

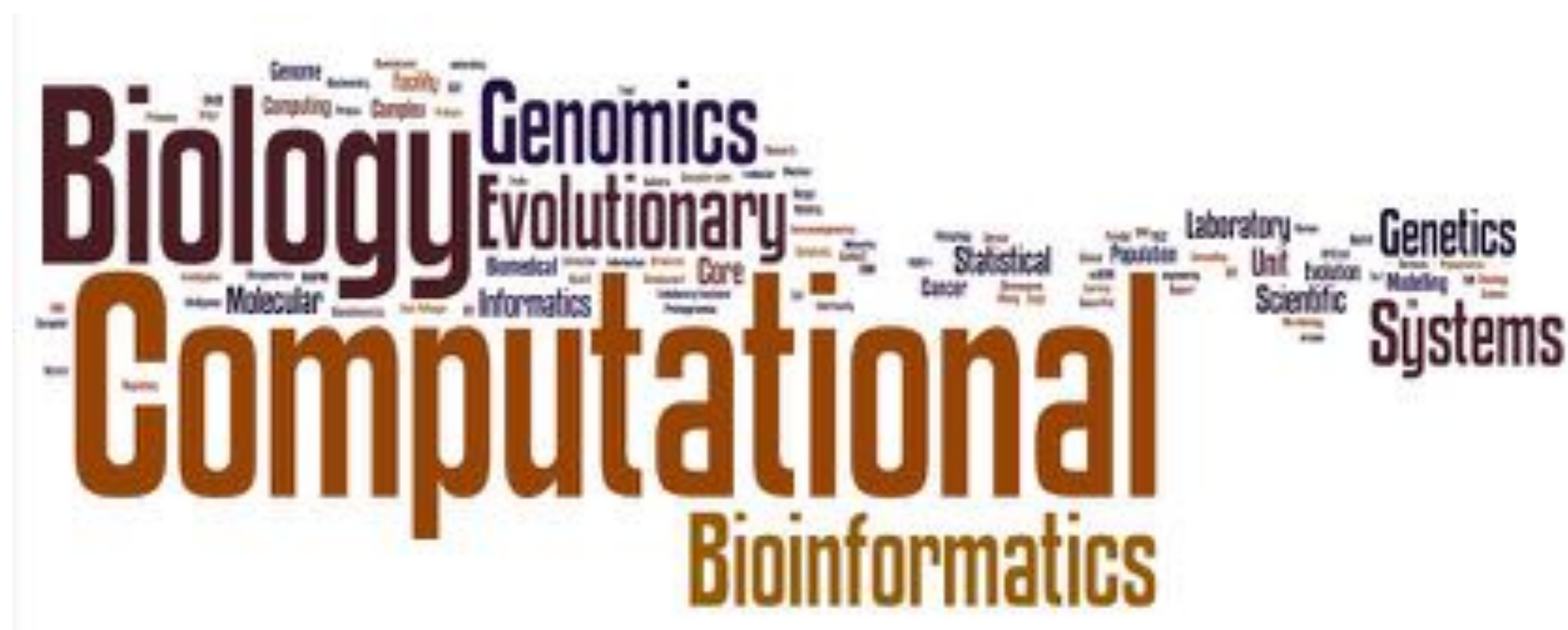
# Молекулярное моделирование в биологии

к.ф.-м.н. Алексей Константинович Шайтан

[alex@intbio.org](mailto:alex@intbio.org)  
<http://intbio.org>

# Вычислительная биология, биоинформатика и молекулярное моделирование, вычислительная химия

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- Computational biology
- Bioinformatics
- Computational chemistry
- (Bio)Molecular modeling

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# 2013 Chemistry Prize



## Taking the Experiment to Cyberspace

The Nobel Prize in Chemistry 2013 was awarded jointly to Martin Karplus, Michael Levitt and Arieh Warshel "for the development of multiscale models for complex chemical systems".

- [Press release](#)
- [Popular information](#)
- [Advanced information](#)



Photo © Harvard University

## Martin Karplus

Martin Karplus, U.S. and Austrian citizen. Born 1930 in Vienna, Austria. Ph.D. 1953 from California Institute of Technology, CA, USA. Professeur Conventionné, Université de Strasbourg, France and Theodore William Richards Professor of Chemistry, Emeritus, Harvard University, Cambridge, MA, USA.

- [More on Martin Karplus](#)



Photo: S. Fisch

## Michael Levitt

Michael Levitt, U.S., British and Israeli citizen. Born 1947 in Pretoria, South Africa. Ph.D. 1971 from University of Cambridge, UK. Robert W. and Vivian K. Cahill Professor in Cancer Research, Stanford University School of Medicine, Stanford, CA, USA.

- [Have a look at Michael Levitt's photo gallery](#)



Photo: Wikimedia Commons

## Arieh Warshel

Arieh Warshel, U.S. and Israeli citizen. Born 1940 in Kibbutz Sde-Nahum, Israel. Ph.D. 1969 from Weizmann Institute of Science, Rehovot, Israel. Distinguished Professor, University of Southern California, Los Angeles, CA, USA.

- [Interviews with Chemistry Laureate Arieh Warshel](#)

# Молекулярное моделирование

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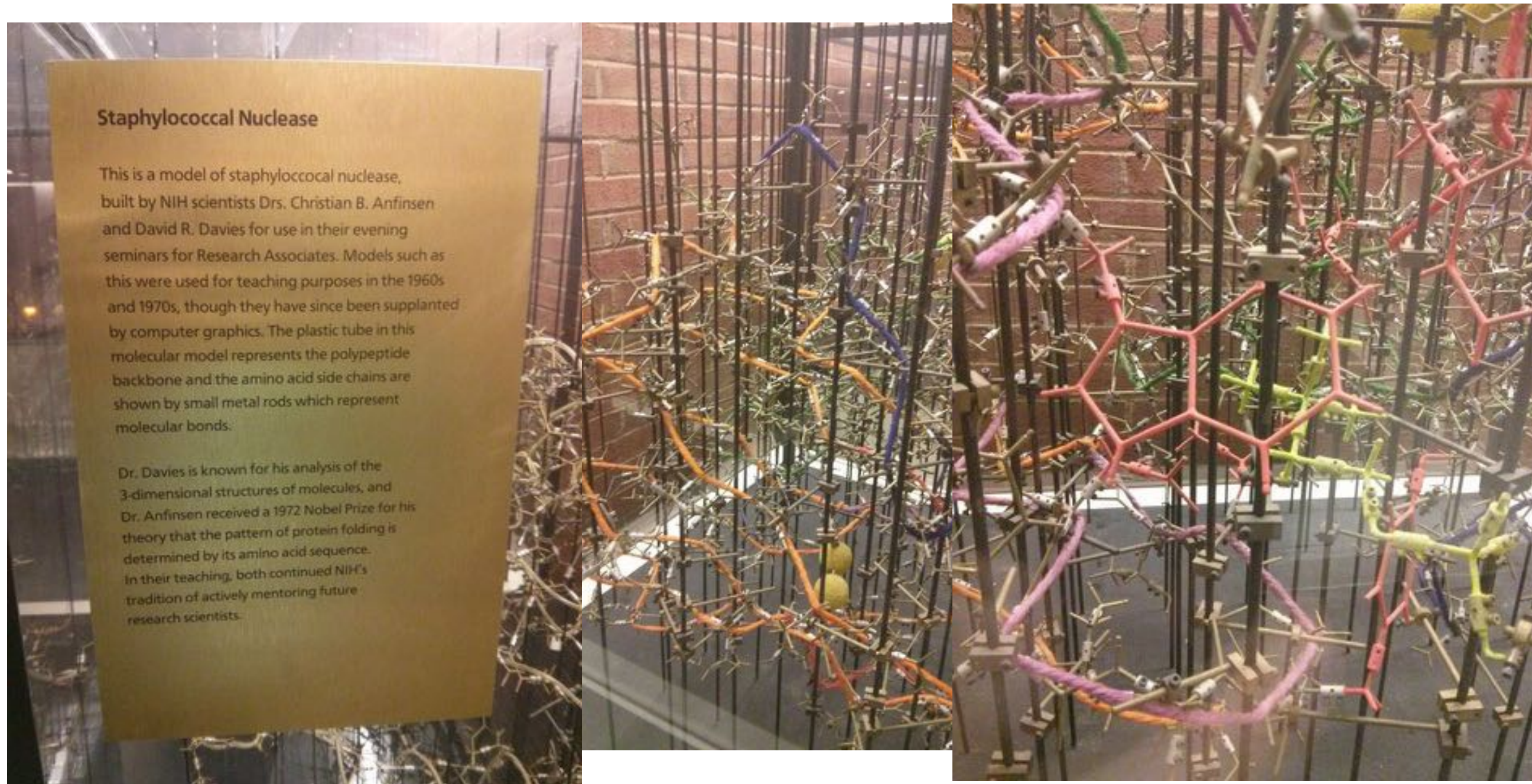
- Построение и изучение моделей молекул с целью понимания их строения, функций, возможности рационального дизайна молекул с заданными свойствами.

«Модель есть абстрактное представление реальности в какой-либо форме (например, в математической, физической, символической, графической или дескриптивной), предназначенное для представления определённых аспектов этой реальности и позволяющее получить ответы на изучаемые вопросы»



# Modeling in pre-computer era ...

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# Молекулярное моделирование

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- Molecular modeling
- Computer simulations
- Molecular simulations

**Modeling and simulation (M&S)** at simple terms is a substitute for physical experimentation, in which computers are used to compute the results of some physical phenomenon.

