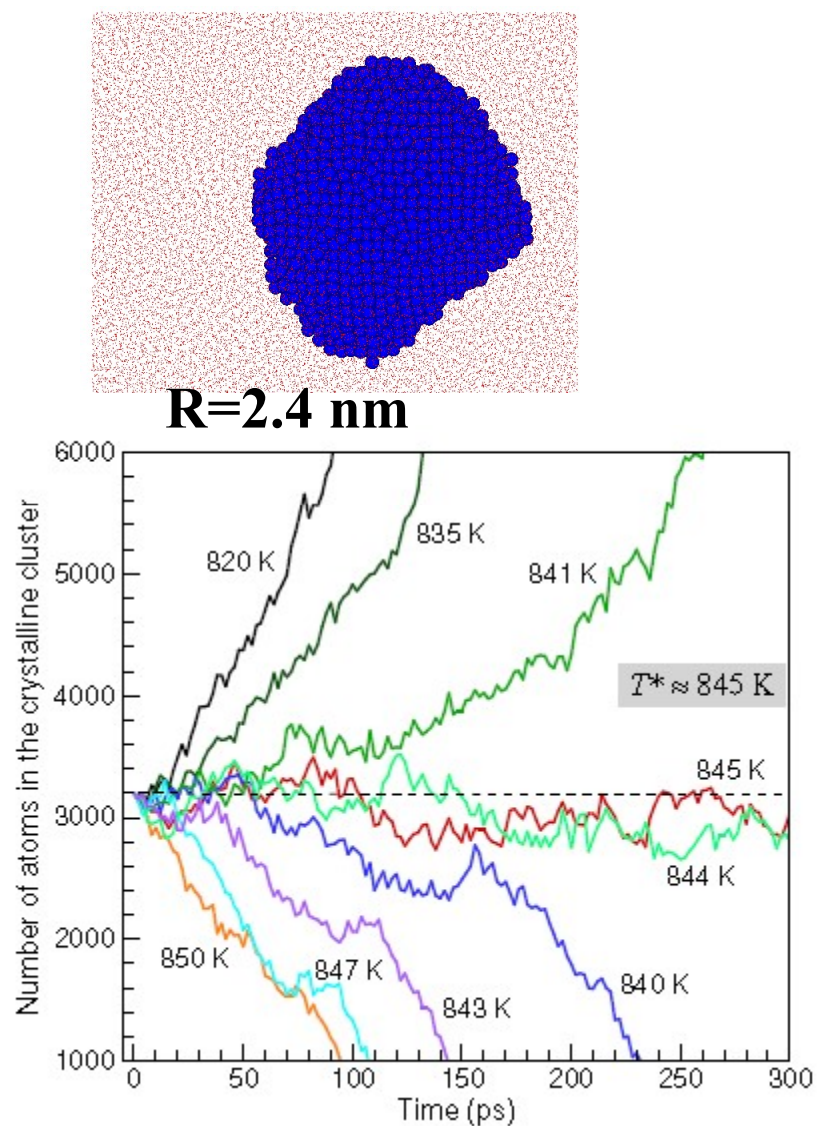
Zhao, D. et al, "Size and temperature dependence of nanodiamond-nanographite transition related with surface stress", Diamond and Related Materials **11** (2002) 234.

COLLISION OF CARBON NANOGRAINS

Dalia Bertoldi (ICB)



(f) Melting of Au nanoclusters



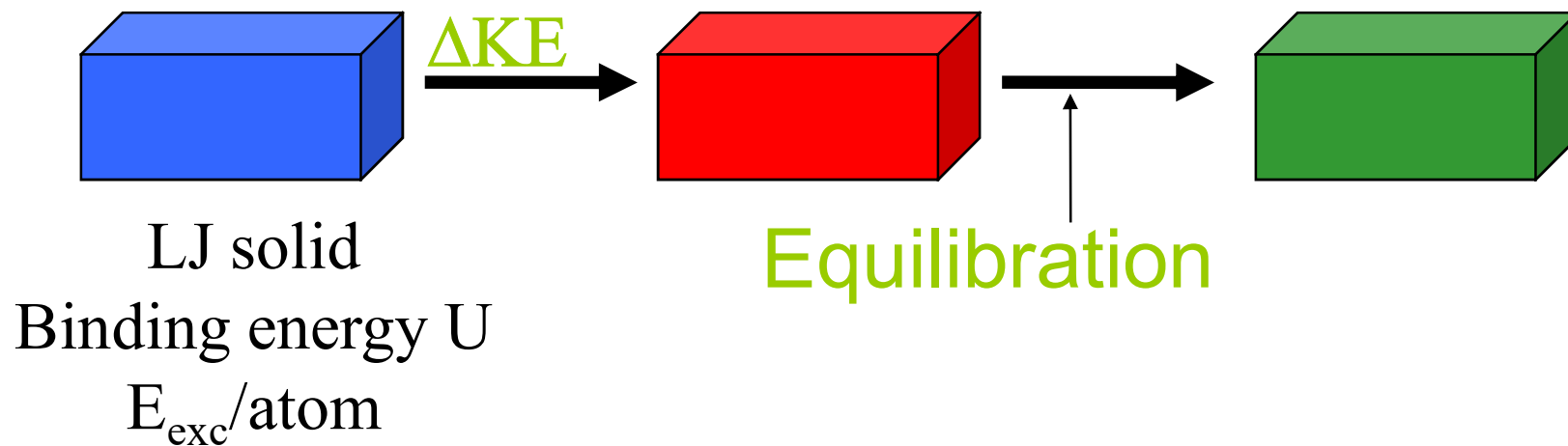
Lin, Leveugle, Bringa, Zhigilei, J. Phys. Chem. (2010)

