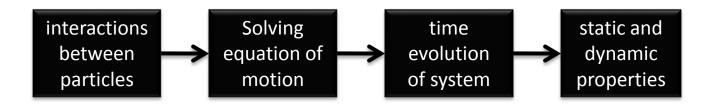
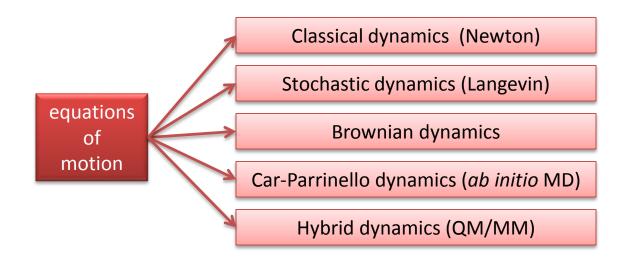


# **Molecular Dynamic Simulations**

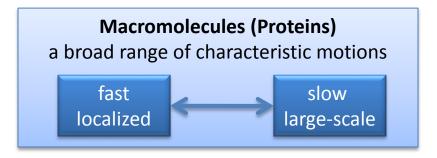
# **Molecular Dynamic Simulation**

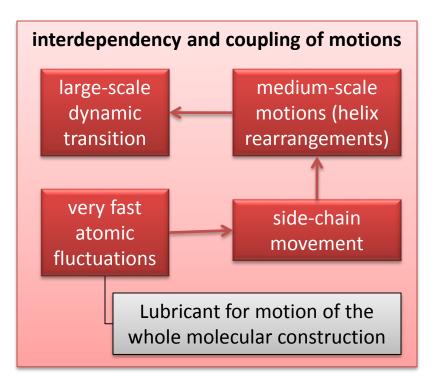
detailed microscopic modeling on atomic scale

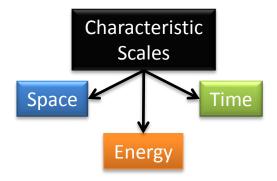




# **Types of Macromolecular Motions**



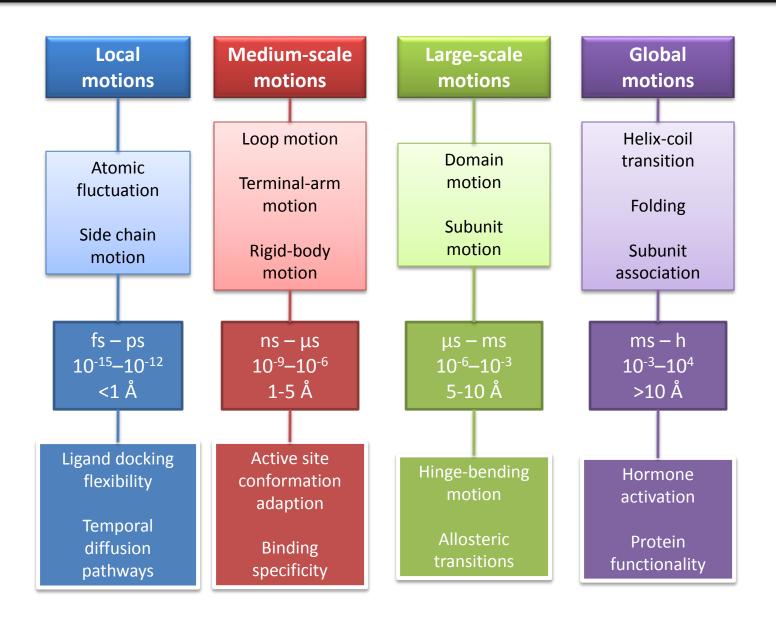




Even in the study of slow large-scale motions it is not possible to ignore fast small-scale motions.

Fast small-scale motions impose limitations on the simulation time step and length.

## **Characteristic Motions in Proteins**



### **Statistical Mechanics**

### microscopic states

microscopic variables

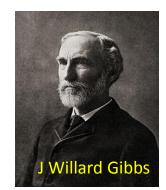
$$\{\mathbf{r}_1,\mathbf{p}_1,\mathbf{r}_2,\mathbf{p}_2,...,\mathbf{r}_N,\mathbf{p}_N\}$$



#### macroscopic states

macroscopic variables

$$\{N, V, E\}$$
 or  $\{N, V, T\}$  or ...



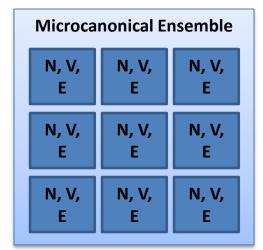
For each *macrostate* very (very very) many different *microstates* are possible.

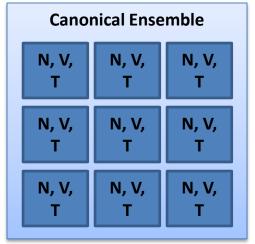
#### **Ensemble**

Collection of huge number of mental copies of a system

#### **Ensemble Averages**

macroscopic quantities are averages of the corresponding microscopic quantities over all systems in the ensemble.

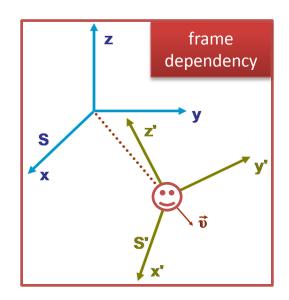




# **Microscopic Motion**

#### **Linear Momentum**

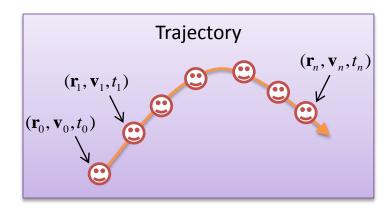
If an object is moving in any reference frame, then it has momentum in that frame.