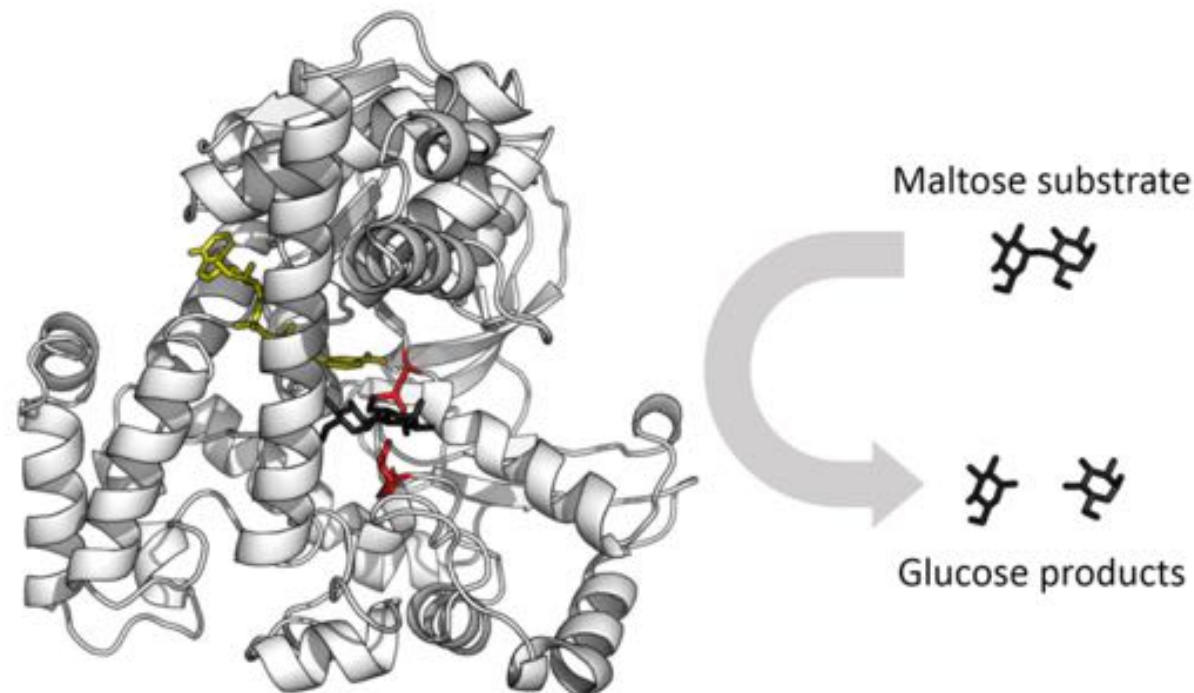
**Computer simulation** is the reproduction of the behavior of a system using a [computer](#) to simulate the outcomes of a [mathematical model](#) associated with said system. Since they allow to check the reliability of chosen mathematical models, computer simulations have become a useful tool for the mathematical modeling of many natural systems in [physics](#) ([computational physics](#)), [astrophysics](#), [climatology](#), [chemistry](#), [biology](#) and [manufacturing](#), human systems in [economics](#), [psychology](#), [social science](#), [health care](#) and [engineering](#).

# Молекулярное моделирование

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Виды моделей:

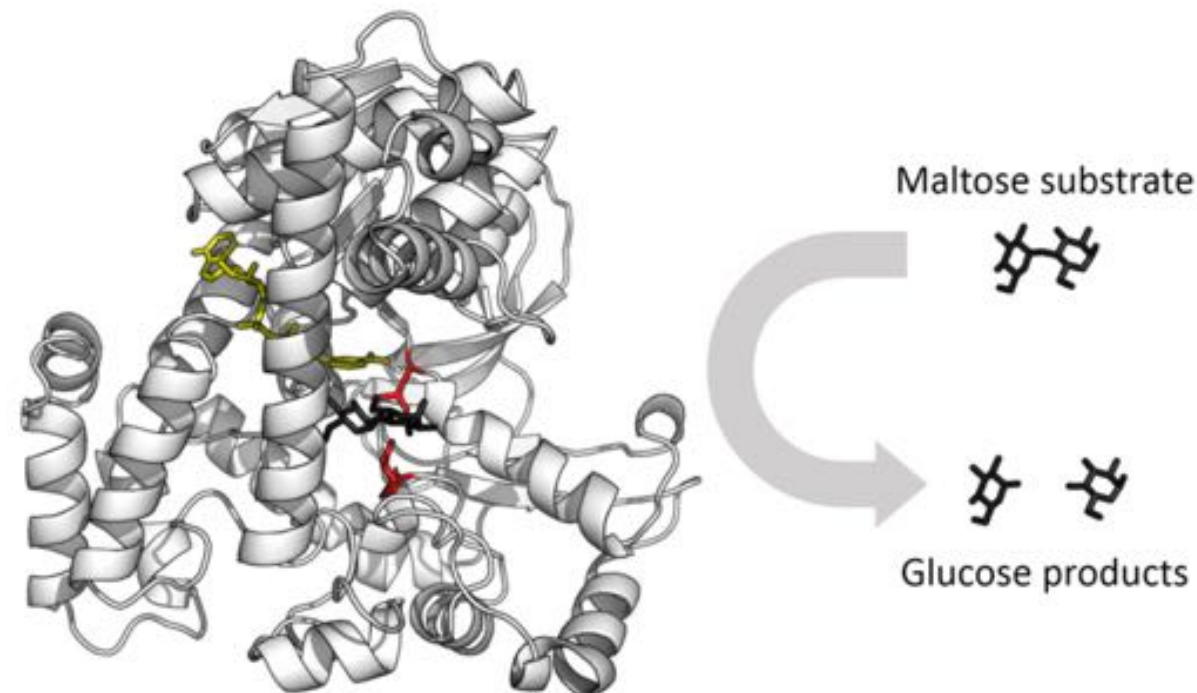
- Структурная – позиции атомов в пространстве.
- Динамическая
- Механическая
- Квантовая
- **Физическая** – учитывает взаимодействия между атомами.
- Компьютерная



# Место молекулярного моделирования в исследованиях

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- Эксперимент не дает нам прямой информации о положении атомов – все наши представления о строении биомолекул – результат построения (компьютерных) моделей, зачастую с использованием *a priori* информации о физических взаимодействиях между атомами.
- Зная физические/эмпирические законы взаимодействия молекул мы можем попробовать предсказать их строение и поведение.





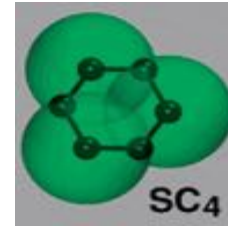
# Modeling at various scales

$$\hat{H}\Psi = E\Psi$$

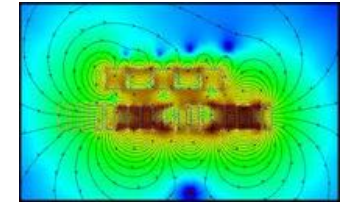
Quantum chemistry

$$\vec{F} = m\vec{a}$$

Molecular mechanics

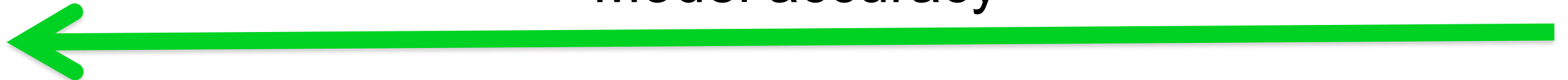


Coarse grain models

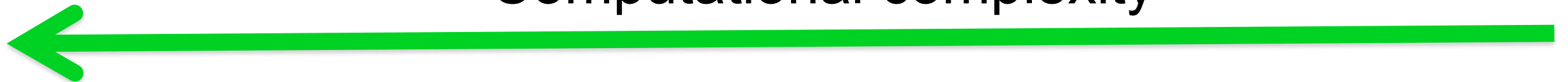


Continuum models

Model accuracy



Computational complexity



Time scales under study

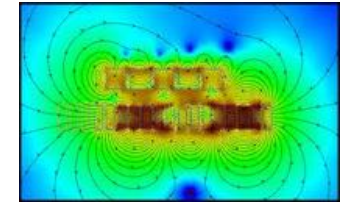
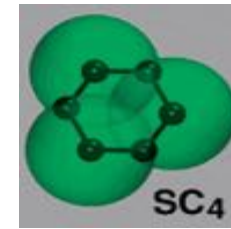


System sizes under study



# “Static” vs “dynamic” modeling

$$\hat{H}\Psi = E\Psi \quad \vec{F} = m\vec{a}$$



Quantum  
chemistry

Molecular  
mechanics

Coarse grain  
models

Continuum  
models

## Static

Electronic structure  
calculations,  
Structure optimization,  
Spectral calculations

Structure optimization,  
Vibration spectra  
calculation

Mechanical properties

## Dynamic

Ab initio molecular  
dynamics,  
Car-Parrinello  
Molecular Dynamics

Molecular dynamics

Coarse grain molecular  
dynamics

Hydrodynamics,  
aerodynamics, heat  
transfer, diffusion, etc.

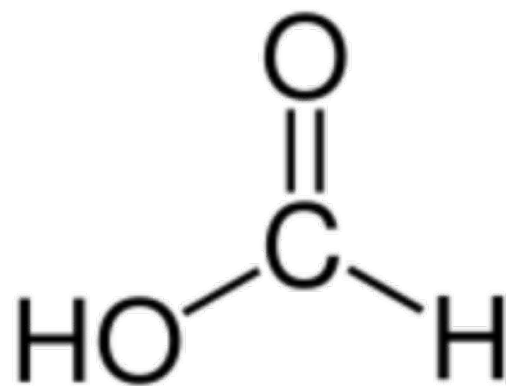
Dynamics: how things change with time?