Melting temperature changes only ~15%

→ difficult to detect experimentally

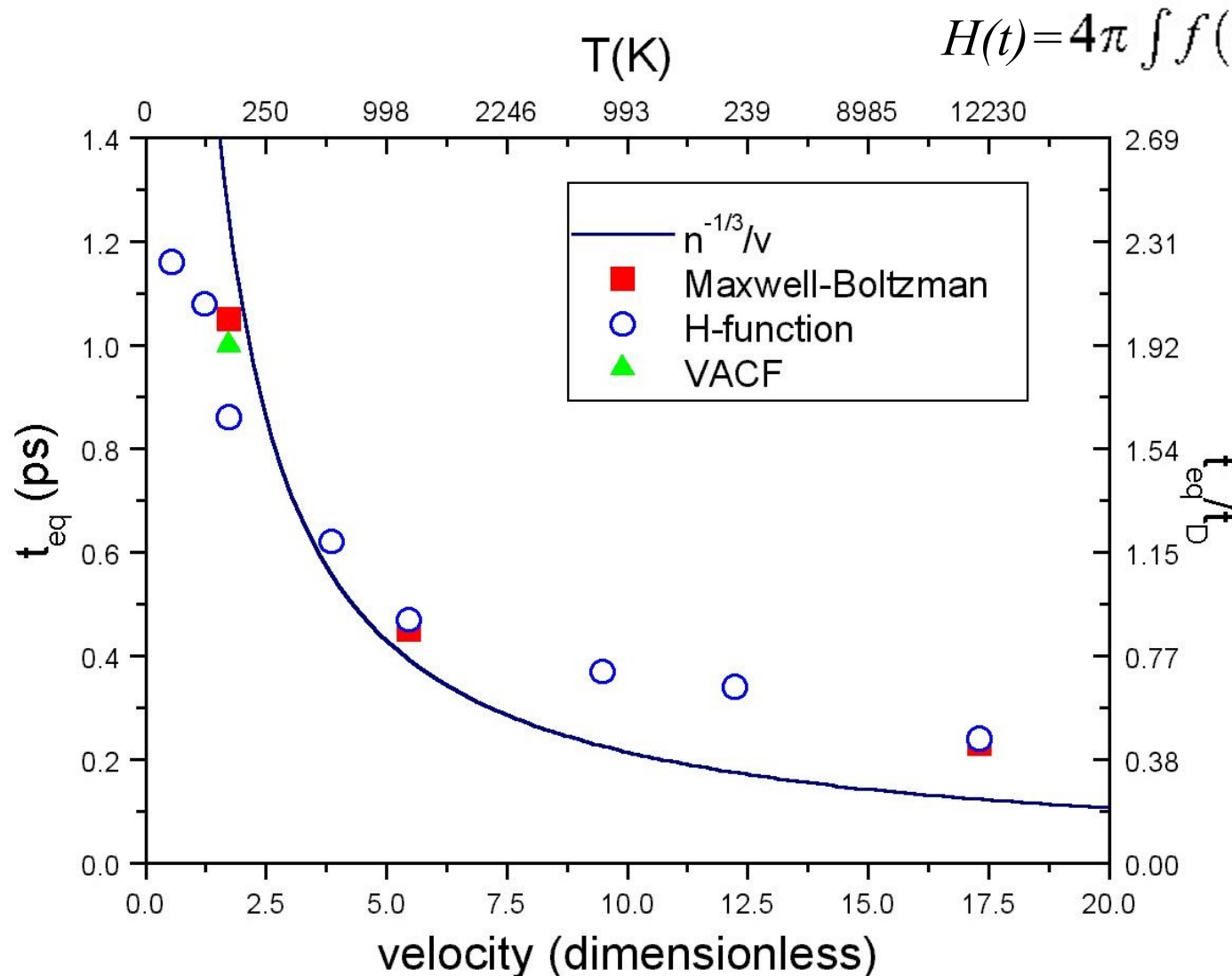
(g) Heating a solid without a surface (no transport)

- Is thermodynamics still valid at small times and length scales?
- How long does it take for a “perturbed” system to equilibrate?



Thermodynamic Equilibrium?

Equilibration time in homogeneous system



**EQUILIBRATION IS
FASTER THAN
EXPECTED
(compared with hard
spheres).**

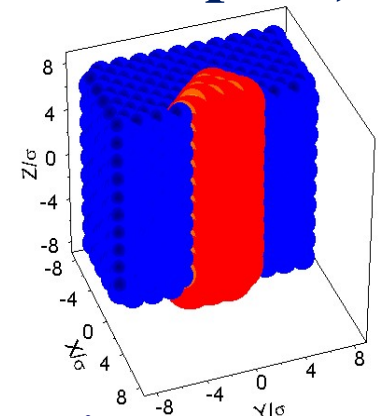
**Each atom interacts
with ~80 neighbors**

Bringa & Johnson,
Nuclear Instruments and
Methods in Physics
Research B **143** (1998)
513-535

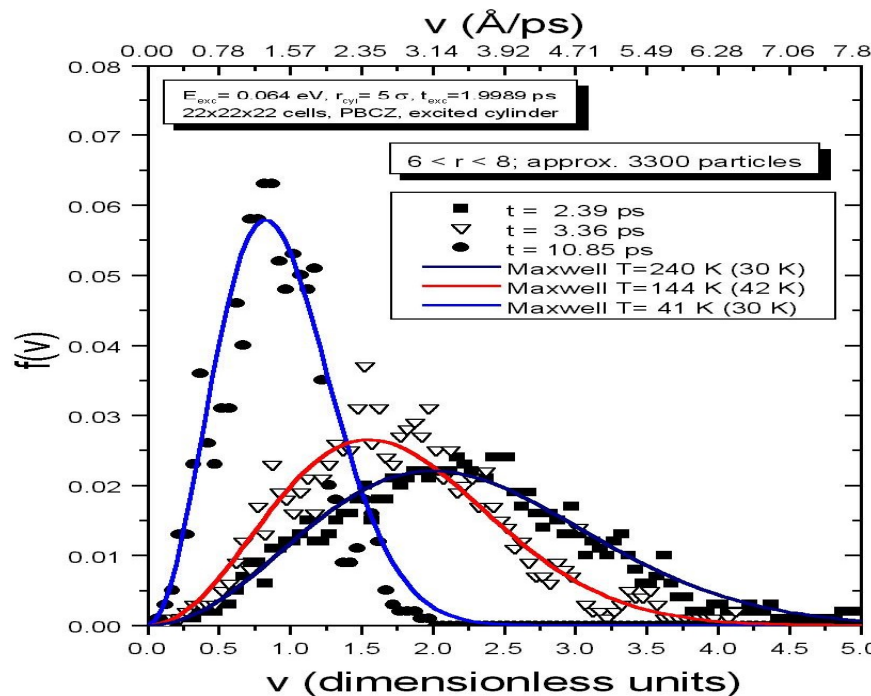
(h) Heating a solid without a surface (only radial transport)

heating of cylinder with radius r_{cyl}

- Large gradients (10^3 K/nm)
- How long does it take for LTE?