### **Equation of motion**

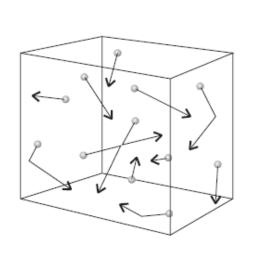
motion under influence of a force and as a function of time

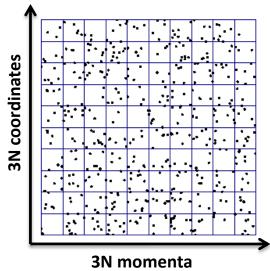
$$\mathbf{F} = \frac{d\mathbf{p}}{dt} = m\frac{d\mathbf{v}}{dt} = m\mathbf{a}$$
force acceleration

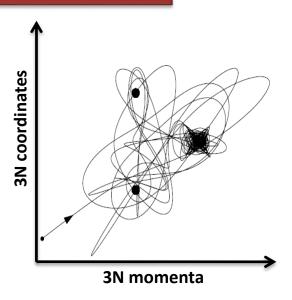


# Phase space

The position and velocity variables define the *phase space* of a system.







$$\mathbf{r} = \{x_1, y_1, z_1, x_2, y_2, z_2, \dots, x_N, y_N, z_N\}$$

$$\mathbf{p} = \{p_{1,x}, p_{1,y}, p_{1,z}, p_{2,x}, p_{2,y}, p_{2,z}, ..., p_{N,x}, p_{N,y}, p_{N,z}\}$$

Microscopic state of the system is a single point in phase space.

The path of the motion in phase space is called the trajectory.

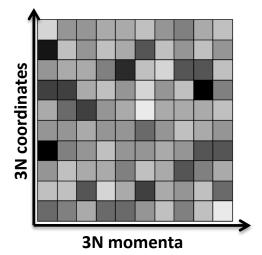
### The Statistical Mechanics Basis of MD

### classical system classical Hamiltonian

Total energy as a function of coordinates **r** and momenta **p** 

$$H(\mathbf{r},\mathbf{p}) = K(\mathbf{p}) + U(\mathbf{r}) = \sum_{i} \frac{p_i^2}{2m_i} + U(\mathbf{r})$$

potential energy function independent of time and velocity.



### Canonical Partition Function and Boltzmann distribution function

probability of finding the system at each and every point (microstate) in phase space.

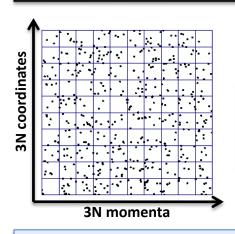
$$\rho(\mathbf{r}, \mathbf{p}) = \frac{e^{-H(\mathbf{r}, \mathbf{p})/k_{\mathrm{B}}T}}{Q}$$

$$\rho(\mathbf{r},\mathbf{p}) = \frac{e^{-H(\mathbf{r},\mathbf{p})/k_{\mathrm{B}}T}}{Q} \qquad Q = \int_{V} d\mathbf{r} \int_{-\infty}^{+\infty} d\mathbf{p} \ e^{-H(\mathbf{r},\mathbf{p})/k_{\mathrm{B}}T}$$

$$\rho_i = \frac{e^{-E_i/k_{\rm B}T}}{O}$$

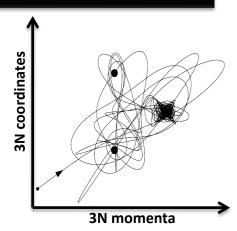
$$\rho_i = \frac{e^{-E_i/k_B T}}{O} \qquad Q = \sum_i e^{-E_i/k_B T}$$

# **Averaging Microstates Over Phase Space**



#### dynamic variables

any other function of **r** and/or **p** (total energy, kinetic energy, fluctuations, ...)



# Thermodynamic Averages (Ensemble Averages)

$$\langle A(\mathbf{r}, \mathbf{p}) \rangle_Q = \int d\mathbf{r} \int d\mathbf{p} \ \rho(\mathbf{r}, \mathbf{p}) \ A(\mathbf{r}, \mathbf{p})$$

take into account every possible state of system.

Average over *all points* in phase space at a *single time*.

# Dynamic Averages (Time Averages)

$$\langle A(\mathbf{r}, \mathbf{p}) \rangle_{\tau} = \frac{1}{\tau} \int_{0}^{\tau} dt \ A(\mathbf{r}(t), \mathbf{p}(t)) \quad \langle A \rangle = \frac{1}{M} \sum_{i=1}^{M} A(\mathbf{r}_{i}, \mathbf{p}_{i})$$

follow the motion of a single point through phase space.

Average over a *single point* in phase space at *all times*.

Frgodic Hypothesis
for an infinitely
long trajectory

$$\lim_{\tau \to \infty} \left\langle A(\mathbf{r}, \mathbf{p}) \right\rangle_{\tau} = \left\langle A(\mathbf{r}, \mathbf{p}) \right\rangle_{\mathcal{Q}}$$

Points of an enough long trajectory, will eventually cover all of phase space.

#### **Internal Energy**

$$U = \langle E \rangle = \frac{1}{M} \sum_{i=1}^{M} E_i$$

#### **Heat Capacity**

multiple run evaluation

$$C_V = \left(\frac{\partial U}{\partial V}\right)_T$$

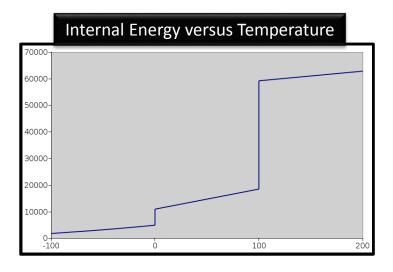
single run evaluation

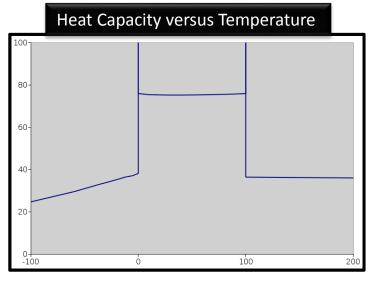
$$C_V = \{\langle E^2 \rangle - \langle E \rangle^2\} / k_{\rm B} T^2$$

$$\langle (E - \langle E \rangle)^2 \rangle = \langle E^2 \rangle - \langle E \rangle^2$$