# MD basic idea in a nutshell

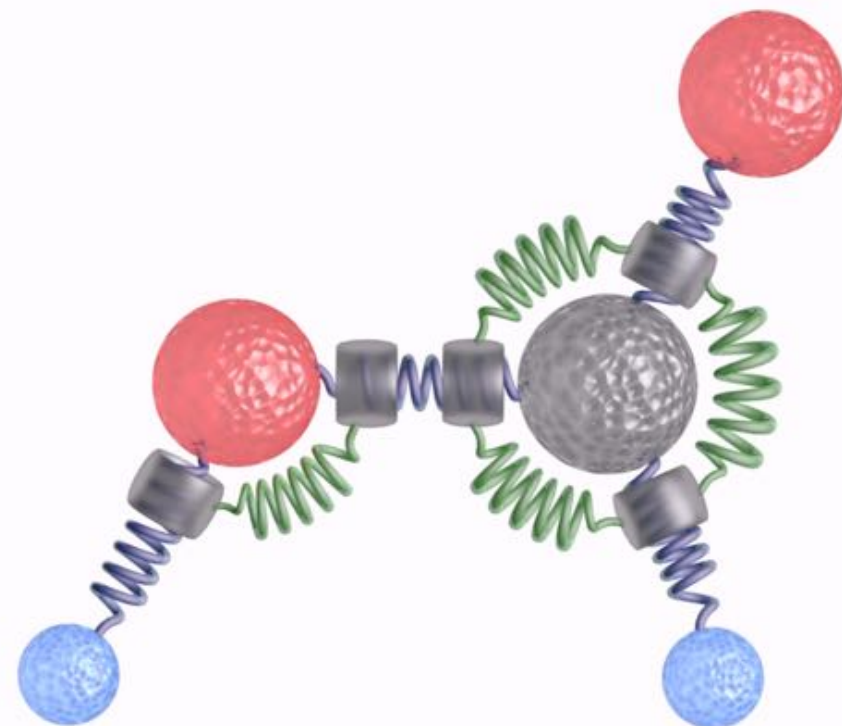
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- Use classical mechanics to represent atoms and their interactions

$\vec{F} = m * \vec{a}$  - Newton's second law links force and acceleration

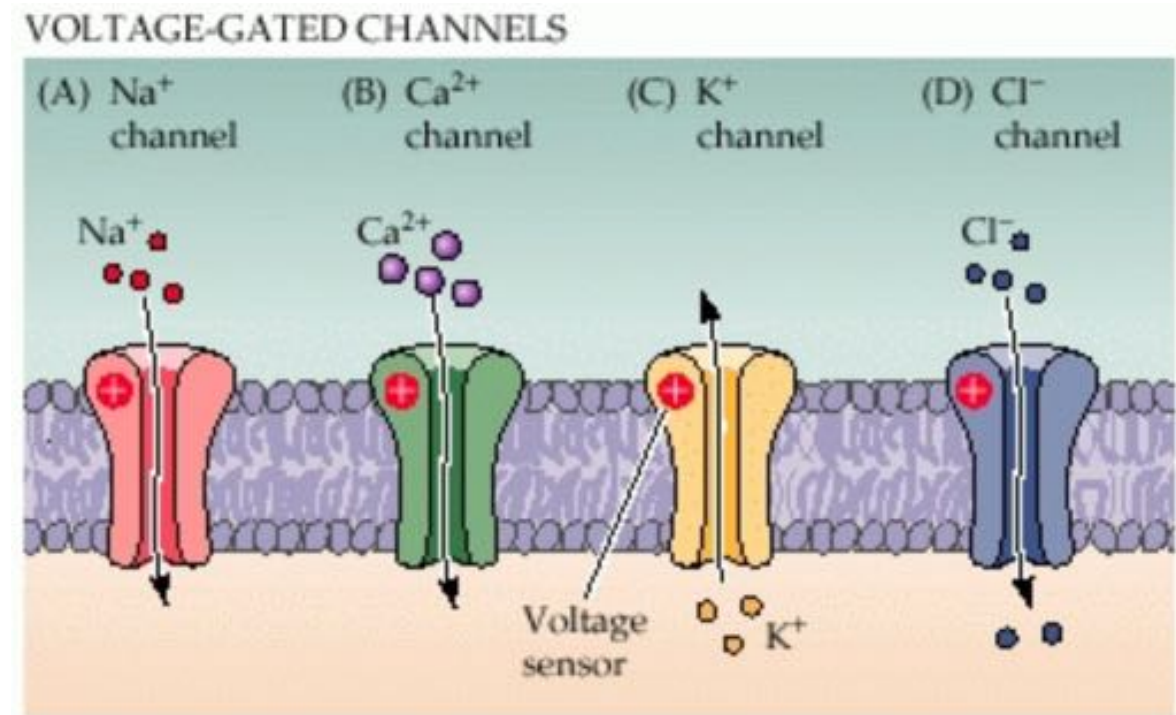
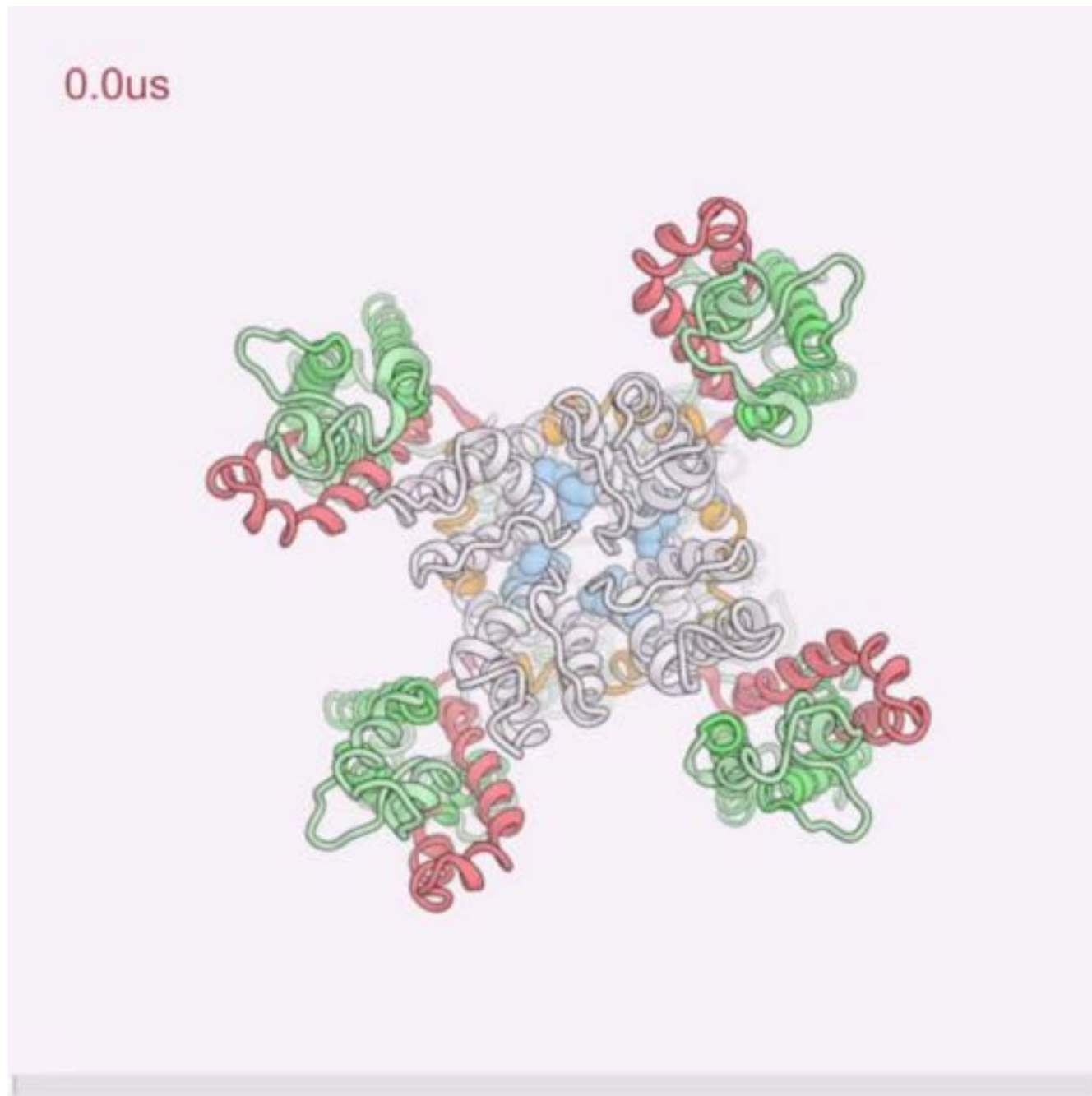


**Formic acid**





# Example: switching of an ion channel



Neuroscience. 2nd edition.  
Purves D, Augustine GJ, Fitzpatrick D, et al., editors.  
Sunderland (MA)

Potassium voltage gated  
channel

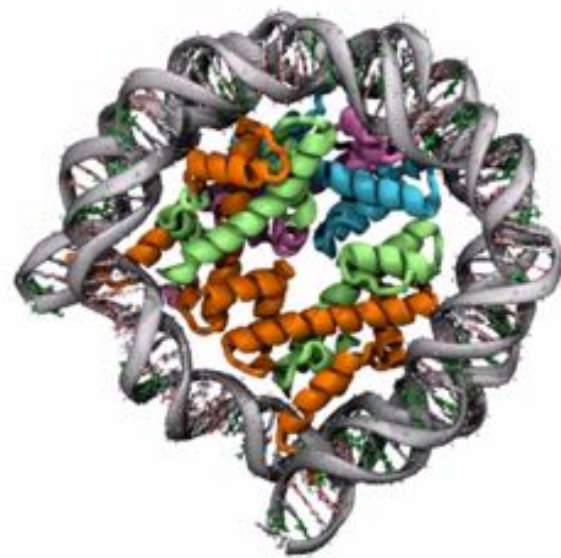
Simulation details:

