

# Simulating Matter with Molecular Dynamics

(Straightforward, Obvious, Ridiculously Effective)

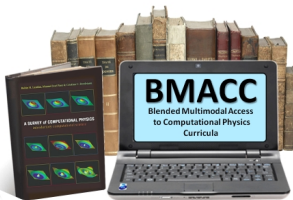
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Based on *A Survey of Computational Physics* by Landau, Páez, & Bordeianu

with Support from the National Science Foundation

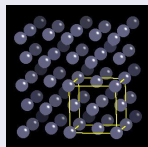
Course: **Computational Physics II**



# What Can You Do with Molecular Dynamic?

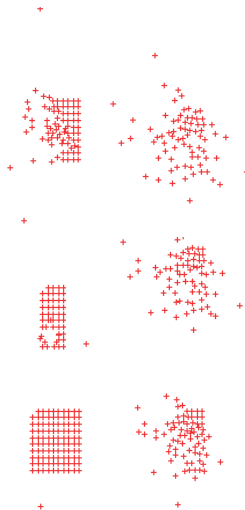
## Problem

*Will a collection of argon molecules form a liquid and then an ordered solid as the temperature is lowered?*



- Recall introductory chemistry, “ideal” gas
- Derived  $PV = nRT$  via billiard ball collisions off only walls
- Now nonideal: molecule-molecule interactions
- Argon: inert gas (closed e shell)  $\simeq$  hard spheres

# Molecular Dynamics (MD) Theory

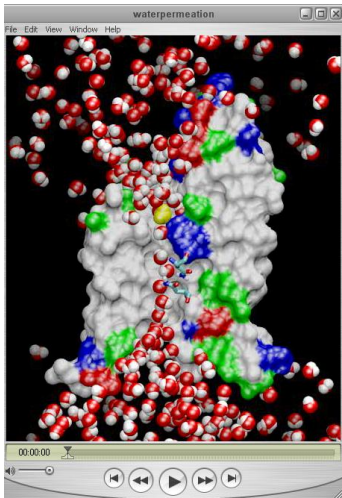


## MD Overview

- MD: simulate phys & chem properties: solids, liquids, amorphous, bio
- MD:  $F = ma$  for bulk properties
- QM = correct description, but ...
- Bulk: not small- $r$  behaviors
- QM (DFT): derive  $V_{\text{eff}}(r)$
- “HS physics problem from hell”
- Can't run  $10^{23}$ – $10^{25}$  particles
- Can  $\sim 10^6$ : proteins;  $\sim 10^8$ : materials

# Relation MD to Monte Carlo (MC) Thermodynamics

waterpermeation.mpg

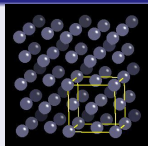
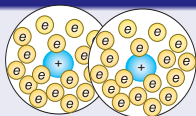


## 2 Powerful Simulation Techniques

- Both: large  $N$  particles
- Both: initial arbitrary, equilibrate
- MD: **microcanonical ensemble**:  
 $E, V, N$  fixed
- MC: **canonical ensemble**:  
heat bath, fixed  $T, N$
- MD: has dynamics ( $F = ma$ );  
MC: not, random
- MD:  $x_i, v_i$  change continuously,  
calc thermo variables

# Applying Newton's Laws ( $E$ Determines Visibility)

## Atom-Atom Interactions



- 1st Prin:  
18 e - 18 e,  $Z^+ V_c$
- $\sim 1000$  e-e, e-Z
- Ignore internal
- Conservative ( $E_o$ ),  
central  $V(r)$
- $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j| = r_{ji}$

$$m \frac{d^2 \mathbf{r}_i}{dt^2} = \mathbf{F}_i(\mathbf{r}_0, \dots, \mathbf{r}_{N-1}) \quad (1)$$

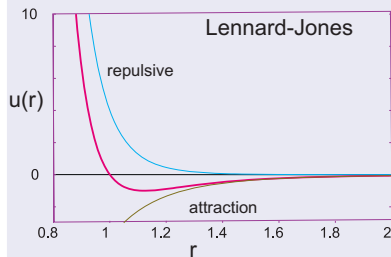
$$\mathbf{F}_i = -\nabla_{\mathbf{r}_i} U(\mathbf{r}_0, \mathbf{r}_1, \dots) \quad (2)$$

$$U = \sum_{i < j} u(r_{ij}) \quad (3)$$

$$m \frac{d^2 \mathbf{r}_i}{dt^2} = - \sum_{i < j=0}^{N-1} \frac{du}{dr_{ij}} \quad (4)$$