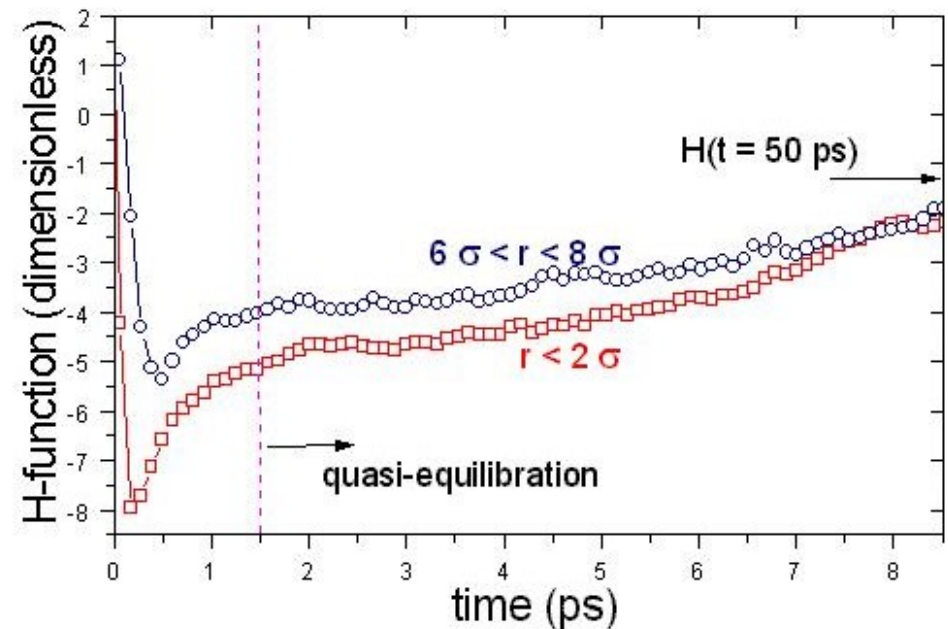


“Local” M-B distribution



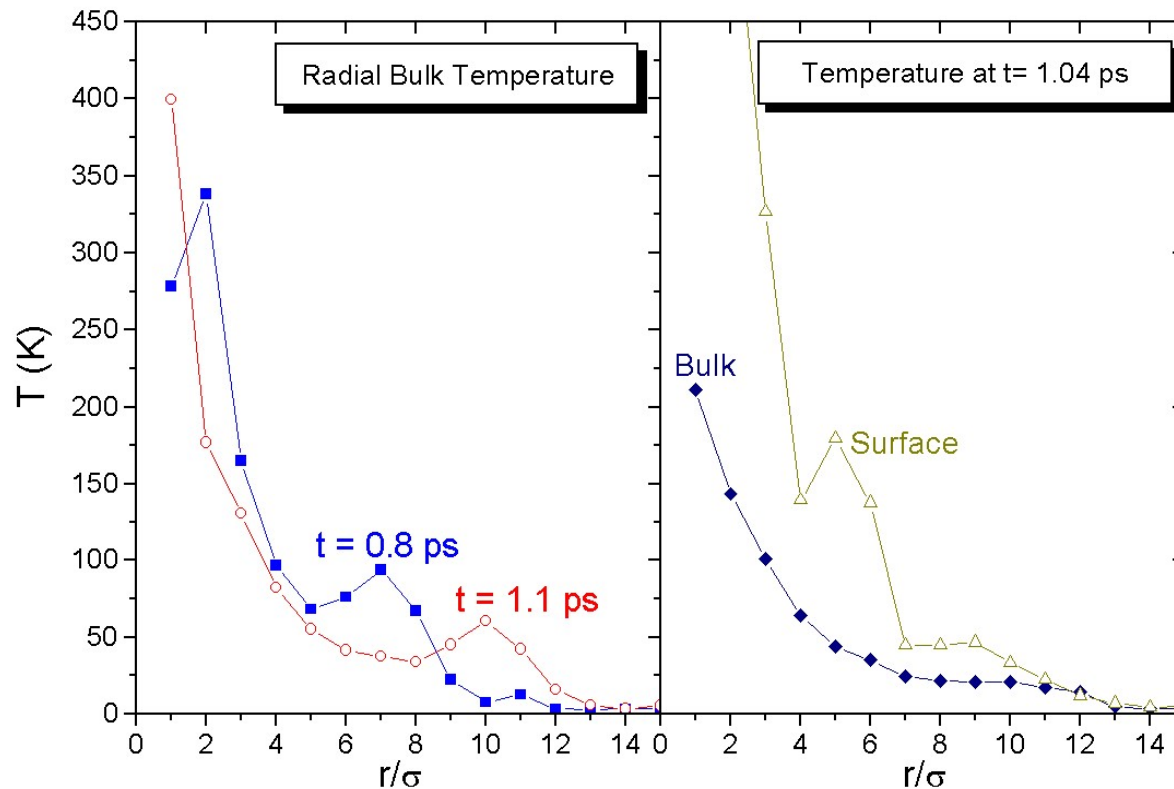
Rough way to obtain equilibration time

“Local” Boltzmann H-Function constant
→ thermal equilibrium



Local equilibration time is longer than
equilibration time for homogeneous heating

Temperature profiles (with a surface): lack of LTE and deviations from Fourier equation



T_{radial} for two different times. T_{radial} shows a 'bump' because of the outgoing 'shock'. Surface temperature is much higher than Bulk temperature due to energy transport towards the surface. $E_{\text{exc}} = 4 U$, $r_{\text{cyl}} = 2\sigma$.

Problems:

- **Lack of LTE more serious for molecular solids.** Bringa and Johnson, Surf. Sci. (1997)
- **Parabolic \rightarrow Hyperbolic**
 D.D. Joshep, L. Preziosi, Rev. Mod. Phys. 61 (1988) 41.
 S. Volz, J. Saulnier, M. Lallemand, B. Perrin, P. Depondt, M. Mareschal, Phys. Rev. B 54 (1996) 340.
- **Stefan problem (moving boundary).**
 Caro, Tarzia, etc.

Temperature profiles show axial energy transport
Large difference between radial and axial temperature

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• **Data analysis**

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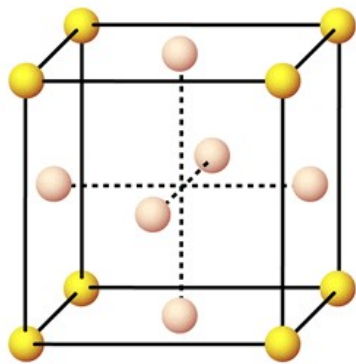
Data analysis



- On the fly and post-processing of data takes considerable time ...
- Need to choose appropriate analysis tools to avoid artificial results.
- Whenever possible, carry out the analysis in parallel with domain decomposition and neighbor lists.
- Care must be taken with time averaging.

Centro-Symmetry Parameter (CSP)*

- **Centro-symmetry parameter (CSP):** a parameter to measure the local disorder, particularly useful to study cubic structures.



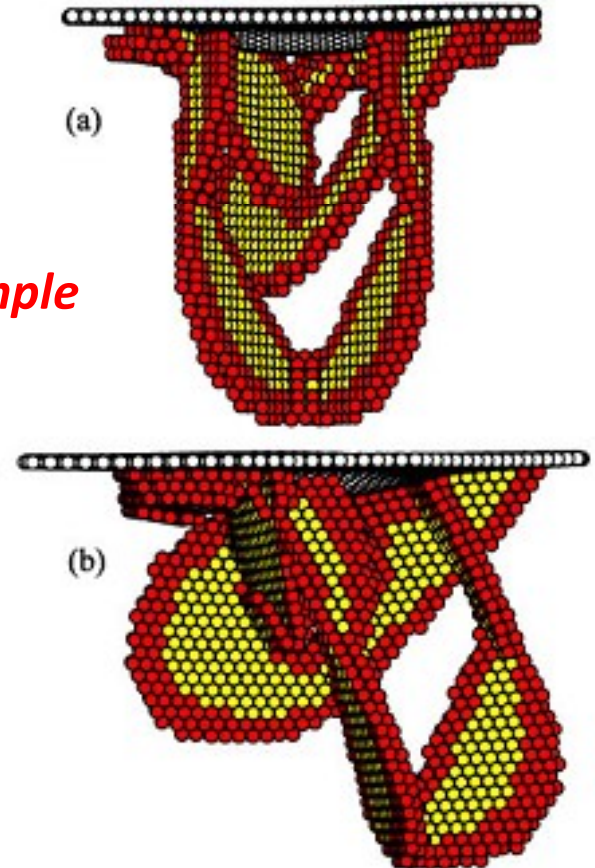
f.c.c structure

$$C = \sum_{i=1}^6 |\vec{R}_i + \vec{R}_{i+6}|^2$$

CSP expression for a f.c.c. unit cell

*This is done for every atom in the sample
→ high computational cost*

Kelchner et al, FIG. 2, partial view. Defect structure at the first plastic yield point during indentation on Au (111), (a) view along [112], (b) rotated 45° about [111]. The colors indicate defect types as determined by the centrosymmetry parameter: partial dislocation (red), stacking fault (yellow), and surface atoms (white). Only atoms with $P > 0.5$ are shown.