$$C_V = \langle (E - \langle E \rangle)^2 \rangle / k_B T^2$$

$$C_V = \langle (E - \langle E \rangle)^2 \rangle / k_{\rm B} T^2$$





#### **Pressure**

virial theorem

$$W = \sum_{i=1}^{N} \mathbf{r}_i \cdot \mathbf{f}_i = -3Nk_B T$$

independent particles

$$W = -3PV = -3Nk_BT$$
  $PV = Nk_BT$ 

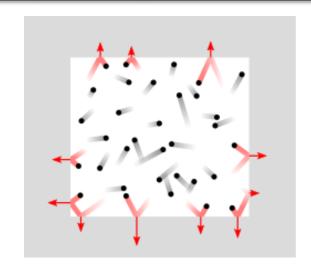
interacting particles

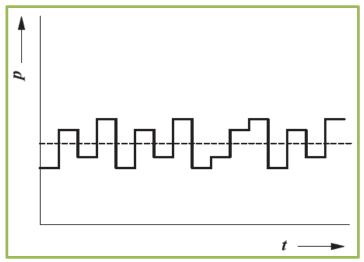
$$f_{ij} = \frac{d u(r_{ij})}{d r_{ij}}$$

$$W = -3PV + \sum_{i=1}^{N} \sum_{j=i+1}^{N} r_{ij} f_{ij} = -3Nk_B T$$

interaction with container

Interaction with other particles





#### Theorem of Equipartition of Energy

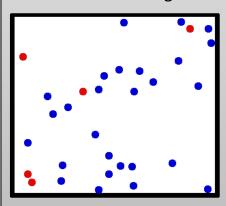
In thermal equilibrium, energy is shared equally among all of its various forms.

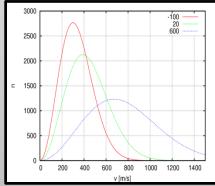
Each degree of freedom contributes  $k_BT/2$ .

Holds only for ergodic systems in thermal equilibrium.

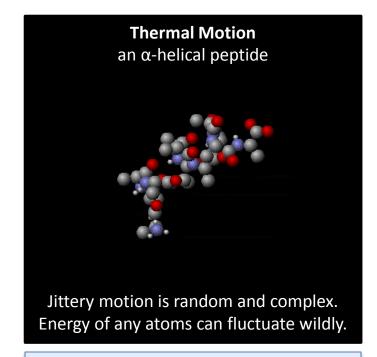
All states with the same energy must be equally likely to be populated.

It must be possible to exchange energy among all its various forms.





Kinetic energy of a molecule can fluctuate wildly. Average energy can be calculated at any temperature.



#### **Temperature**

$$K(\mathbf{p}) = \sum_{i} \frac{p_i^2}{2m_i} = \frac{k_B T}{2} (3N - N_c)$$

 $N_c$  = number of constraints

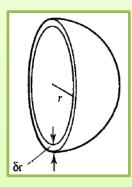
Total linear momentum of system is often constrained to zero  $(N_c=3)$ .

# Radial Distribution Functions (Pair Correlation Function)

probability of finding a pair of atoms at a distance r, relative to probability expected for a completely random distribution at the same density.

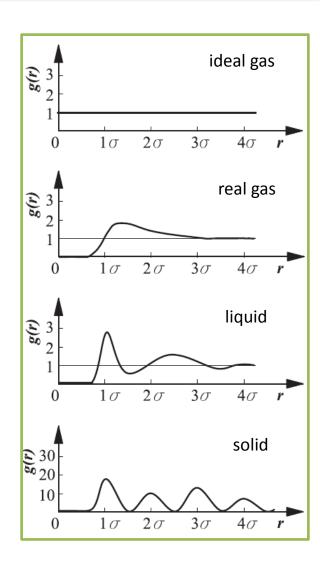
#### **Calculation Method:**

neighbors around each particle are Sorted into distance 'bins'. The number of neighbors in each bin is then averaged over the entire simulation.



$$E = \frac{3}{2}Nk_{\rm B}T + 2\pi N\rho \int_0^\infty r^2 v(r)g(r)\,dr$$

$$PV = Nk_{\rm B}T - \frac{2\pi N\rho}{3k_{\rm B}T} \int_0^\infty r^2 r \frac{dv(r)}{dr} g(r) dr$$



# **Newton's Equation of Motion**

### simplistic form

second-order differential equation

$$F_i = m_i a_i = m_i \ddot{r}_i$$

The force is determined by the gradient of the potential energy function.

$$F_i = -\nabla_i U(\mathbf{r})$$

### general formulation

a pair of coupled first order differential equations

$$\dot{r}_k = \frac{\partial H(\mathbf{r}, \mathbf{p})}{\partial p_k}; \qquad \dot{p}_k = -\frac{\partial H(\mathbf{r}, \mathbf{p})}{\partial r_k}$$

A set of two first-order differential equations is often easier to solve than a single second-order differential equation.

# **Properties of Newton's Equation of Motion**

Serve as "handles" to ensure that the numerical solution is correct

#### **Conservation of energy:**

Assuming that **U** and **H** do not depend explicitly on time or velocity.

Hamiltonian is a constant of motion or there is conservation of total energy

$$\partial H/\partial t = 0$$
  $\rightarrow dH/dt$  is zero

### Time reversibility

Changing the signs of all velocities will cause the molecule to retrace its trajectory.

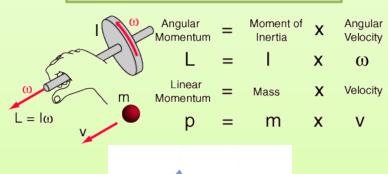
Time reversibility can be reproduced by numerical trajectories only over very short periods of time because of the chaotic nature of large molecular systems.

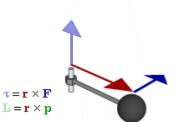
# Conservation of linear and angular momentum

If the potential function U depends only on particle separation and there is no external field applied

$$\mathbf{P} = \sum_{i} p_{i}$$

$$L = \sum_{i} r_{i} \times p_{i} = \sum_{i} m_{i} r_{i} \times \dot{r}_{i}$$





# **Molecular Dynamics: Computational Algorithms**

numerical procedures for integrating the differential equation

finite-difference approach standard method for solving ordinary differential equations

Coordinates and velocities at a time **t+Δt** are obtained from coordinates and velocities at an earlier time **t**.

The equations are solved on a step-by-step basis.

#### choice of time interval

**Δt** depends on the properties of the molecular system simulated.

Δt must be significantly smaller than the characteristic time of the motion studied.