~250  $\mu$ s

~200 000 atoms

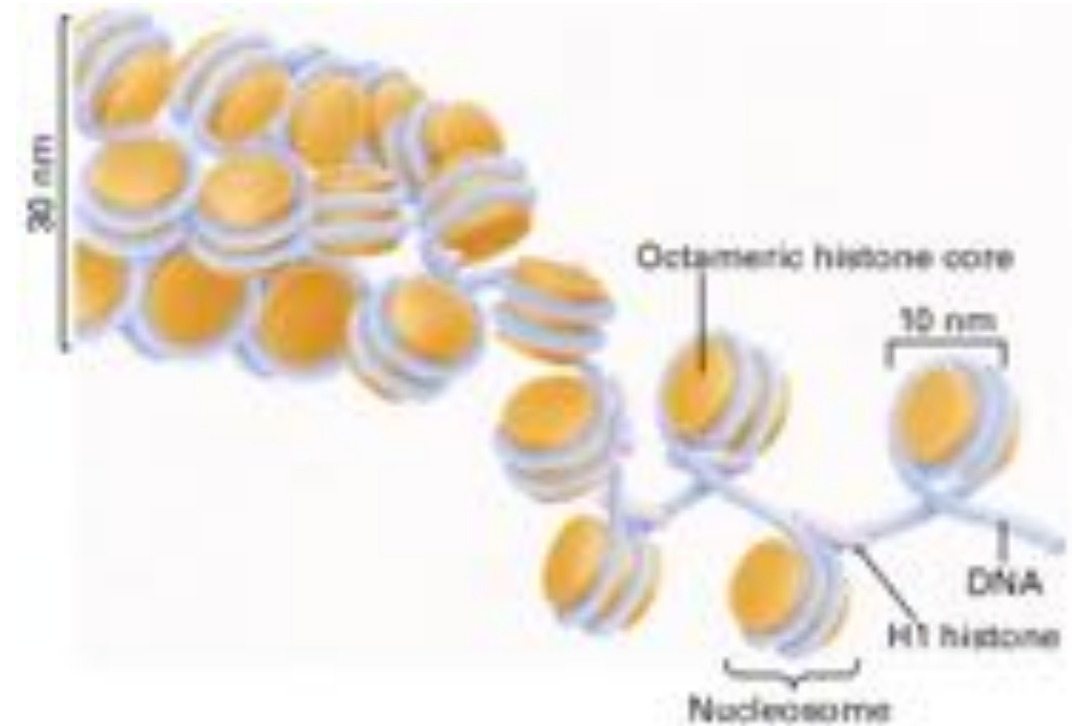
Science 2012, Morten Ø. Jensen et al.  
“Mechanism of Voltage Gating in  
Potassium Channels”

# Example 2: DNA packing in nucleosomes



Time 0.0 ns

Unwrapping of DNA from nucleosome



Solenoid model of the 30-nm condensed chromatin fiber in a side view

Molecular Cell Biology, 4th edition.  
Lodish H, Berk A, Zipursky SL, et  
al.  
New York: W. H. Freeman; 2000.

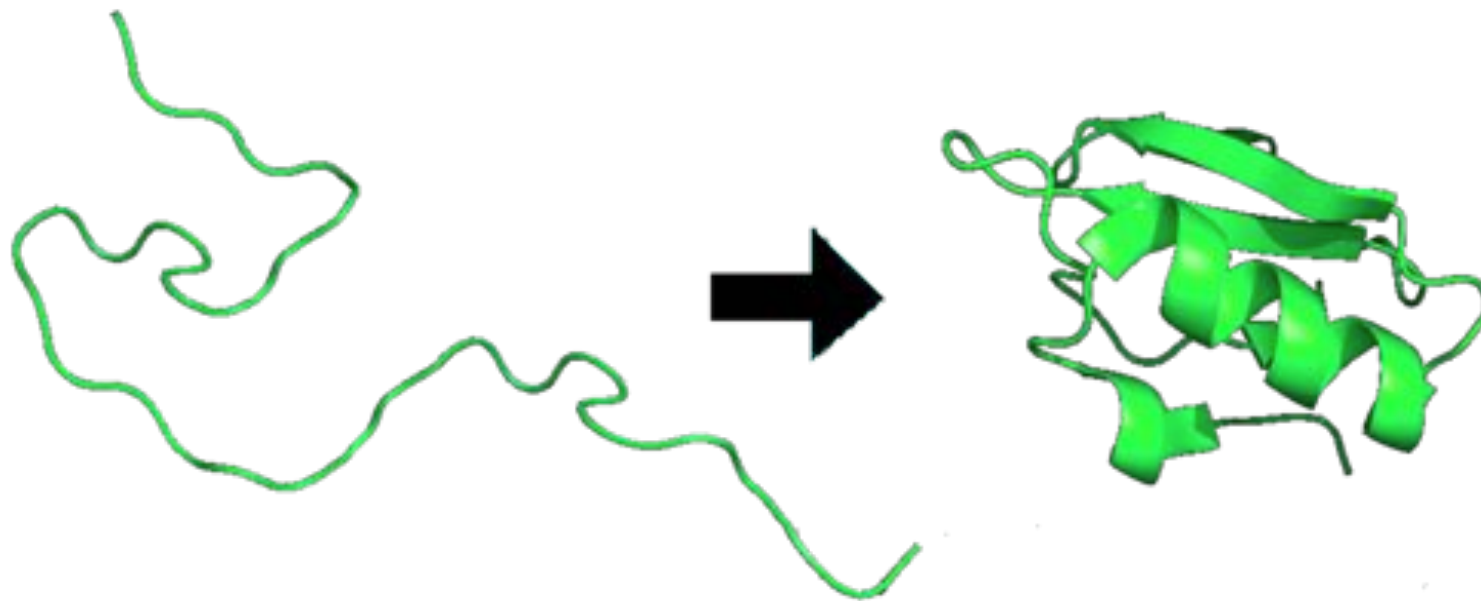
Simulation details:  
~300 000 atoms

# When and why use MD?

---

- MD as “computational microscope”
- Ultimate, but tough goal :

given the sequence -> simulate protein folding -> simulate function – **not practically feasible!**



- Need experimental 3D structure of protein to start with.
- Where to get it? => experiment or homology modeling



# Time scales of protein motions

Simulation MD steps  
time,  
approx.

Inf.

$10^{15}$

s

Allosteric transitions

Local denaturations

250 years

$10^{12}$

ms

Buried sidechain rotations

100 days

$10^9$

$\mu$ s

0.1 day

$10^6$

ns

Hinge bending

Surface sidechain rotation

Elastic vibrations

$10^3$

ps

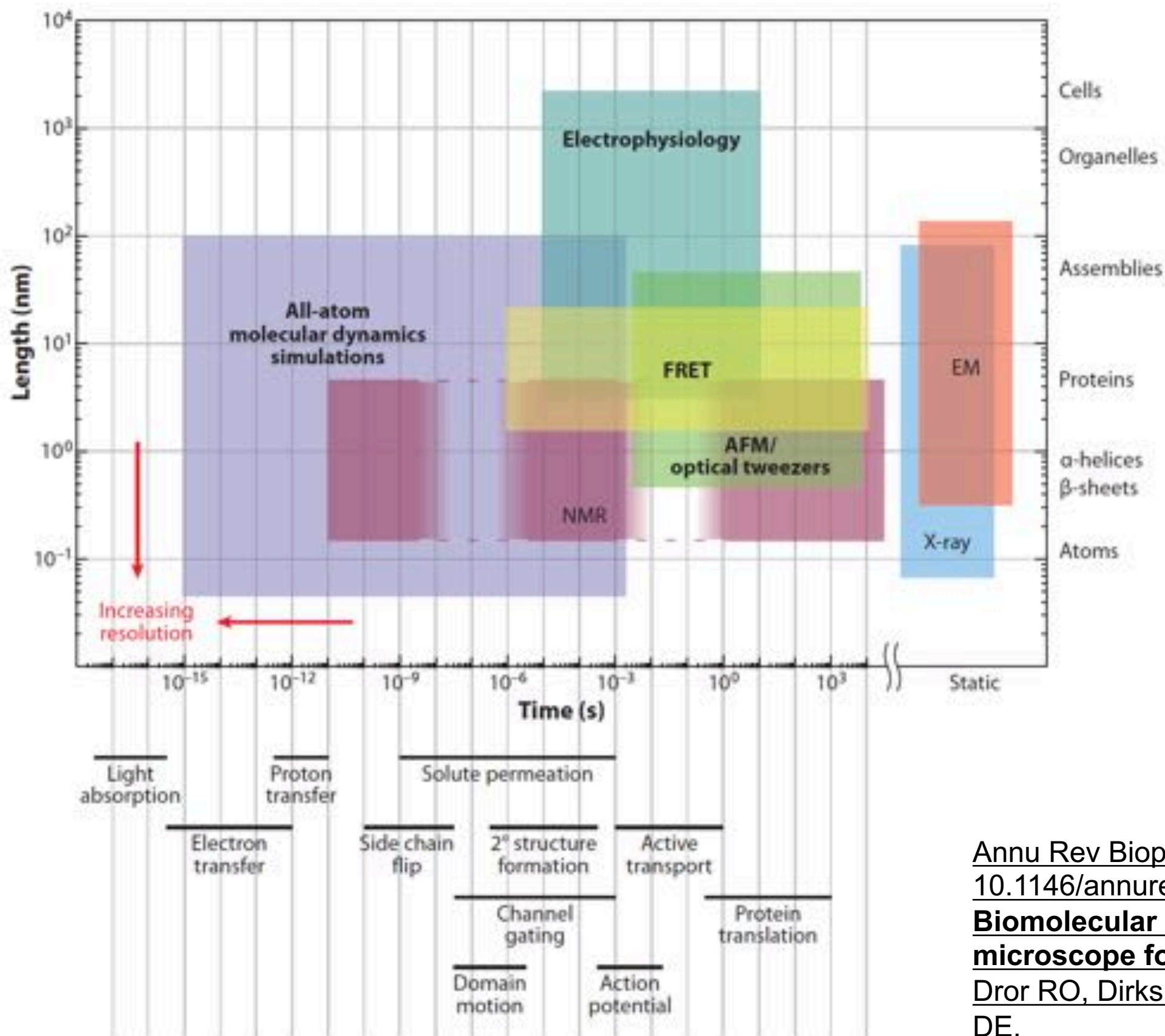
Bond stretching

MD time step

1

fs

# When and why use MD?



Annu Rev Biophys. 2012;41:429-52. doi:  
 10.1146/annurev-biophys-042910-155245.  
**Biomolecular simulation: a computational  
 microscope for molecular biology.**  
 Dror RO, Dirks RM, Grossman JP, Xu H, Shaw  
 DE.