# Phenomenological Lennard-Jones Potential

## ∑ Short-Range Repulsion + Long Attraction



- $\epsilon \leftrightarrow$  strength
- $\sigma \leftrightarrow$  length scale
- Repulsive  $r^{-12}$
- e-e small  $r$  overlap

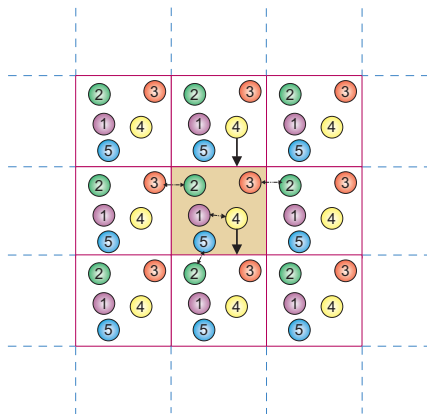
$$u(r) = 4\epsilon \left[ \left( \frac{\sigma}{r} \right)^{12} - \left( \frac{\sigma}{r} \right)^6 \right]$$

$$\mathbf{f}(r) = - \frac{du}{dr}$$

$$= 48\epsilon \frac{\mathbf{r}}{r^2} \left[ \left( \frac{\sigma}{r} \right)^{12} - \frac{1}{2} \left( \frac{\sigma}{r} \right)^6 \right]$$

- Attractive  $r^{-6}$
- Large  $r$  **van der Waals**
- Weak induced dipole-dipole
- $\leftarrow, \leftarrow, \leftarrow\leftarrow$

# Time for A Break



# Calculation of Thermodynamic Variables from MD

## Large $N$ , Use Statistical Mechanics

- Equipartition, equilibrium @  $T$ ,  $E = \frac{1}{2}k_B T$  /°F
- Simulation: just translational KE (no rotate, vibrate)

$$KE = \frac{m}{2} \left\langle \sum_{i=0}^{N-1} v_i^2 \right\rangle \quad (1)$$

- Time average KE ( $3^o$  freedom)

$$\langle KE \rangle = N \frac{3}{2} k_B T \Rightarrow T = \frac{2 \langle KE \rangle_{MD}}{3 k_B N} \quad (2)$$

- Pressure via Virial theorem,  $w = \langle \text{force} \rangle$

$$P = \frac{\rho}{3N} (2 \langle KE \rangle + w), \quad \rho = \frac{N}{V} \quad (3)$$



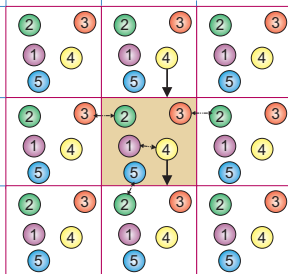
# Setting Initial Velocities for Molecules



## Initial Conditions Should Not Matter

- Start: velocity distribution characteristic some  $T \propto \langle KE \rangle$
- $\neq$  true  $T$  since not equilibrium ( $KE \leftrightarrow PE$ )
- Randomness: just to speed up calc
- Random Gaussian =  $\frac{1}{12} \sum_{i=1}^{12} r_i$

# Periodic Boundary Conditions (PBC)

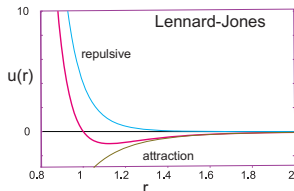
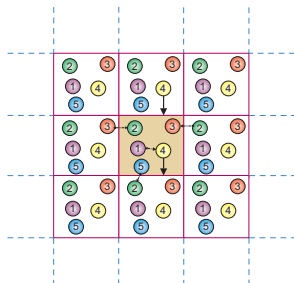


- $N = 10^3 - 10^6 = \text{bulk?}$
- *Must have box!*
- Walls: **surface effects**
- $\downarrow N \Rightarrow \uparrow \text{surface/volume}$

- EG: 1000 particles  $10 \times 10 \times 10$  cube
- $\Rightarrow 10^3 - 8^3 = 488$  surface
- $10^6$  particles  $\rightarrow 6\%$
- **PBC**: min surface effects
- Replicate box to infinity
- Continuous at edges
- Each  $\Delta t$ , outside box?
- Bring **image** in opposite side:

$$x \Rightarrow \begin{cases} x + L_x, & \text{if } x \leq 0, \\ x - L_x, & \text{if } x > L_x \end{cases}$$