# Taylor expansion of position at time t+Δt about time t

$$\mathbf{r}(t + \Delta t) = \mathbf{r}(t) + \dot{\mathbf{r}}(t)\Delta t + \frac{1}{2}\ddot{\mathbf{r}}(t)\Delta t^2 + \cdots$$

$$\mathbf{r}(t + \Delta t) = \mathbf{r}(t) + \mathbf{v}(t)\Delta t + \frac{1}{2}\mathbf{a}(t)\Delta t^2 + \cdots$$

Rewrite expansion in a discrete form

$$\mathbf{r}_{n+1} = \mathbf{r}_n + \mathbf{v}_n \Delta t + \frac{1}{2} \left( \frac{\mathbf{F}_n}{\mathbf{m}} \right) \Delta t^2 + O(\Delta t^3)$$

$$\mathbf{v}_{n+1} = (\mathbf{r}_{n+1} - \mathbf{r}_n)/2$$



The formulation is highly trivial and results in a low quality integration algorithm (large errors).

# Computational Algorithms: Verlet Integrator

The most common integration algorithm used in the study of biomolecules.

### Two Taylor expansions:

Forward expansion  $(t+\Delta t)$ :

$$\mathbf{r}_{n+1} = \mathbf{r}_n + \mathbf{v}_n \Delta t + \frac{1}{2} \left( \frac{\mathbf{F}_n}{\mathbf{m}} \right) \Delta t^2 + O(\Delta t^3)$$

Backward expansion  $(t-\Delta t)$ :

$$\mathbf{r}_{n-1} = \mathbf{r}_n - \mathbf{v}_n \Delta t + \frac{1}{2} \left( \frac{\mathbf{F}_n}{\mathbf{m}} \right) \Delta t^2 - O(\Delta t^3)$$

Propagating the positions:

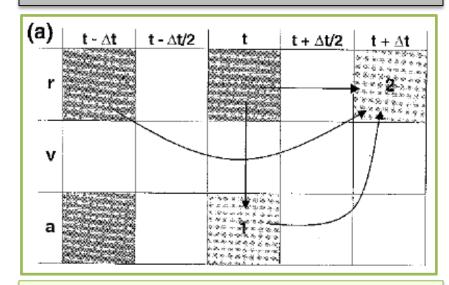
$$\mathbf{r}_{n+1} = 2\mathbf{r}_n - \mathbf{r}_{n-1} + \frac{\mathbf{F}_n}{\mathbf{m}} \Delta t^2 + O(\Delta t^4)$$

Propagating the velocities:

$$\mathbf{v}_n = \frac{\mathbf{r}_{n+1} - \mathbf{r}_{n+1}}{2\Delta t} + O(\Delta t^2)$$

#### execution instructions:

- 1) Use current position  $\mathbf{r}_n$  to calculate current force  $\mathbf{F}_n$ .
- **2)** Use current and previous positions  $\mathbf{r}_n$  and  $\mathbf{r}_{n-1}$  and current force  $\mathbf{F}_n$  to calculate position in next step,  $\mathbf{r}_{n+1}$ .



A stable numerical method for solving Newton's equation of motion for systems ranging from simple fluids to biopolymers.

# Computational Algorithms: Verlet Integrator

#### Advantages of the Verlet algorithm:

- 1) Position integration is quite accurate and independent of velocity propagation.
- 2) The algorithm requires only a single force evaluation per integration cycle.
- **3)** Forward and backward expansions, guarantees time reversibility.

#### **Disadvantages of the Verlet algorithm:**

- 1) The velocity propagation is subject to relatively large errors.
- **2)**  $\mathbf{v}_n$  can be computed only if  $\mathbf{r}_{n+1}$  is already known.
- **3)** Algorithm is not "self-starting" and need a lower order expansion to initiate.
- 4) It must be modified to incorporate velocity-dependent forces or temperature scaling.

# Computational Algorithms: Leap-Frog Integrator

Velocities are evaluated at the midpoint of the position evaluation and vice versa

$$\mathbf{r}_{n+1} = \mathbf{r}_n + \mathbf{v}_{n+1/2} \Delta t$$

$$\mathbf{v}_{n+1/2} = \mathbf{v}_{n-1/2} + \frac{\mathbf{F}_n}{\mathbf{m}} \, \Delta t$$

The current velocity  $\mathbf{v}_n$ 

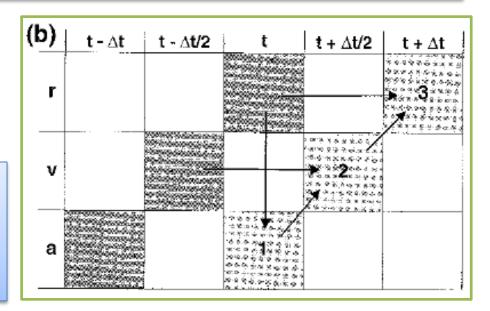
$$\mathbf{v}_n = (\mathbf{v}_{n+1/2} + \mathbf{v}_{n-1/2})/2$$

### Advantages of the leap-frog algorithm:

- 1) Direct and more accurate evaluation of velocity.
- **2)** Improved control of temperature via velocity scaling.

#### execution instructions:

- 1) Use current position  $\mathbf{r}_n$  to calculate current force  $\mathbf{F}_n$ .
- **2)** Use current force  $\mathbf{F}_n$  and previous mid-step velocity  $\mathbf{v}_{n-1/2}$  to calculate next mid-step velocity  $\mathbf{v}_{n+1/2}$ .
- **3)** Use current position  $\mathbf{r}_n$  and next mid-step velocity  $\mathbf{v}_{n+1/2}$  to calculate position in next step,  $\mathbf{r}_{n+1}$ .



This algorithm is computationally a little more expensive than the Verlet algorithm.