# Basic theory behind MD simulations

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- Physical laws and approximations
- Classical force fields
- Numerical integration, integration step and timescales



# From quantum to classical

Feasible for 3 atoms

$$i\hbar \frac{\partial}{\partial t} \Psi = \hat{H} \Psi$$

Time dependent non-relativistic  
Schrödinger equation

$\Rightarrow$

$$\Psi_{\text{total}} = \psi_{\text{electronic}} \times \psi_{\text{nuclear}}$$

Born-Oppenheimer approx.,  
Separate nuclei motion from  
electronic

(not valid for photochemical  
reactions, charge transfer)

$\Downarrow$

Assume classical motion  
of nuclei on electronic  
potential energy surface

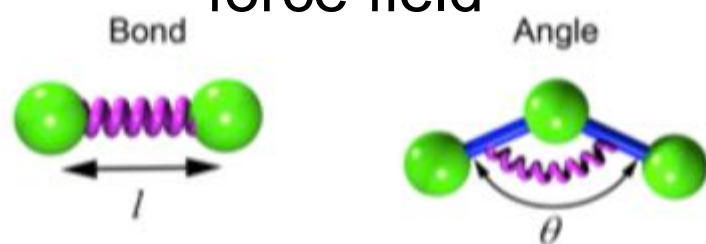
$\Leftarrow$

$$\vec{F} = m * \vec{a}$$

Newton's second law

Feasible for millions to  
billions of atoms

Construct empirical  
approximate  
force field



Usually very simply, no bond breaking,  
ground state, pairwise interactions

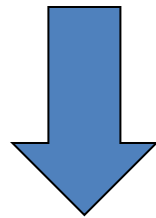
Not true for motions faster than 100 fs  
(bond, angle vibrations), no tunneling, no  
proton hopping

# What to expect/not expect from MD?

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No, per se:

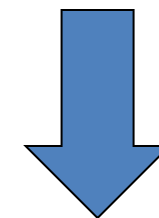
- 1) Chemical reactions
- 2) Protonation/deprotonation
- 3) Charge transfer
- 4) Excited states



Although possible with various hybrid methods: ab initio MD, QM/MM, etc.

Yes, if sufficient time and force field accuracy:

- 1) Conformational motions
- 2) Allosteric transitions
- 3) Ligand non covalent binding
- 4) Diffusion



Where equilibrium dynamics appears to be too short, advanced sampling methods exist: umbrella sampling, meta dynamics, etc.

# Mechanics: main concepts

---

$$\vec{F} = m * \vec{a}$$

Newton's II law

$$\vec{a} = \frac{d\vec{v}}{dt} = \frac{d^2\vec{r}}{dt^2}$$

Differential form

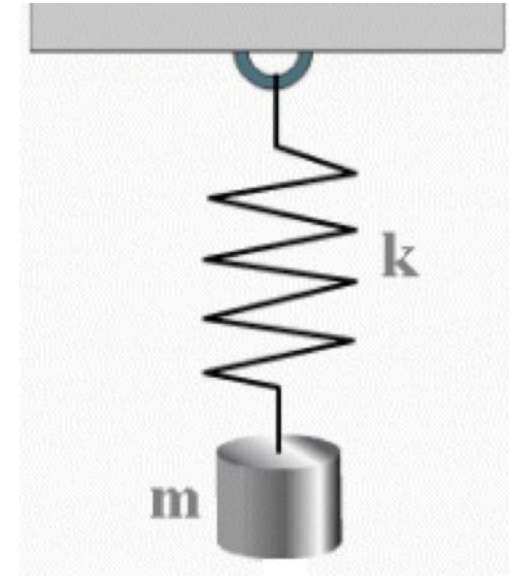
$$\frac{d^2\vec{r}}{dt^2} = \vec{F}/m$$

$$\vec{F} = -grad(U)$$

Potential energy

$$H = T + U$$

Total energy,  
or Hamiltonian



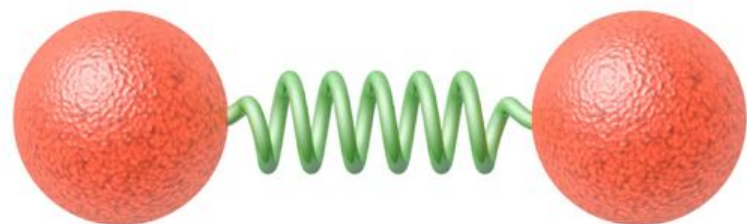
$$U = \frac{kx^2}{2}$$

$$T = \frac{mv^2}{2}$$

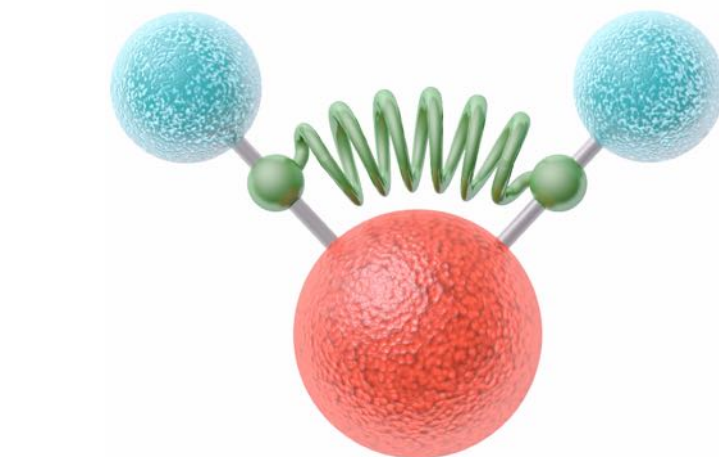


# Typical biomolecular force field, p. 1

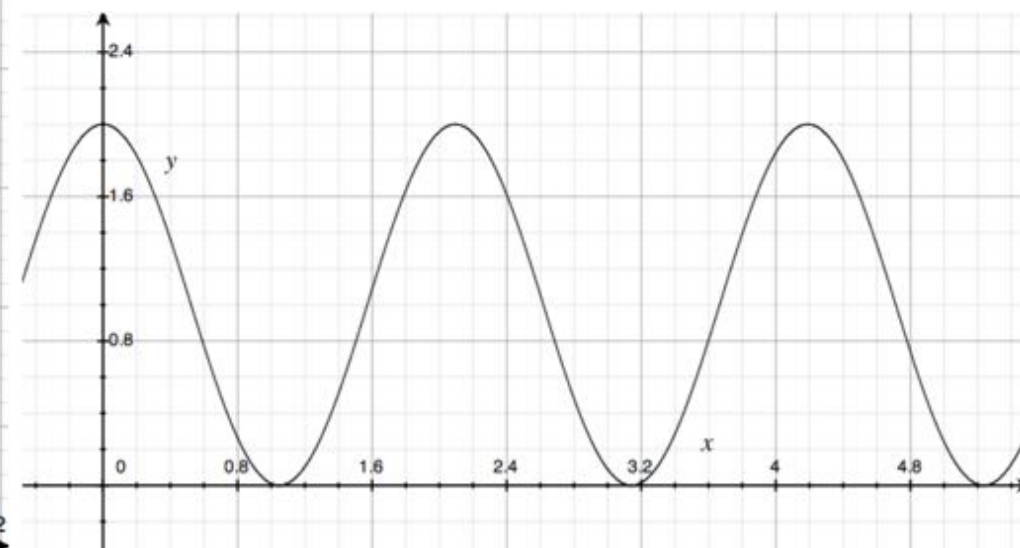
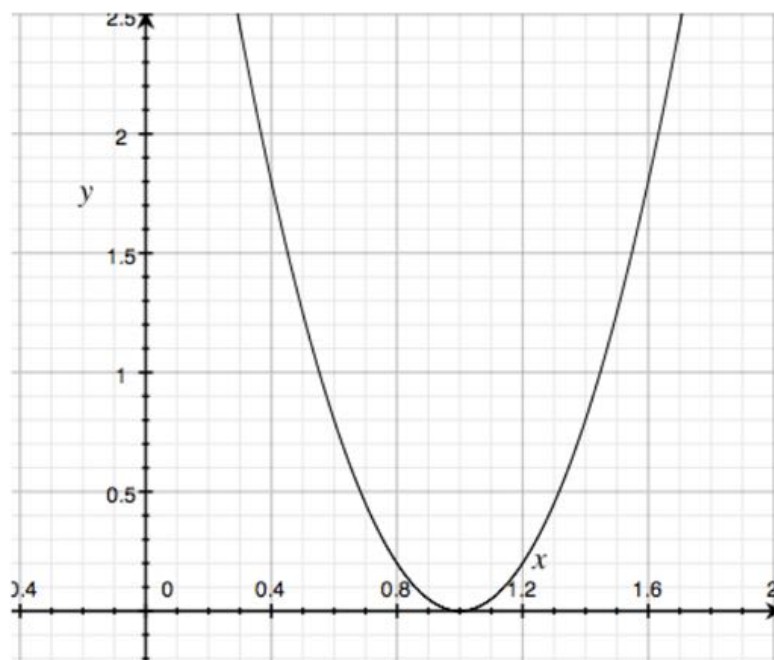
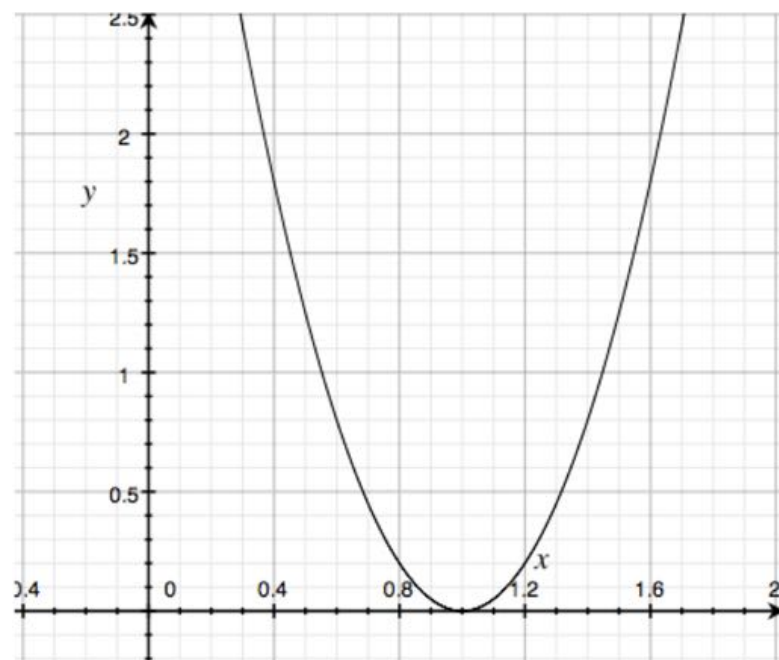
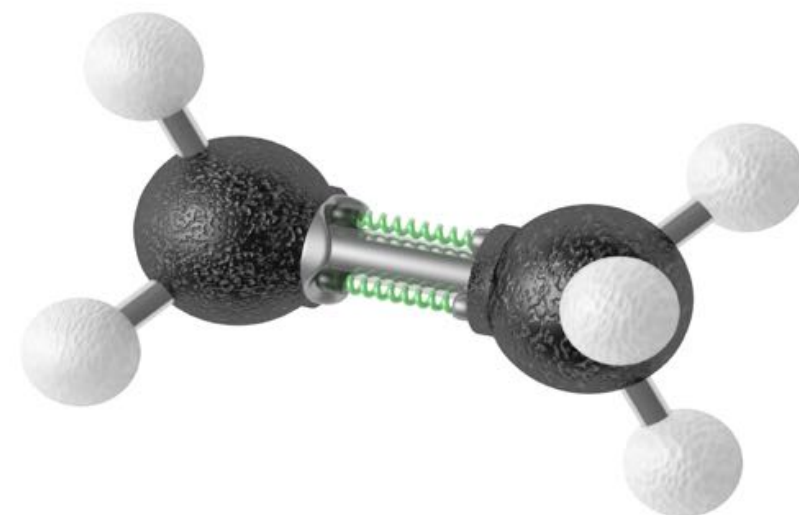
## Bonded terms