# Potential Cutoff



## Computers & Boxes are Finite

- $m_i$  interacts with all  $m_j$
- $\Rightarrow \infty$  interactions
- Yet  $V(r \gg \sigma) \simeq 0$
- $V(r = 3\sigma) \simeq V(1.13\sigma)/200$
- Cut off:  $u(r > 2.5\sigma) \equiv 0$
- $\Rightarrow$  only **nearest image** interaction
- Problem:  $f = \frac{-du(r_{\text{cut}})}{dr} = -\infty$
- Small effect since  $V(r)$  small

# Verlet & Velocity-Verlet Algorithms: Integrate Eq of Mtn

Realistic MD: 3-D Eq of M,  $10^{10}$  t's,  $10^3$ – $10^6$  particles

- rk4 ODE solver good; need quicker, simpler, built-in
- **Verlet**: central-difference  $f''$

$$\mathbf{f}_i[\mathbf{r}(t), t] = m(=1) \frac{d^2 \mathbf{r}_i}{dt^2} \simeq \frac{\mathbf{r}_i(t+h) + \mathbf{r}_i(t-h) - 2\mathbf{r}_i(t)}{h^2} \quad (1)$$

$$\Rightarrow \mathbf{r}_i(t+h) \simeq 2\mathbf{r}_i(t) - \mathbf{r}_i(t-h) + h^2 \mathbf{f}_i(t) + O(h^4) \quad (2)$$

- Efficient: no solve for  $v$ 's; Determine  $v$  at end
- **Velocity-Verlet** (> stable); FD  $r$  &  $v$  together:

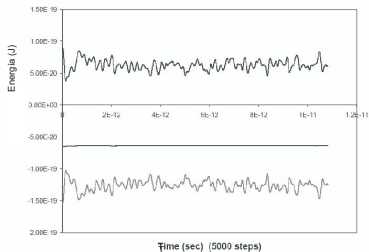
$$\mathbf{r}_i(t+h) \simeq \mathbf{r}_i(t) + h\mathbf{v}_i(t) + \frac{h^2}{2} \mathbf{f}_i(t) + O(h^3) \quad (3)$$

$$\mathbf{v}_i(t+h) \simeq \mathbf{v}_i(t) + h\overline{\mathbf{a}(t)} + O(h^2) \quad (4)$$

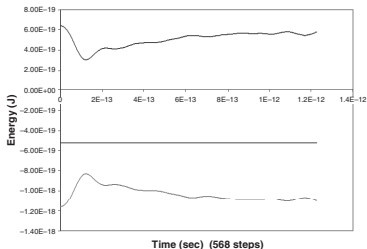
# 1-D Implementation: PE, KE, E vs Time

Energy vs Time

for 36 particles in a 2D box, initially at 150 K



Energy vs Time  
for 300 particles 2D box, initially at 150 k



MD.py

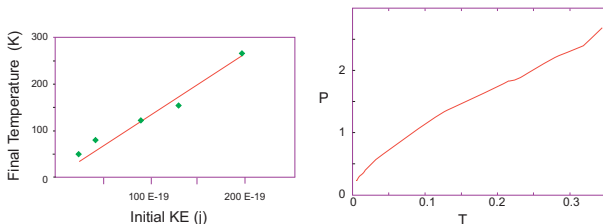


CODE

$V, T \Rightarrow$  liquid, solid

- 1 Start FCC lattice site:  $V_{LJ}$  equilibrium
- 2 FCC particles/cell:  $4N^3 = 32, 108, \dots$
- 3 Start Maxwellian velocity distribution
- 4 Highlight: ODE, PBC, image, cut off
- 5  $\sim 10^4 - 10^5$  steps equilibrate ( $10^{-9}$  s)
- 6 Choose *largest*  $h$  that's stable
- 7 Compare to Figures
- 8 Evaluate  $\langle E \rangle_t$ , final  $T$
- 9 Relation final and initial  $T$ 's?

# Trajectory Analysis (Time To Get To Work)



## Output Several Particles' $x$ & $v$ for Every 100 Steps

- 1 Start with 1-D,  $T = 0$  @ equilibrium, then 2-D
- 2  $PV = NRT$  for ideal ( $V = 0$ ) gas
- 3 Increase  $T$ , note motion, interactions
- 4 Create an animation
- 5 Plot displacements  $R_{\text{rms}}$  vs  $T$
- 6 Test for time-reversal invariance