# Computational Algorithms: Velocity Verlet Integrator

Store positions, velocities, and accelerations all at the same time **t** and minimizes round-off errors

$$\mathbf{r}_{n+1} = \mathbf{r}_n + \mathbf{v}_n \Delta t + \frac{1}{2} \left( \frac{\mathbf{F}_n}{\mathbf{m}} \right) \Delta t^2$$

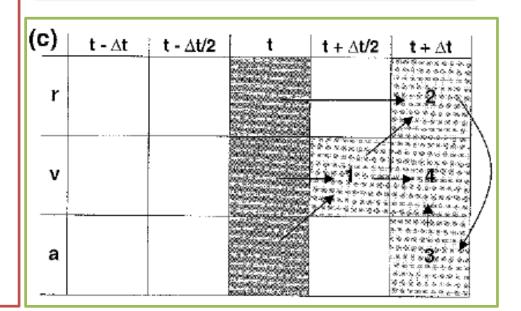
$$\mathbf{v}_{n+1} = \mathbf{v}_n + \frac{1}{2} \left[ \frac{\mathbf{F}_n}{\mathbf{m}} + \frac{\mathbf{F}_{n+1}}{\mathbf{m}} \right] \Delta t$$

$$\mathbf{v}_{n+1/2} = \mathbf{v}_n + \frac{1}{2} \left( \frac{\mathbf{F}_n}{\mathbf{m}} \right) \Delta t$$

$$\mathbf{v}_{n+1} = \mathbf{v}_{n+1/2} + \frac{1}{2} \left( \frac{\mathbf{F}_{n+1}}{\mathbf{m}} \right) \Delta t$$

#### execution instructions:

- 1) Calculate position  $\mathbf{r}_{n+1}$  at time  $t+\Delta t$ .
- **2)** Calculate velocity at mid-step  $\mathbf{v}_{n+1/2}$ .
- **3)** Calculate force  $\mathbf{F}_{n+1}$  at time  $t+\Delta t$ .
- **4)** Complete velocity move to  $\mathbf{v}_n$  by using  $\mathbf{v}_{n+1/2}$ .



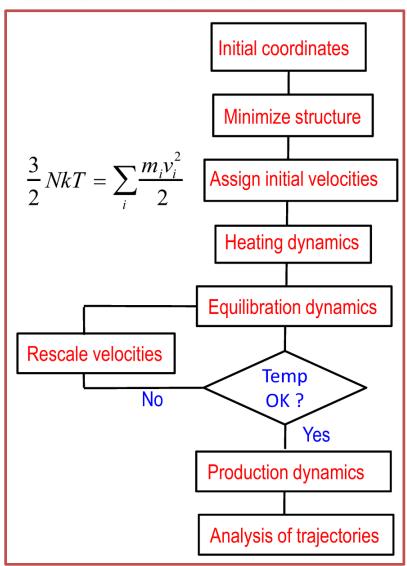
### Advantages of velocity Verlet algorithm:

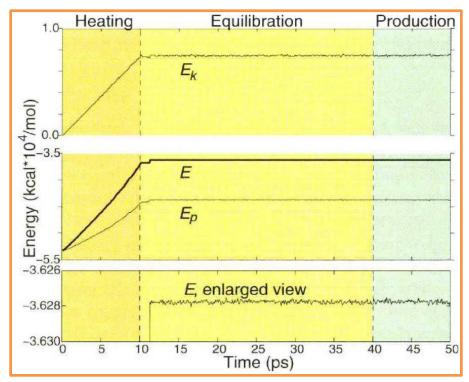
- 1) numerically very stable.
- 2) convenient and simple to code.
- 3) Accurate velocities and kinetic energy.

Computationally a little more expensive than the simpler Verlet or leap-frog algorithms

## **Classical MD Simulation Protocol**

demanding part





$$\begin{split} V_{\text{total}} &= \sum_{\text{bonds}} K_b \big( r - r_0 \big)^2 + \sum_{\text{angles}} K_\theta \big( \theta - \theta_0 \big)^2 + \sum_{\text{dihedrals}} K_\phi \big[ 1 + \cos \big( n \phi - \gamma \big) \big] \\ &+ \sum_{\substack{\text{van der Waals} \\ i, j \text{ pairs}}} \left( \frac{A_{ij}}{r_{ij}^{12}} - \frac{B_{ij}}{r_{ij}^{6}} \right) + \sum_{\substack{\text{electrostatic} \\ i, j \text{ pairs}}} \frac{q_i q_j}{\mathcal{E} r_{ij}} \end{split}$$
 The most time

# **Assigning Initial Coordinates**

#### **Usual Source:**

Experimentally determined structures (X-ray crystallography and NMR)

#### **Possible Source:**

Structures based on computer models (A variety of modeling techniques)

Experimental structures need some preparation steps before use.

### Initial refinement by energy minimization:

to relieve local stresses due to non-bonded overlaps.

to relax bond length and bond angle distortions in experimental structure.

stresses are due to empirical nature of energy function and to the average nature of experimentally determined structures.

### **Hydrogen atom positions:**

can not be determined by X-ray crystallography.

must be added separately to initial structure before MD is started.

### Missing parts of protein:

flexible parts of molecule that do not have a well-defined structure (such as loops).

facilitate crystallization process (such as terminal sequences).

structural models may be used to fill in the gaps.

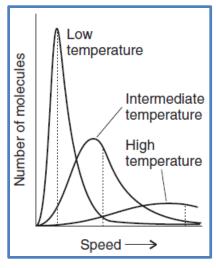
## **Assigning Initial Velocities**

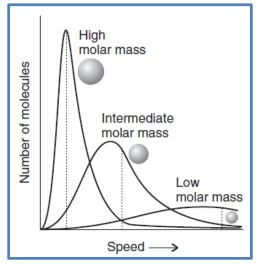
The only relevant information about atomic velocities is temperature T.

#### **Maxwell Distribution**

Initial velocities are randomly assigned from standard Maxwell velocity distribution.

$$P(v)dv = \left(\frac{m}{2\pi k_B T}\right)^{1/2} \exp\left[\frac{-mv^2}{2k_B T}\right] dv$$





### "Hot Spot" Problem:

Random assignment may accidentally assign high velocities to a localized cluster of atoms that make the simulation unstable.

#### **Velocity Correlation Problem:**

Expected velocity correlation between neighboring atoms is not guaranteed.

### **Equilibrium Problem:**

Initial assignment is not at equilibrium.

#### **Non Zero Total Momenta Problem:**

Large initial total linear momentum **P** and total angular momentum **L**.

Irrelevant translational drift and global rotation.