$$U_{bond} = \frac{k_b(l - l_0)^2}{2}$$



$$U_{ang} = \frac{k_a(\theta - \theta_0)^2}{2} \quad U_{tor} = V[1 + \cos(n\phi - \phi_0)]$$

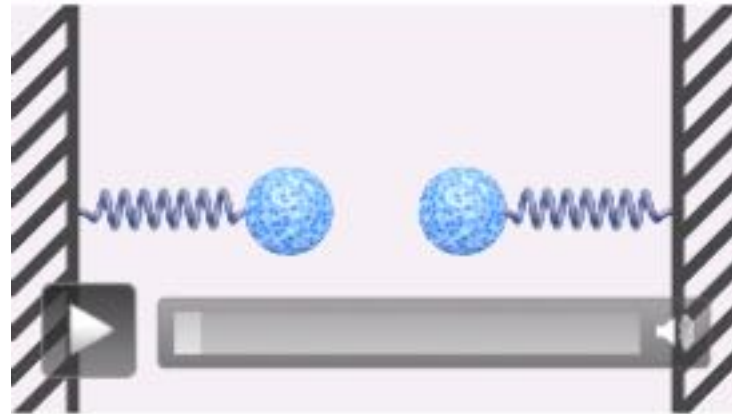


# Typical biomolecular force field, p.2

Electrostatic  
(Coulomb)

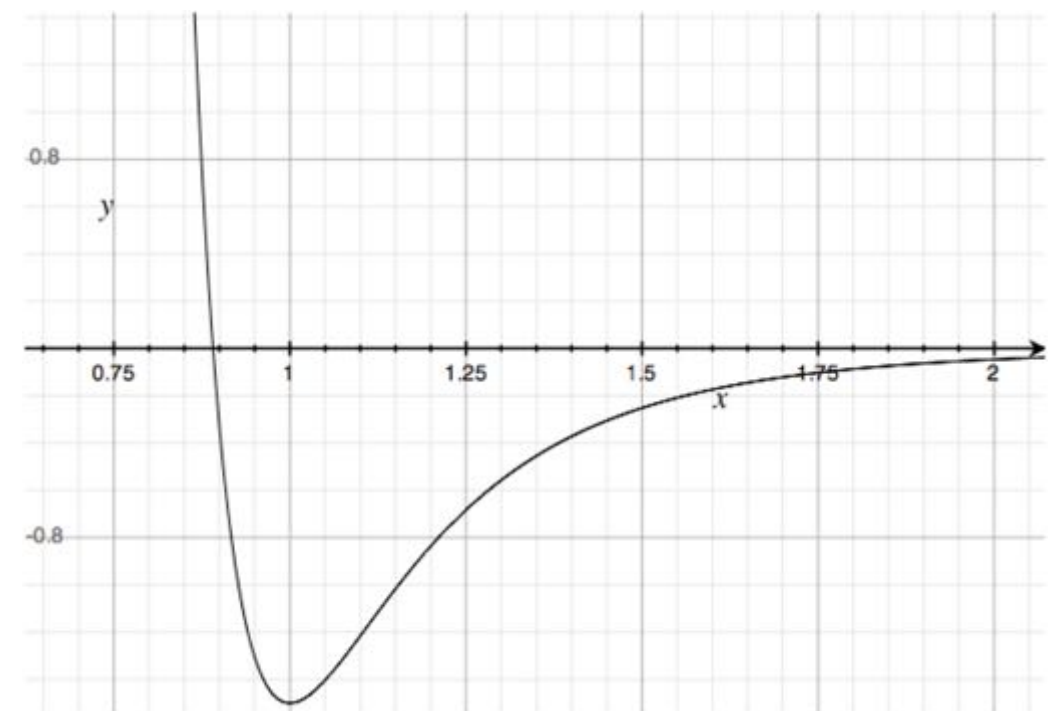
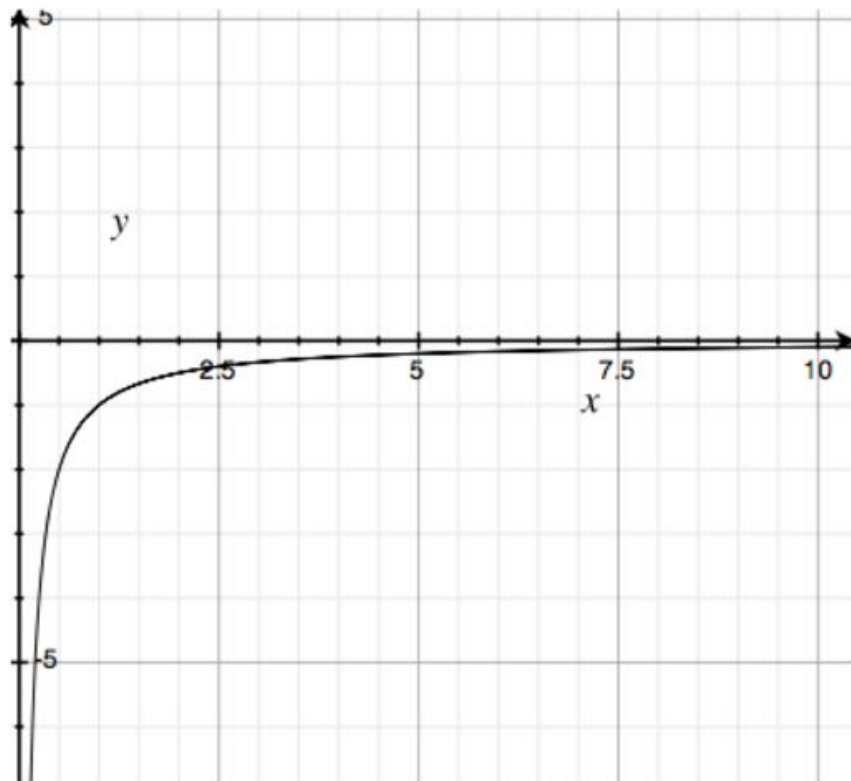
$$U_q = \frac{q_i q_j}{r}$$