* Kelchner, Plimpton, Hamilton, Phys Rev B, 58, 11085 (1998)

Common Neighbor Analysis

- **CNA:** a parameter to measure the local disorder
- Sensitive to cutoff radius
- 12 nearest neighbor for perfect FCC and HCP crystals, 14 nearest neighbors for perfect BCC crystals

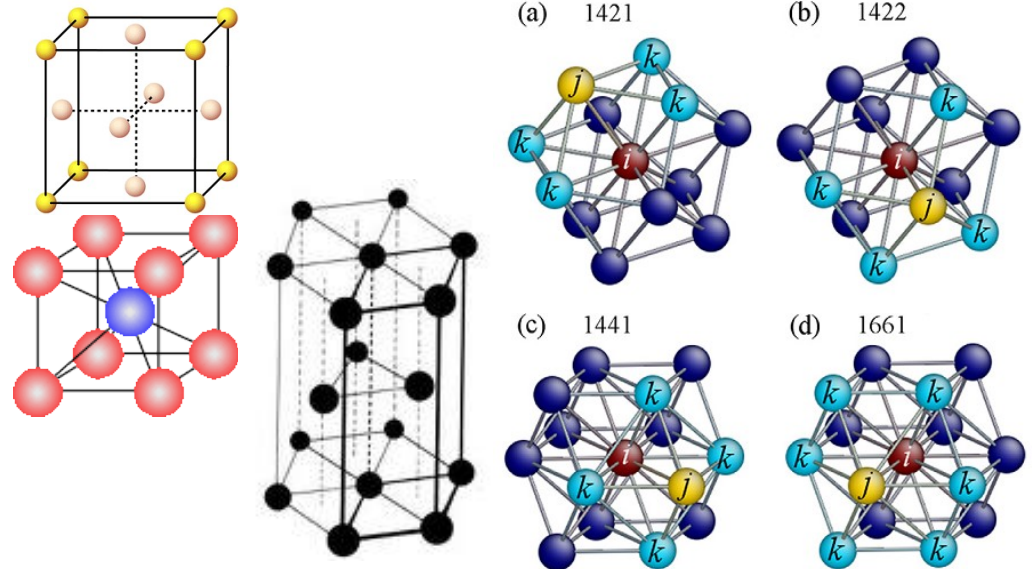
$$r_c^{fcc} = \frac{1}{2} \left(\frac{\sqrt{2}}{2} + 1 \right) a \simeq 0.8536 a$$

$$r_c^{bcc} = \frac{1}{2} (\sqrt{2} + 1) a \simeq 1.207 a$$

$$r_c^{hcp} = \frac{1}{2} \left(1 + \sqrt{\frac{4 + 2x^2}{3}} \right) a$$

*This is done for every atom in the sample
→ high computational cost*

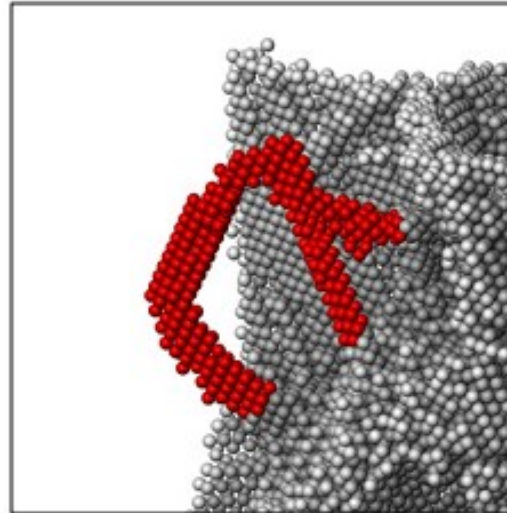
- Faken, Jonsson, Comput Mater Sci, 2, 279 (1994).
- Tsuzuki, Branicio, Rino, Comput Phys Comm, 177, 518 (2007).



DXA (Dislocation eXtraction Algorithm)

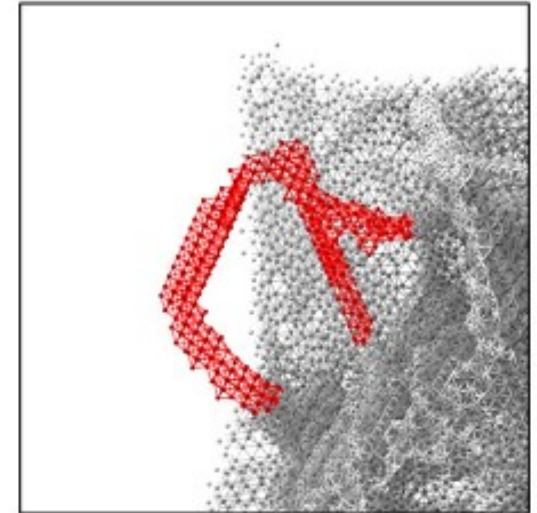
Stepwise conversion of atomistic dislocation cores into a geometric line representation.

(a) Atomistic input data.



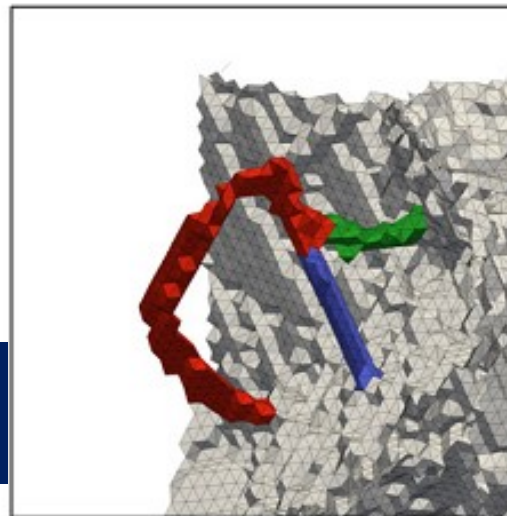
(a)

(b) Bonds between disordered atoms.



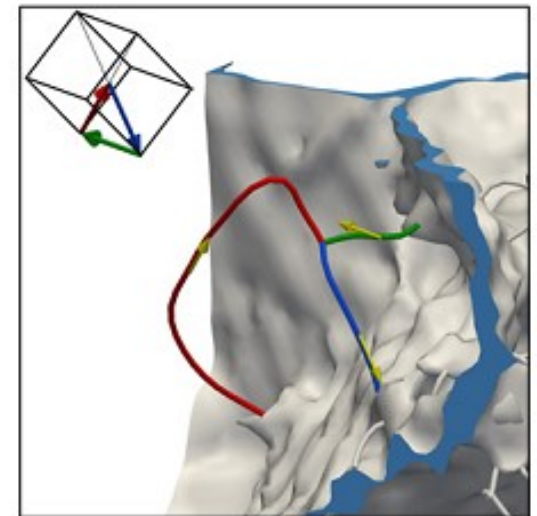
(b)

(c) Interface mesh.



(c)

(d) Smoothed output.