# **Assigning Initial Velocities**

#### **Gradual heat-up:**

Velocities are initially assigned at a low temperature, which is then increased gradually allowing for dynamic relaxation.

$$T(t) = \frac{1}{k_B N_{\text{dof}}} \sum_{i=1}^{N_{\text{dof}}} m_i |v_i|^2$$

N<sub>dof</sub> is the number of unconstrained degrees of freedom in the system

### Heating by increasing atomic velocities:

- 1) reassigning new velocities from a Maxwell distribution at an elevated temperature.
- 2) scaling the velocities by a uniform factor

scaling the velocities by a factor of  $[T_0/T(t)]^{1/2}$  will result in a mean kinetic energy corresponding to a desired temperature  $T_0$ 

# **Importance of Boundary Effects and Boundary Conditions**

# Boundary effect on real bulk? 1 liter water at room temperature

A cube of approximately **3.3 x 10<sup>25</sup>** molecules.

Interactions with walls can extend up to **10** molecular diameters.

Diameter of water molecule is approximately **2.8** Å.

About **2** x **10**<sup>19</sup> molecules are interacting with boundary.

About **one in 1.5 million** molecules is influenced by interactions with the walls of the container.

#### Finite size effects?

a system of 1000 water molecules

molecular dynamics simulation to derive 'bulk' properties.

Most molecules would be within the influence of walls of boundary.

simulation in a vessel is not an appropriate way to derive 'bulk' properties.

### If ignore the container?

**3/4** of molecules are at the surface rather than in bulk.

Such a situation would be relevant to studies of liquid drops.

# **Periodic Boundary Conditions**

Simulate a small number of particles, while they experience forces as if they were in bulk fluid.

A box of particles which is replicated in all directions in a periodic array.

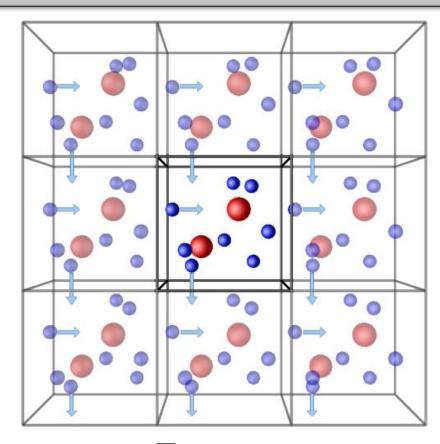
In three dimensions each cubic box would have 26 nearest neighbors.

leaving particle is replaced by an image particle from the opposite side.

Number of particles within central box remains constant.

Any cell shape can be used if it fills all of space by translation operations.

Choose a periodic cell that reflects underlying geometry of system.







## **Minimum Image Convention**

#### **Bonded interactions**

Bonded interactions are local. Linear computational cost: O(N). (N = number of atoms)

#### **Non-Bonded interactions**

Quadratic cost: O(N²).

Prohibitive for large molecules.

LJ potential falls off very rapidly
(99% decay from σ to 2.5σ)

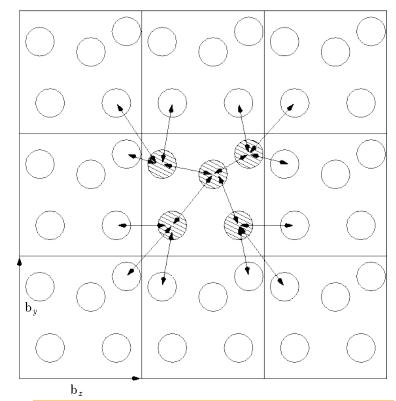
In principle, must be calculated between every pair of atoms in system.

In practice, use non-bonded cutoff and apply minimum image convention.

Each atom is repeated infinitely via periodic boundary method.

Each atom 'sees' at most just one image of every other atom.

Energy and/or force is calculated with closest atom or image.



$$U_{NB} = \sum_{i,j \text{ nonbonded}} \varepsilon_{ij} \left[ \left( \frac{R_{ij}}{r_{ij}} \right)^{12} - 2 \left( \frac{R_{ij}}{r_{ij}} \right)^{6} \right] + \sum_{i,j \text{ nonbonded}} \frac{q_{i}q_{j}}{4\pi\varepsilon_{0}\varepsilon r_{ij}}$$

## **Non-Bonded Cutoff**

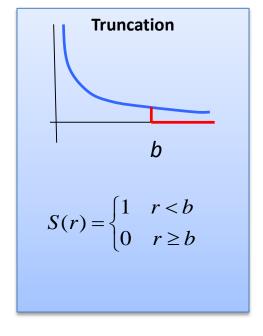
$$U_{NB} = \sum_{i,j} \omega_{ij} S(r_{ij}) \varepsilon_{ij} \left[ \left( \frac{R_{ij}}{r_{ij}} \right)^{12} - 2 \left( \frac{R_{ij}}{r_{ij}} \right)^{6} \right] + \sum_{i,j} \omega_{ij} S(r_{ij}) \frac{q_{i}q_{j}}{r_{ij}}$$

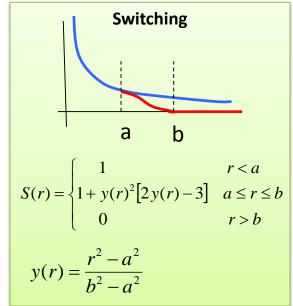
### Weights: $0 < \omega_{ii} < 1$

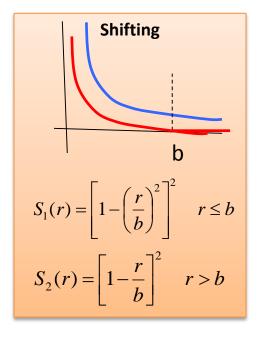
To exclude bonded terms or to scale them (usually 1-4)