Non-bonded terms

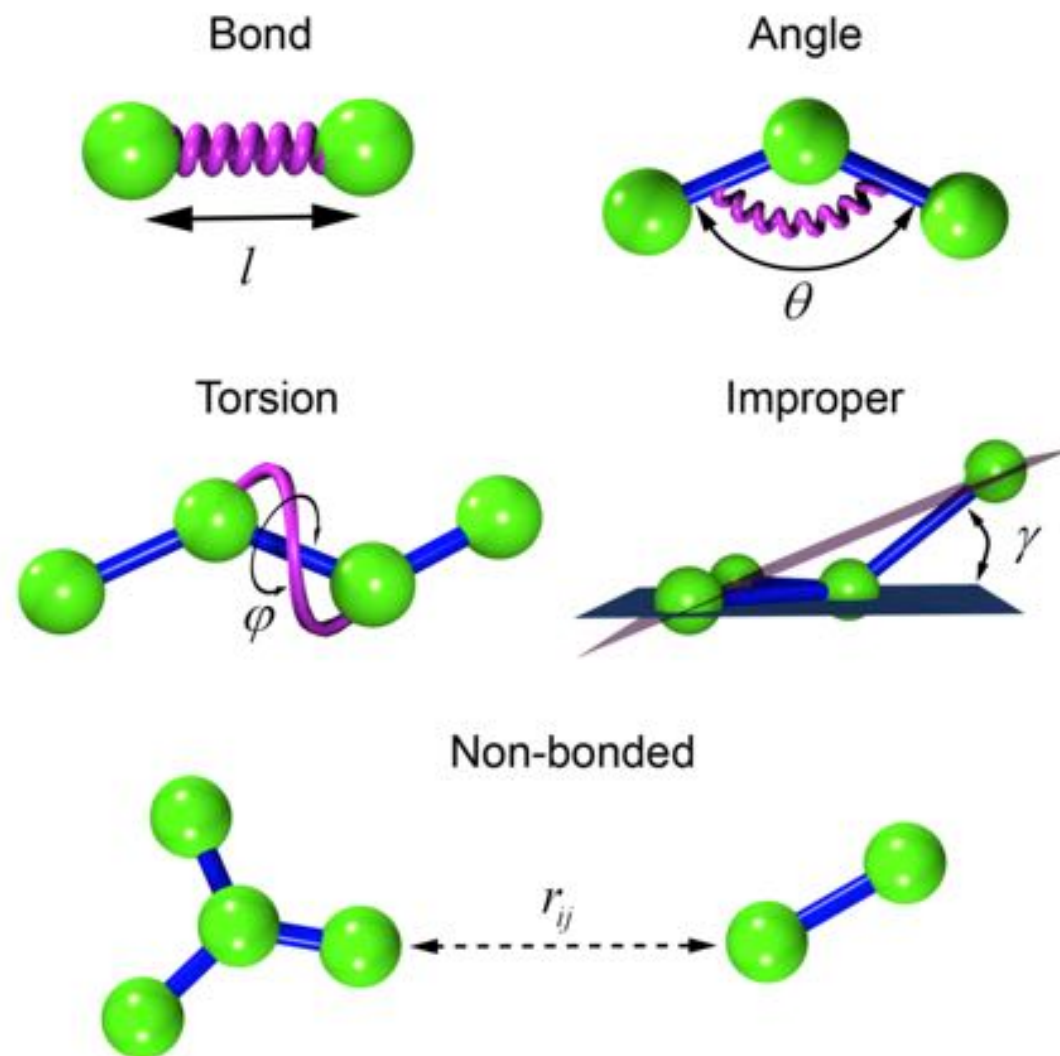


Lennard-Jones  
potential

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



# Typical biomolecular force field, p. 3



$$\begin{aligned}
 U(\{\vec{r}_i\}) = & \sum_{\text{bonds}} \frac{1}{2} k_b (l - l_0)^2 + \sum_{\text{angles}} \frac{1}{2} k_\theta (\theta - \theta_0)^2 + \sum_{\text{torsions}} \frac{1}{2} V_n [1 + \cos(n\varphi - \varphi_0)] \\
 & + \sum_{\text{impropers}} \frac{1}{2} k_\gamma (\gamma - \gamma_0)^2 + \sum_{j=1}^{N-1} \sum_{i=j+1}^N \left\{ 4\epsilon_y \left[ \left( \frac{\sigma_y}{r_{ij}} \right)^{12} - \left( \frac{\sigma_y}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}} \right\} f_{ij}
 \end{aligned}$$

# Common force fields

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## **For biomolecules:**

CHARMM, AMBER, GROMOS, OPLS

Satellite general force fields (for ligands):

GAFF (for amber), GenFF (for charmm)

## **Corresponding water models:**

TIP3P, SPC, TIP4P, TIP5P, SPCE/e, TIP4P-Ew, etc.

Many other force fields exist for other/ special purposes: e.g. CLASS 2 force fields (PCFF,COMPASS), polarizable force fields, reactive force fields (ReaxFF), coarse grain (MARTINI), united atom variations of AMBER and CHARMM, etc.

When choosing a force field it is better to consult original references!

# How to get atoms moving?

---

$$\frac{d^2\vec{r}}{dt^2} = \vec{F}/m \quad \text{Newton's II law is differential equation}$$

Solve it numerically!

Integrate it using a discrete time step!

$$\left\{ \begin{array}{l} \frac{d\vec{r}_i}{dt} = \vec{v}_i \\ \frac{d\vec{v}_i}{dt} = \vec{F}_i/m_i \end{array} \right. \Longrightarrow \left\{ \begin{array}{l} \frac{\vec{r}_i(t+\Delta t) - \vec{r}_i(t)}{\Delta t} = \vec{v}_i \\ \frac{\vec{v}_i(t+\Delta t) - \vec{v}_i(t)}{\Delta t} = \vec{F}_i(t)/m_i \end{array} \right.$$

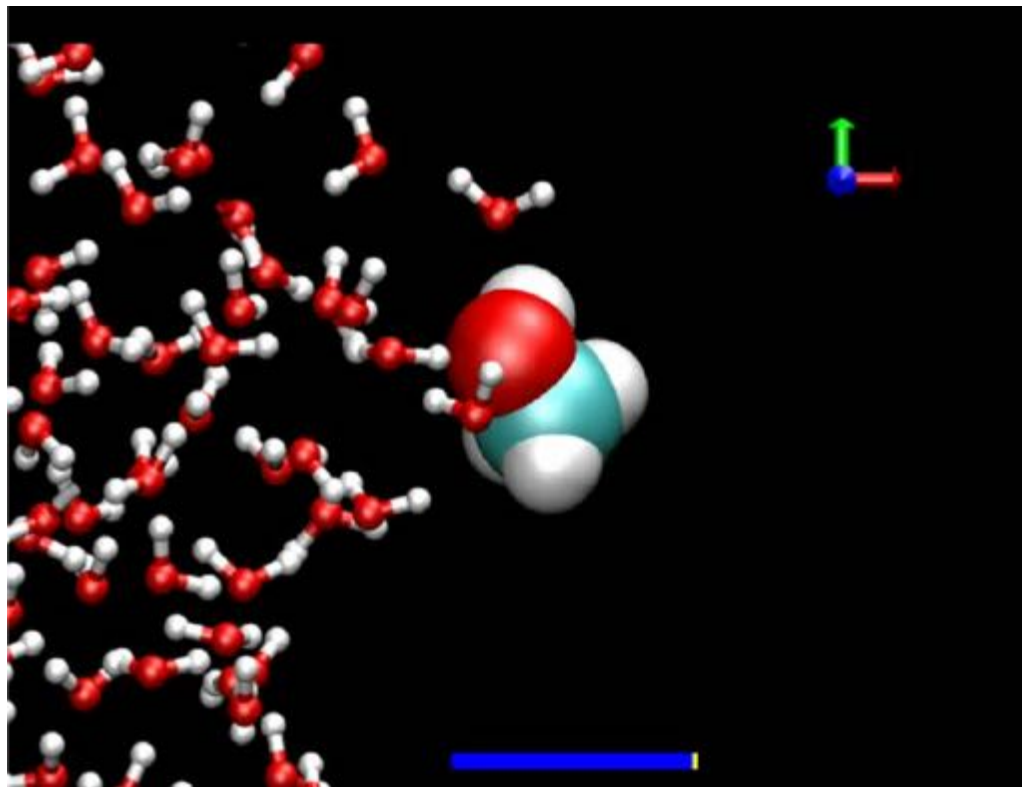


# Velocity Verlet integration scheme

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(leap frog algorithm)

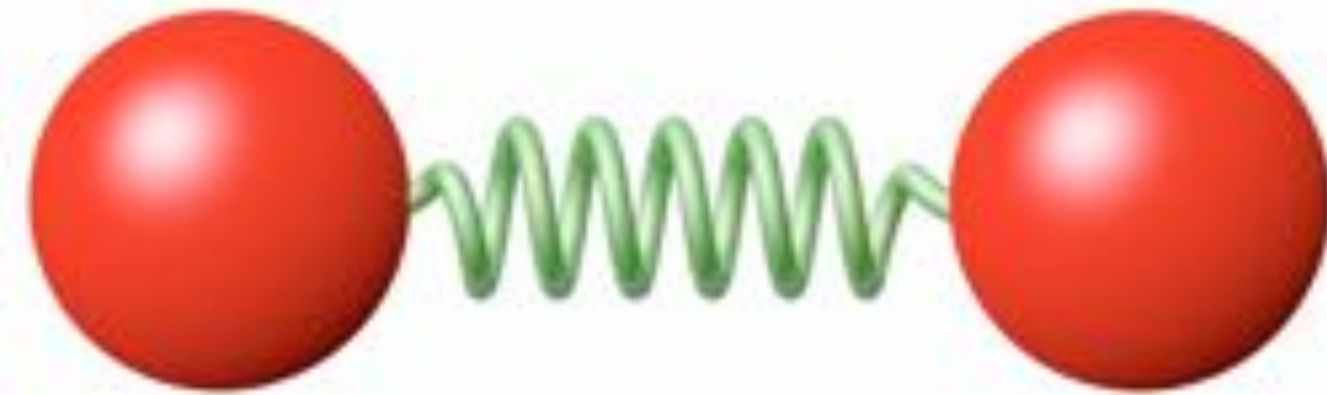
$$\begin{cases} \vec{r}_i(t + \Delta t) = \vec{r}_i(t) + \vec{v}_i(t) \Delta t + \frac{1}{2} \vec{a}_i \Delta t^2 \\ \vec{v}_i(t + \Delta t) = \vec{v}_i(t) + \frac{\vec{a}_i(t) + \vec{a}_i(t + \Delta t)}{2} \Delta t \end{cases}$$