(d)

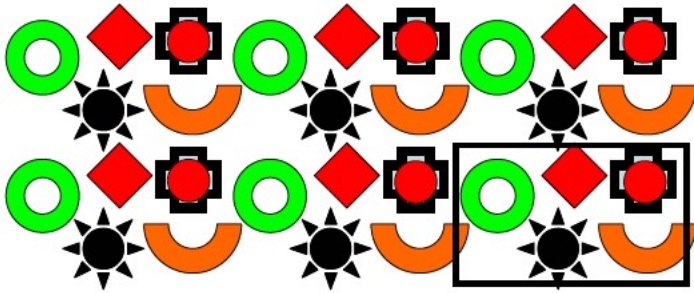
**Changes in DXA parameters
can have large effect on results**

A. Stukowski and K. Albe, Modelling Simul. Mater. Sci. Eng. 18 (2010) 085001.

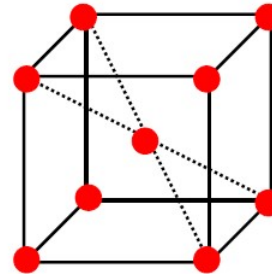
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Microstructure of crystalline materials

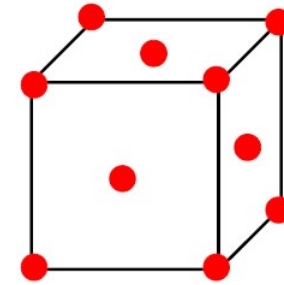


Unit Cell



Body-centred cubic (bcc)

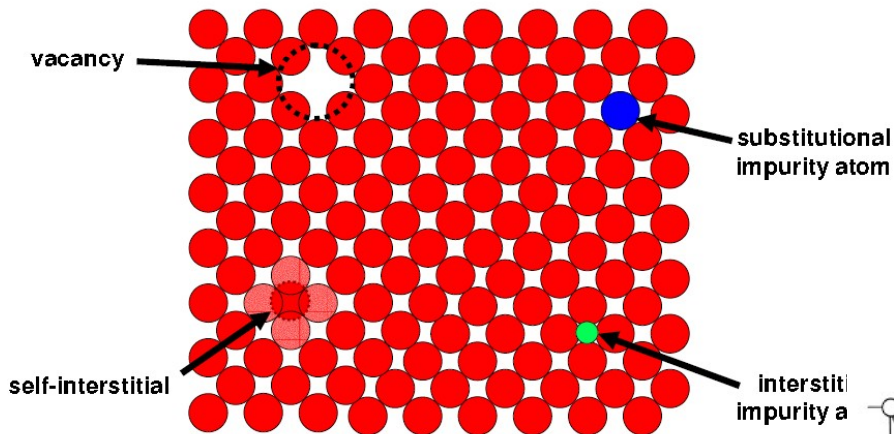
Fe, W, V, Ta, ...



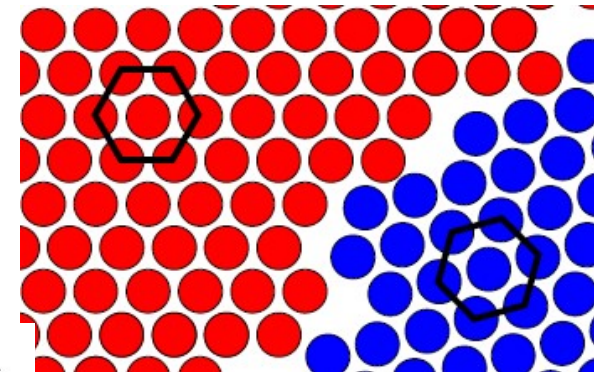
Face-centred cubic (fcc)

Cu, Al, Ni, Au,

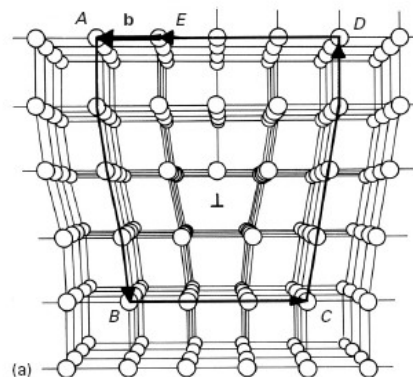
Point defects



Grain boundaries



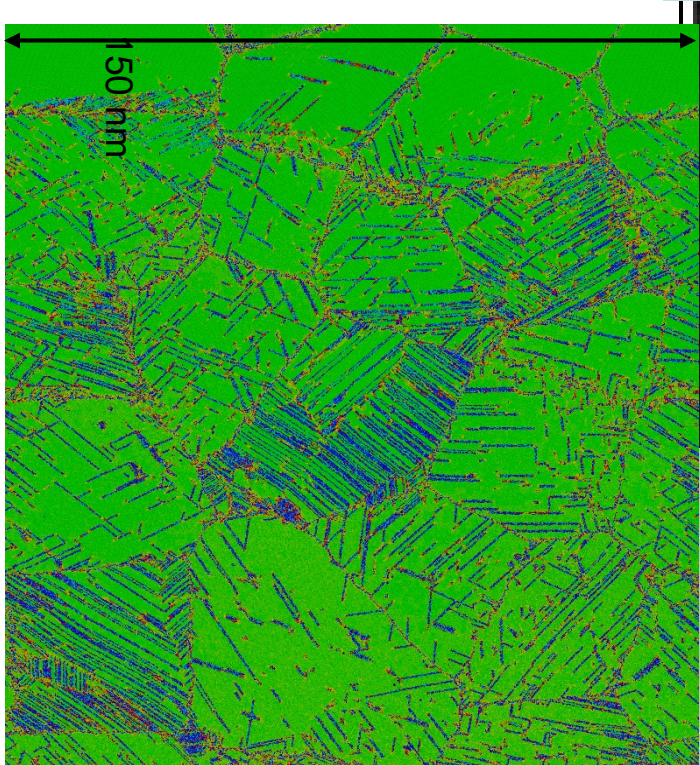
DISLOCATIONS



Perfect crystals are the 'spherical horse' of atomistic simulations (also for many model Hamiltonians)

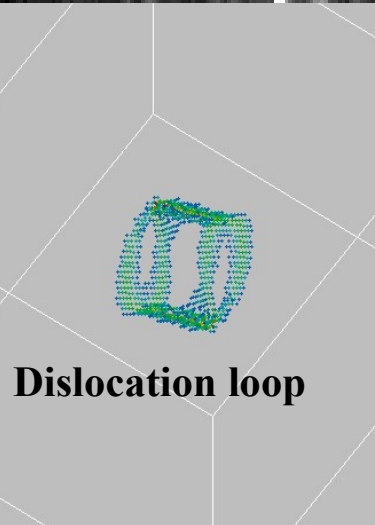
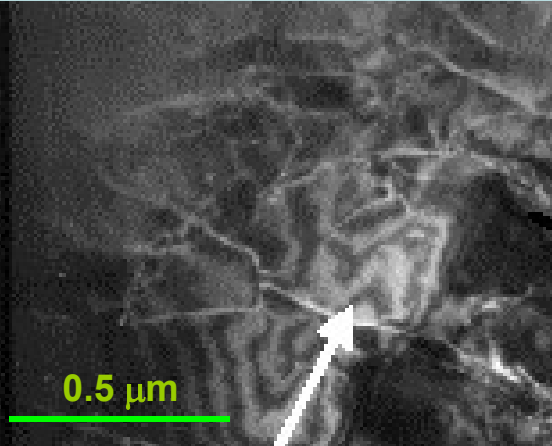
How to make more realistic simulations? Add defects:
vacancies \rightarrow voids \rightarrow bubbles, interstitials, dislocation loops/lines,
grain boundaries (bi-crystals \rightarrow polycrystals), impurities, etc.