Cutoff function: *S*(*r*)
To truncate, switch or shift interaction energy

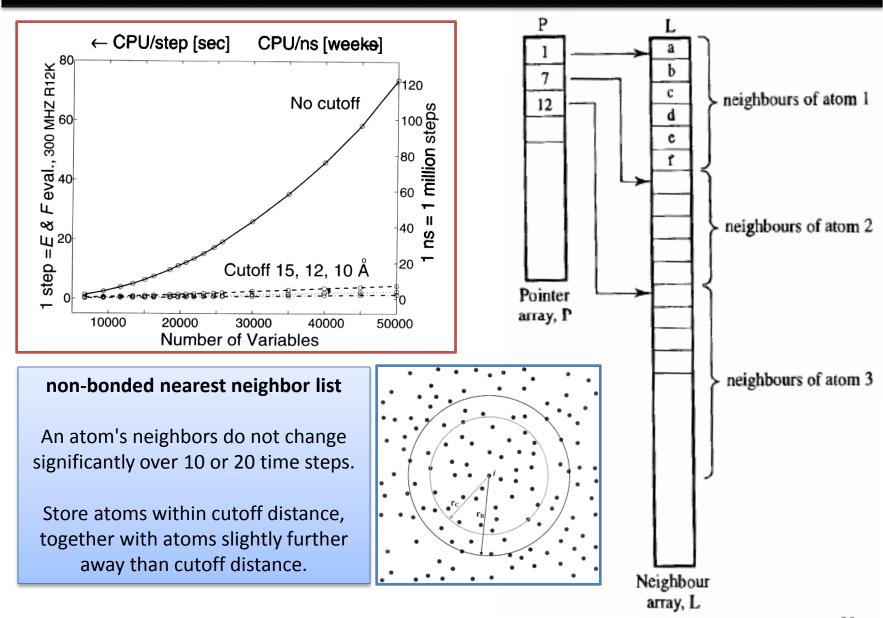
0 0	o o	0 0
000	0 0 0	0 0 0
0 0	0 0	0
0 0 0	0 0 0	0 0 0
0 0	0 0	0 0
000	0 0	0 0 0
000	0 0	٥٥٥
0 0	0	0
000	00 0	000
0 0	0 0	0 0
0 0 0	0 0 0	000







## **Non-Bonded Cutoff**



### **Some issues about Periodic Boundaries**

#### **Validation**

Effects of periodic boundary can be checked by comparing a variety of cell shapes and sizes.

#### **Coverage of large-scale fluctuations**

It is not possible to achieve fluctuations that have a wavelength greater than length of cell. Example: near the liquid-gas critical point.

Wavelength of sound or shock waves and phonons in system is limited by box size.

#### **Coverage of long-range interactions:**

The range over which interactions act should be smaller than the cell size. Lennard-Jones is relatively short-range and cell should have a side greater than  $6\sigma$ . Argon Example: cell size around 20 Å.

Electrostatic forces act on longer ranges and should be handled in a separate manner. In presence of ionic interactions, net charge of system must be zero. Neutrality can be obtained by adding counterions such as sodium or chloride.

## **Some issues about Periodic Boundaries**

#### Maintenance of minimum-image convention

Spherical cutoff radius for non-bonded forces should be at most half the length of box side.

A particle should not see its own image, or the same molecule twice.

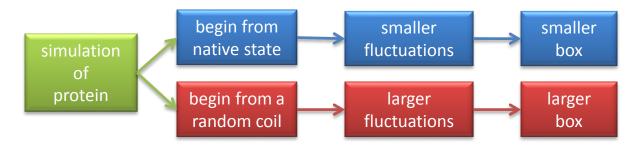
### Periodic artifacts due to unphysical topology

A macromolecule should not interact with its own image in a neighboring box. It is functionally equivalent to a molecule's "head" interacting with its own "tail".

This produces highly unphysical dynamics in most macromolecules.

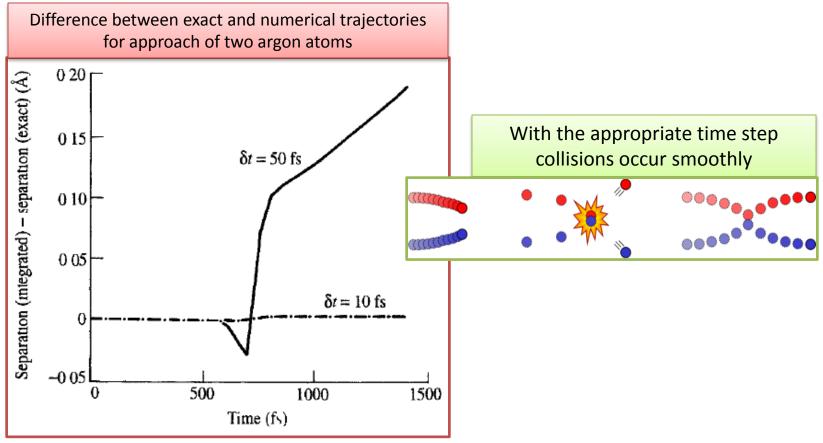
Effects of solvation shells on the observed dynamics are not well understood.

Common recommendation based on simulations of DNA: at least 1 nm of solvent around molecules of interest in every dimension.



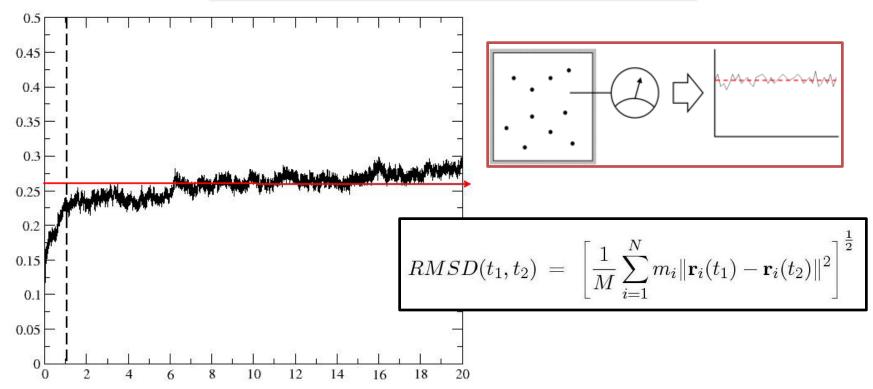
## **Time Step**

- Not too short so that conformations are efficiently sampled
- Not too long to prevent wild fluctuations or system 'blow-up'
- An order of magnitude less than the fastest motion is ideal
  - Usually bond stretching is the fastest motion: C-H is ~10 fs so use time step of 1 fs
  - Not interested in these motions? Constrain these bonds and double the time step



# **Monitoring the Equilibration**

- The system is at equilibrium if:
- Quantities fluctuate around an average value.
- The average remains constant over time.
- Variables to monitor:
- Structural properties (RMSD, order parameters...)
- Thermodynamics quantities (Potential Energy...)



# **Molecular Dynamics Ensembles**

Micro-Canonical ensemble: constant N, V and E

To simulate under constant T or P:

Canonical Ensemble: NVT Isothermal-Isobaric: NPT

# Simulating at constant T: Berendsen scheme

system

Heat bath

Exponentially scale the velocities at each time step by a factor  $\lambda$ 

$$\lambda = \sqrt{1 - \frac{\Delta t}{\tau} \left( 1 - \frac{T_{bath}}{T} \right)}$$

 $\tau$  determines how strong the bath influences the system.

#### Simulating at constant T: Berendsen scheme

system

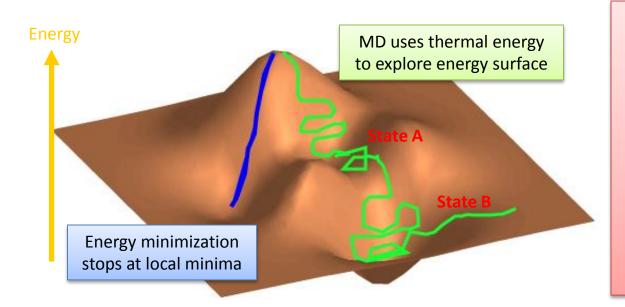
Pressure bath

Exponentially scale volume of simulation box at each time step by a factor  $\boldsymbol{\lambda}$ 

$$\lambda = 1 - \kappa \frac{\Delta t}{\tau_P} \left( P - P_{bath} \right)$$

 $\kappa$ : isothermal compressibility  $\tau_p$ : coupling constant

# MD As a Tool for Minimization: Crossing energy barriers

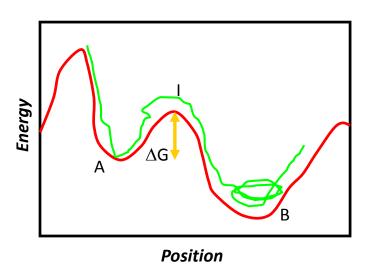


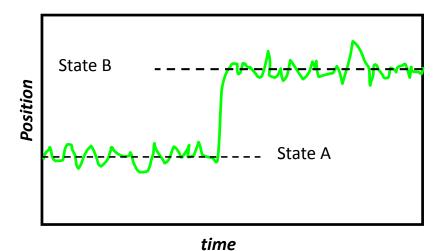
The actual transition time from A to B is very quick.

What takes time is waiting.

Average waiting time for going from A to B:

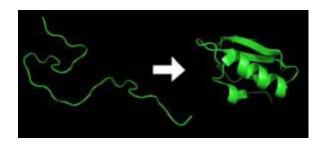
$$\tau_{A\to B} = Ce^{\frac{\Delta G}{kT}}$$



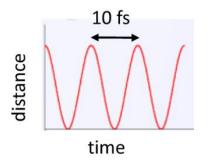


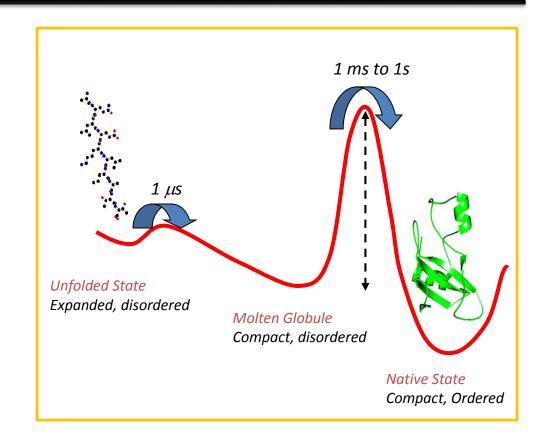
# **Some Practical Aspects of Biomolecular MD**

(1) Slow motions often occur on timescales that not easily accessible and thus are not well characterized with simulations.



(2) The optimum time step depends on the physics of the system. In particular, it depends on the fastest motion.





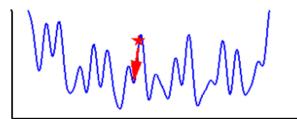
In most biological problems, the fastest motion is the C–H stretching and the slowest is protein folding.

# **Some Practical Aspects of Biomolecular MD**

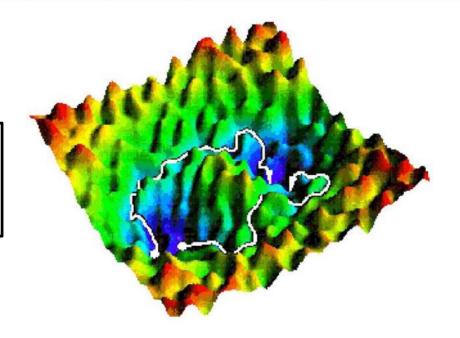
### (3) Convergence Problem:

How long the simulation should be to extract reliable information?

**(4) Sampling of minima** is essential for the conformational flexibility, and therefore, to function of biomolecules.



(5) Simulation can get stuck in one of the many minima on the energy landscape, and not allow for complete sampling of conformational space.



### (6) The ergodicity should be checked:

At equilibrium, independent trajectories over an ergodic system must be self-averaging.

**(7) Multiple shorter trajectories** have been found to be more effective at sampling phase space than a single long one.

## **Some Practical Aspects of Biomolecular MD**

(8) Force fields must be parameterized specifically for compounds that one is attempting to model.

#### **Example From CHARMM:**

2D dihedral energy correction map to the CHARMM 22 φ,ψ backbone.

$$E_{CHARMM}^{protein} = E_{bonds} + E_{UB} + E_{angle} + E_{dihe} + E_{CMAP} + E_{imp} + E_{vdw} + E_{elec}$$
 An energy correction map based on quantum mechanical calculations. 
$$E_{CMAP} = f(\Phi, \Psi) = \sum_{i=1}^4 \sum_{j=1}^4 c_{ij} \left(\frac{\Phi - \Phi_L}{\Delta_{\Phi}}\right)^{i-1} \left(\frac{\Psi - \Psi_L}{\Delta_{\Psi}}\right)^{j-1}$$

- An energy correction map based on quantum mechanical calculations.
- It improves protein backbone behavior and thus yields more accurate dynamic properties for the protein.
- CHARMM22 force field with CMAP gives the experimentally observed  $\alpha$ -helix while without CMAP gives a  $\pi$ -helix for certain model peptides.

H1 H8 
$$\Phi$$
  $\Psi$  || C12 H15 H16 H18