Cu single crystal, M. Meyers *et al*, TEM

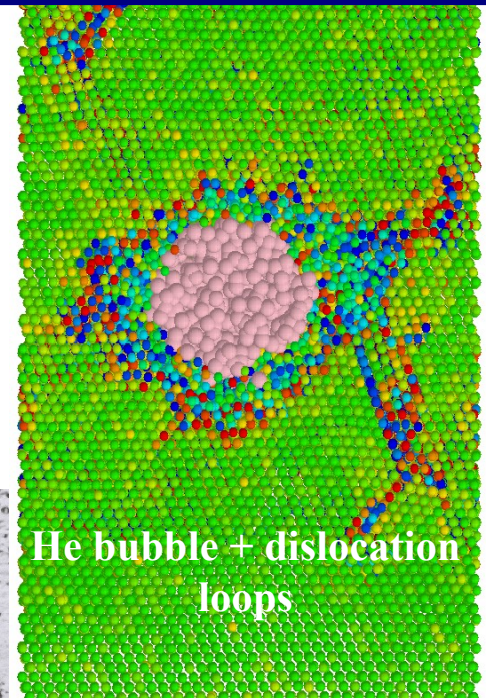
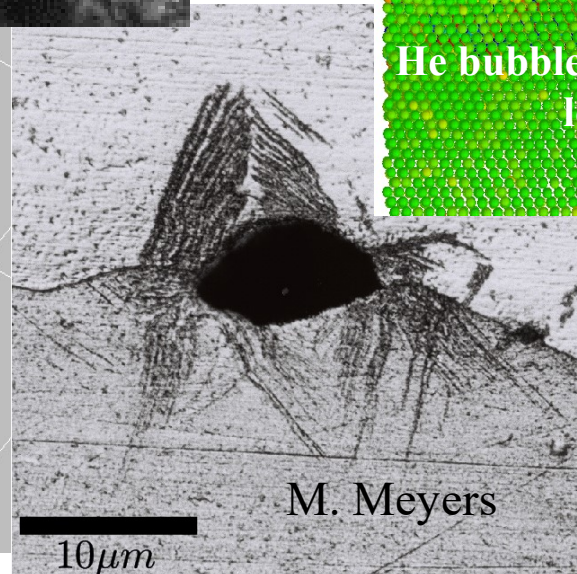


Polycrystal (50 nm grain size)
(400 million atoms)

Few GB are Σ boundaries ...
Not 1 dislocation but many ...

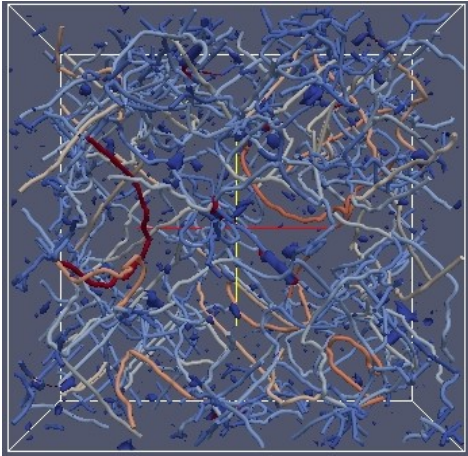


Dislocation loop

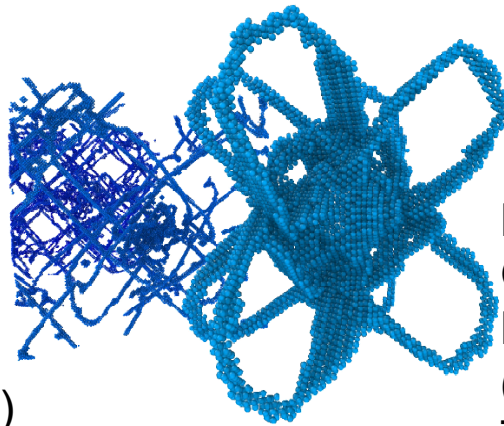


Example: New materials thanks to defective structures

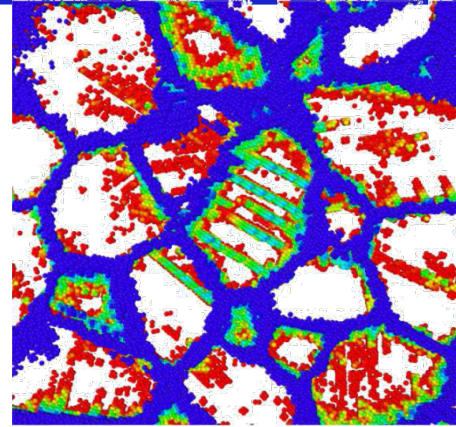
Use dislocations, grain boundaries, porosity, twins, etc.



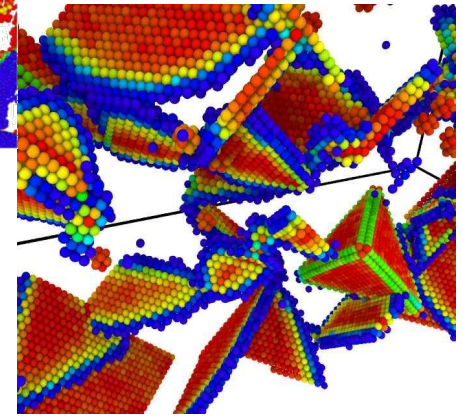
Dislocations in Ta,
Ruestes *et al.*,
Comp. Mat. Sci. (2014)
FCEN/UCSD



Plasticity in Ta,
Tramontina *et al.*,
HEDP (2013)
FCEN/Oxford/LLNL/LA
NL



Dislocations in Fe
Gunkelmann *et al.*,
Phys. Rev. B. Rapid
(2014)
TUK/FCEN/Oxford



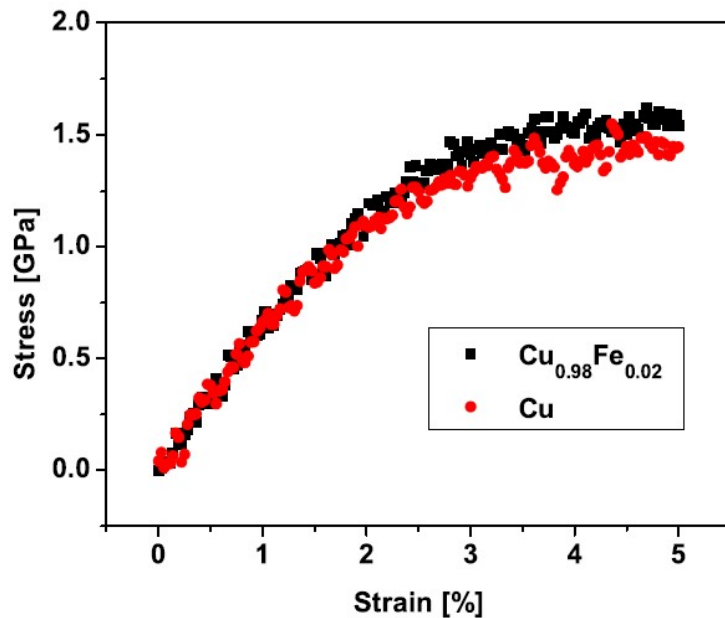
SFT in Au Rodriguez-
Nieva *et al.*, Acta Mater.
(2014)
FCEN/MIT/JHU

Could control nano-structure based on strain rate and pre-existing defects → improved properties (hardness, corrosion resistance, etc.)

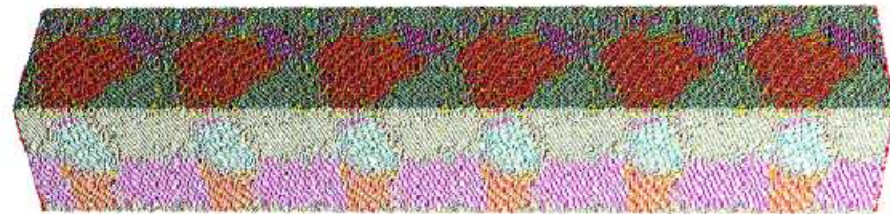
Role of impurities in void nucleation

Combine MD with “parallel grand-canonical Monte Carlo”
to place impurities in nano crystalline sample

“Effects of Microalloying on the Mobility and Mechanical Response of Interfaces in Nanocrystalline Cu”, Caro et al. , *Materials Science Forum Vols. 633-634 (2010) 21*.



This might lead to suppression of GB sliding → stronger materials



(a)



(b)



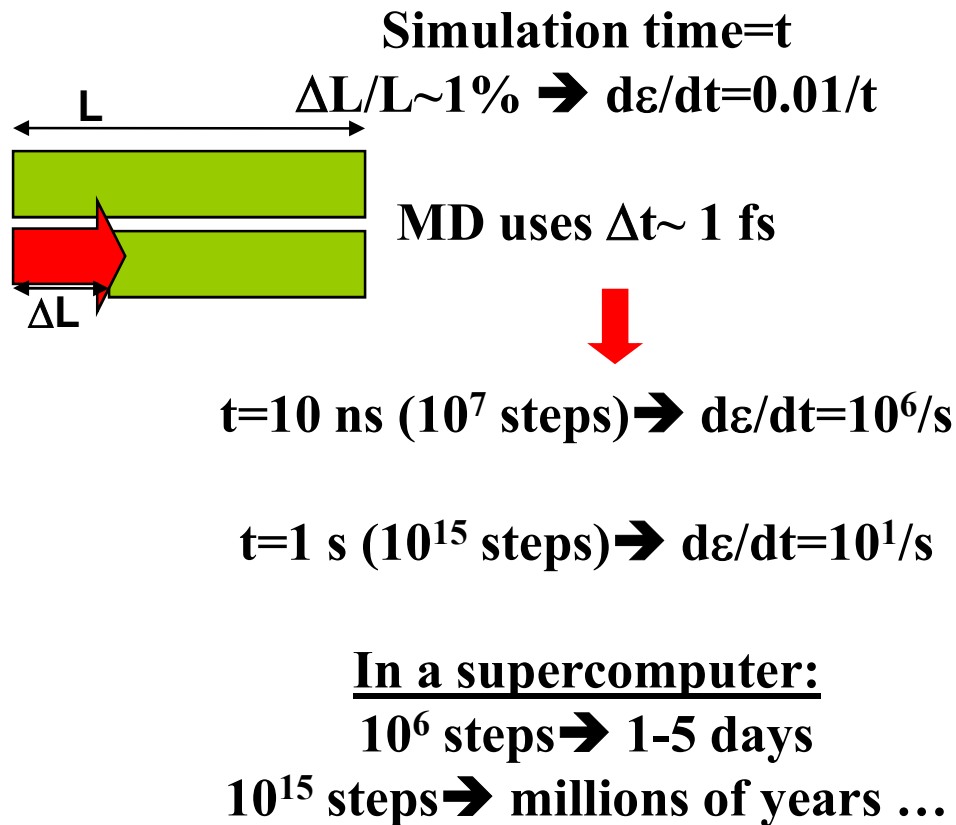
3% Fe

(c)

G. Gilmer

Mechanical deformation: can we compare MD with experiments?

Problem: strain rates, $d\epsilon/dt$, are huge!



“Today” MD can do strain rates
 $\sim 10^6/s$ only at a supercomputer

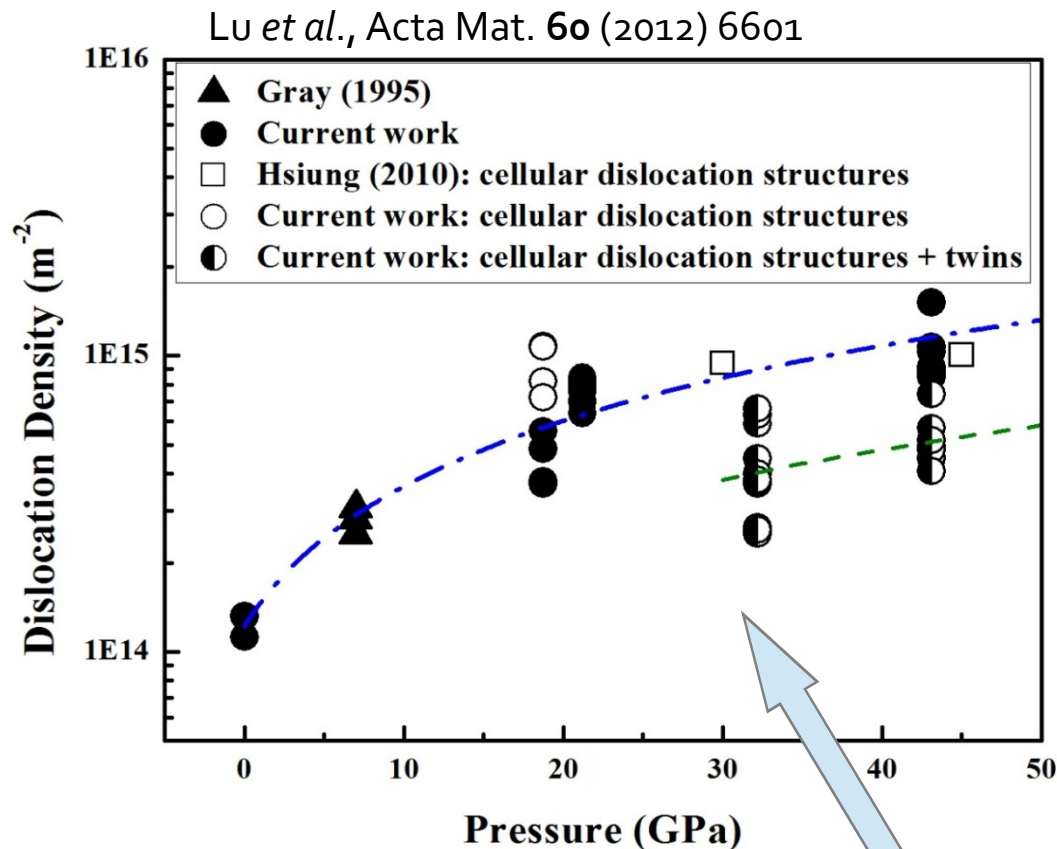
Solutions:

- a) Supplement MD with models to compare to experiments at low strain rates.
- a) Compare with experiments at high strain rates (lasers, shocks, impacts, etc.).

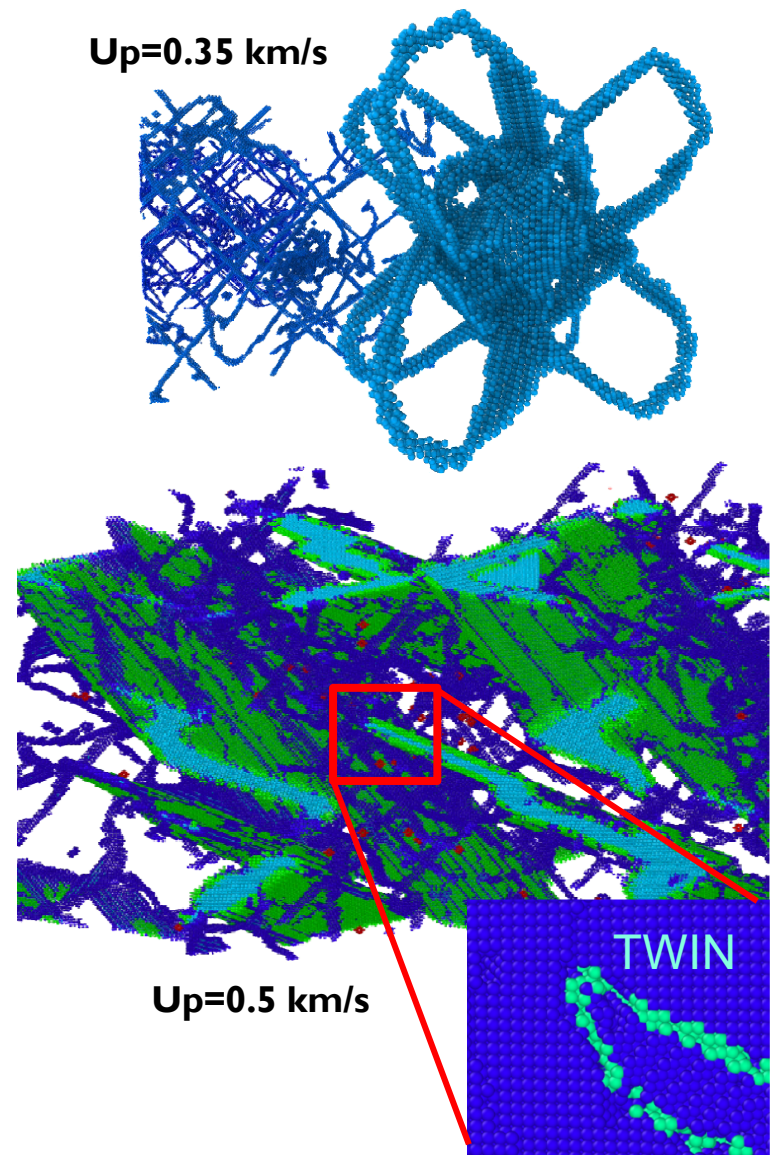
Road-Runner (2010)
A. Voter, LANL \rightarrow
nanowire at $10^{-3}/s$

Slip-Twinning transition in Ta

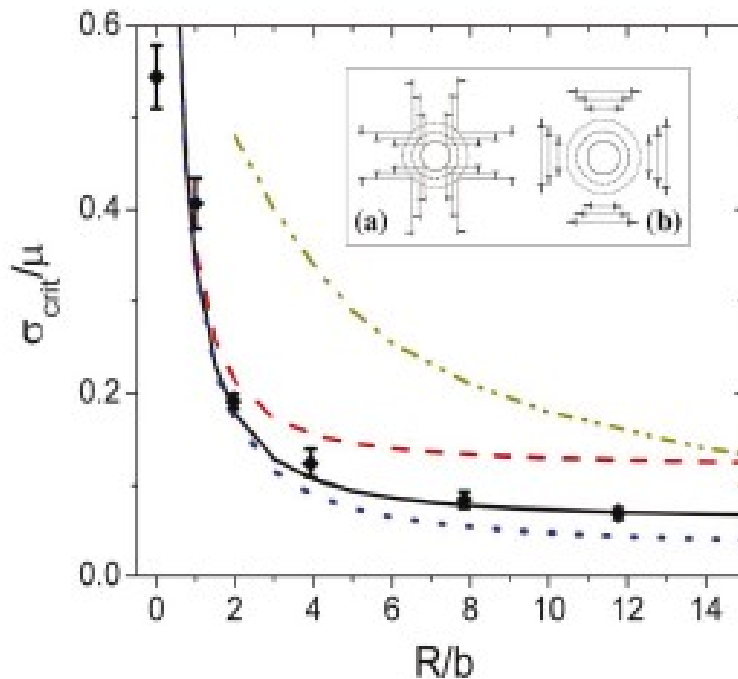
Need to include dislocation-twin interaction in constitutive model, as in Florando *et al.*, JAP 113 (2013) 83522. Would also need twin nucleation model!



Tramontina *et al.*, HEDP (2013):
[001] shock loading \rightarrow slip-twinning transition at ~ 30 GPa
Twin nucleation: Sugit *et al.*, PRB (2013)



Void failure under compression: comparison between MD & models/experiments is promising for fcc



----- Reissman *et al* (prismatic loops)

----- Lubarda (shear loops)

..... Lubarda (shear loops)

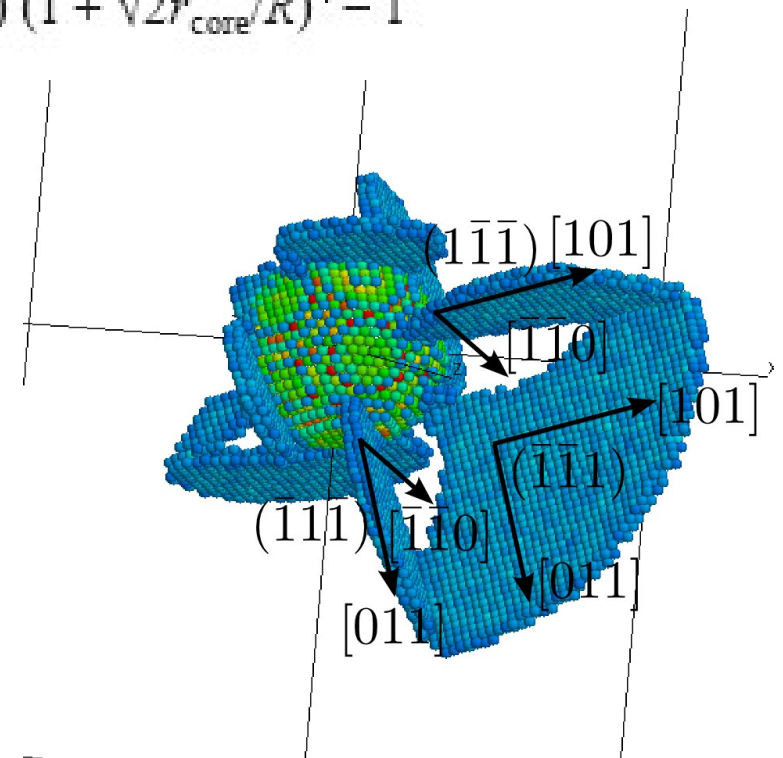
—— MD Davila *et al*

$$\frac{\sigma_{cr}}{\mu} = \frac{b/R}{\sqrt{2\pi(1-\nu)}} \frac{(1 + \sqrt{2}r_{core}/R)^4 + 1}{(1 + \sqrt{2}r_{core}/R)^4 - 1}$$

Davila *et al.*, APL (2005) 86,161902.

Traiviratana, Bringa & Meyers, several papers

**Void Faceting
(Rudd *et al.*, Traiviratana *et al.*, etc.)
recently observed in experiments
with sub-micron voids**



Cu: Loading on [111] → Triplanar Loops