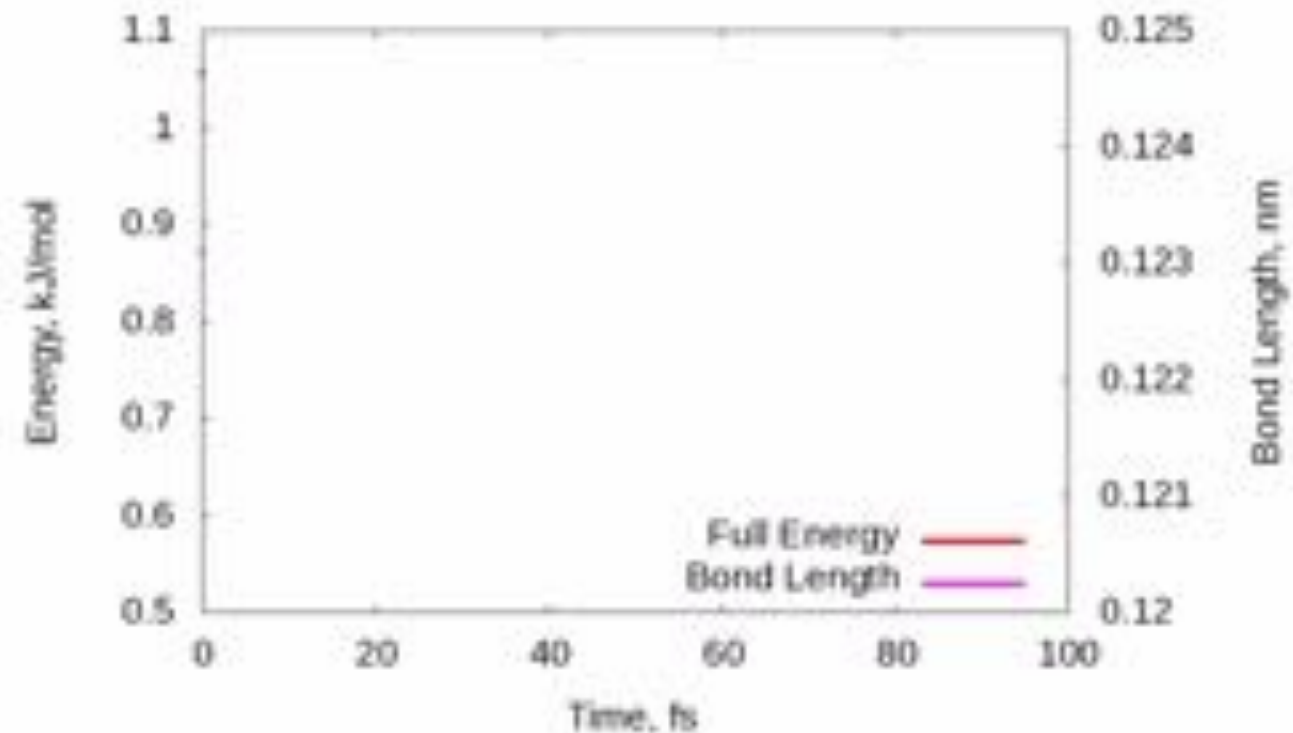
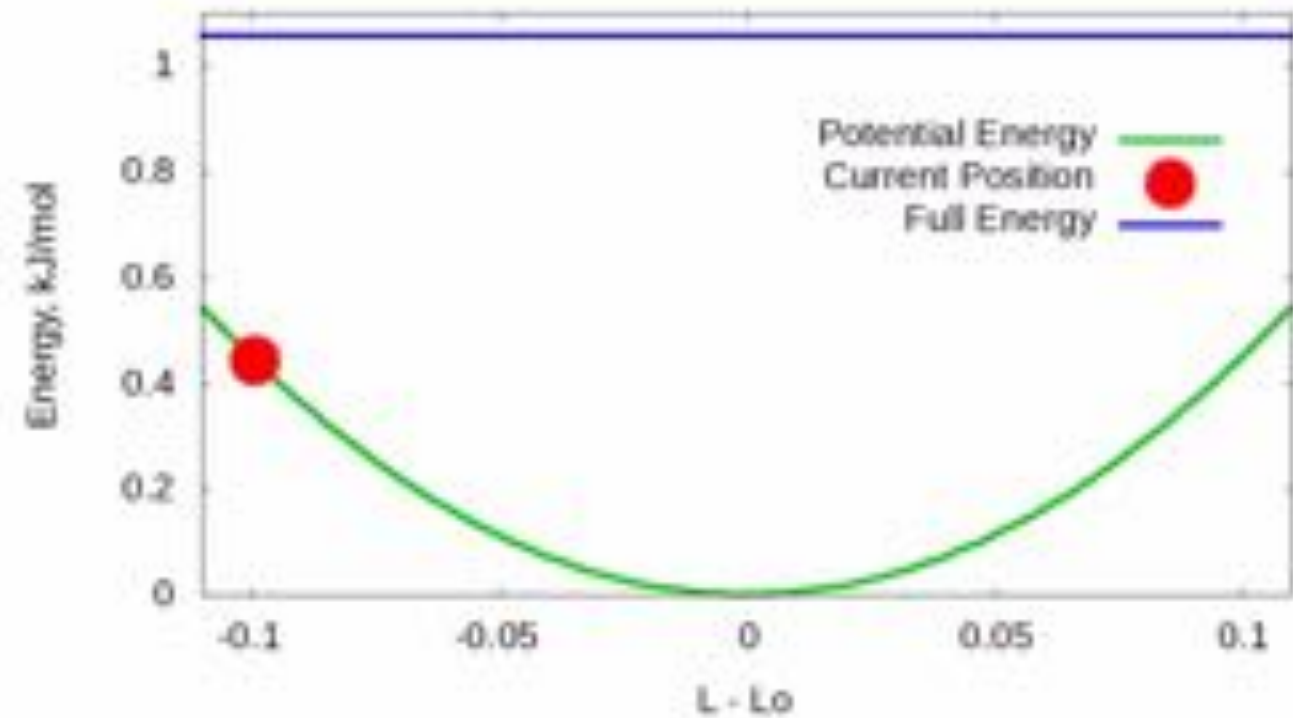
Example of MD simulation

- No long term energy drift (except for rounding errors)
- Nice stability
- Time reversible
- Global error of order  $O(t^2)$

# Close look at simple MD simulation



Oxygen molecule  
NVE simulation  
Leap-frog integrator  
Integration step 1 fs



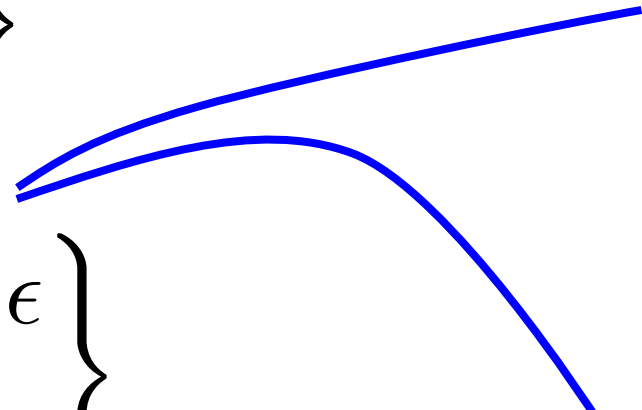
# Is MD trajectory close to real one?

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On short time scale – probably.

On long time scale – fundamentally not possible!

Lyapunov instability  
of particle trajectories


$$\begin{Bmatrix} \vec{v}_i^0 \\ \vec{r}_i^0 \end{Bmatrix}$$
$$\begin{Bmatrix} \vec{v}_i^0 + \epsilon \\ \vec{r}_i^0 + \epsilon \end{Bmatrix}$$

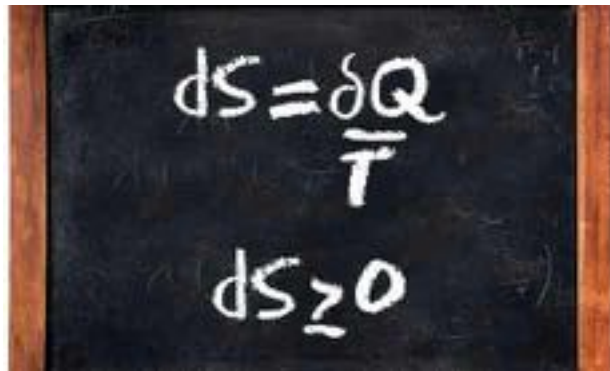
The system is chaotic!

Infinitesimal  
differences in initial  
conditions may drive  
system to different  
states!

View MD as a statistical method – averages and evolution of averages are only meaningful on long time scale.

# «Философское» отступление 1

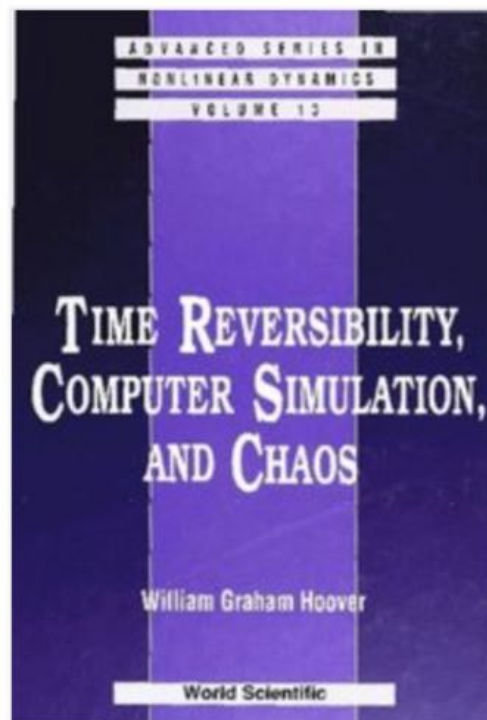
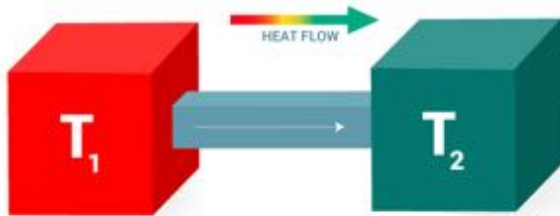
2 закон термодинамики vs 2 закон Ньютона



$$\vec{F} = m * \vec{a}$$

$$\vec{a} = \frac{d\vec{v}}{dt} = \frac{d^2\vec{r}}{dt^2}$$

LAWS OF THERMODYNAMICS





# «Философское» отступление 2

## Демон Лапласа

Мы можем рассматривать настоящее состояние Вселенной как следствие его прошлого и причину его будущего. Разум, которому в каждый определённый момент времени были бы известны все силы, приводящие природу в движение, и положение всех тел, из которых она состоит, будь он также достаточно обширен, чтобы подвергнуть эти данные анализу, смог бы объять единым законом движение величайших тел Вселенной и мельчайшего атома; для такого разума ничего не было бы неясного и будущее существовало бы в его глазах точно так же, как прошлое.

В философии с давних пор ведётся спор о существовании свободы воли, её определении и природе. Существуют две противоположные позиции:


- **метафизический либертарианизм** — утверждение, что **детерминизм** неверен и, таким образом, свобода воли существует или по меньшей мере возможна,
- **жёсткий детерминизм** — утверждение о том, что детерминизм верен и свободы воли не существует.

Пьер-Симон де Лаплас

Pierre-Simon de Laplace



Лаплас в мундире канцлера Сената. Фрагмент портрет кисти Жана-Батиста Герена, 1838

Дата рождения	23 марта 1749
Место рождения	Бомон-ан-Ож, Нормандия
Дата смерти	5 марта 1827 (77 лет)
Место смерти	Париж
Страна	 Франция
Научная сфера	математика, механика, физика, астрономия



# Common MD techniques

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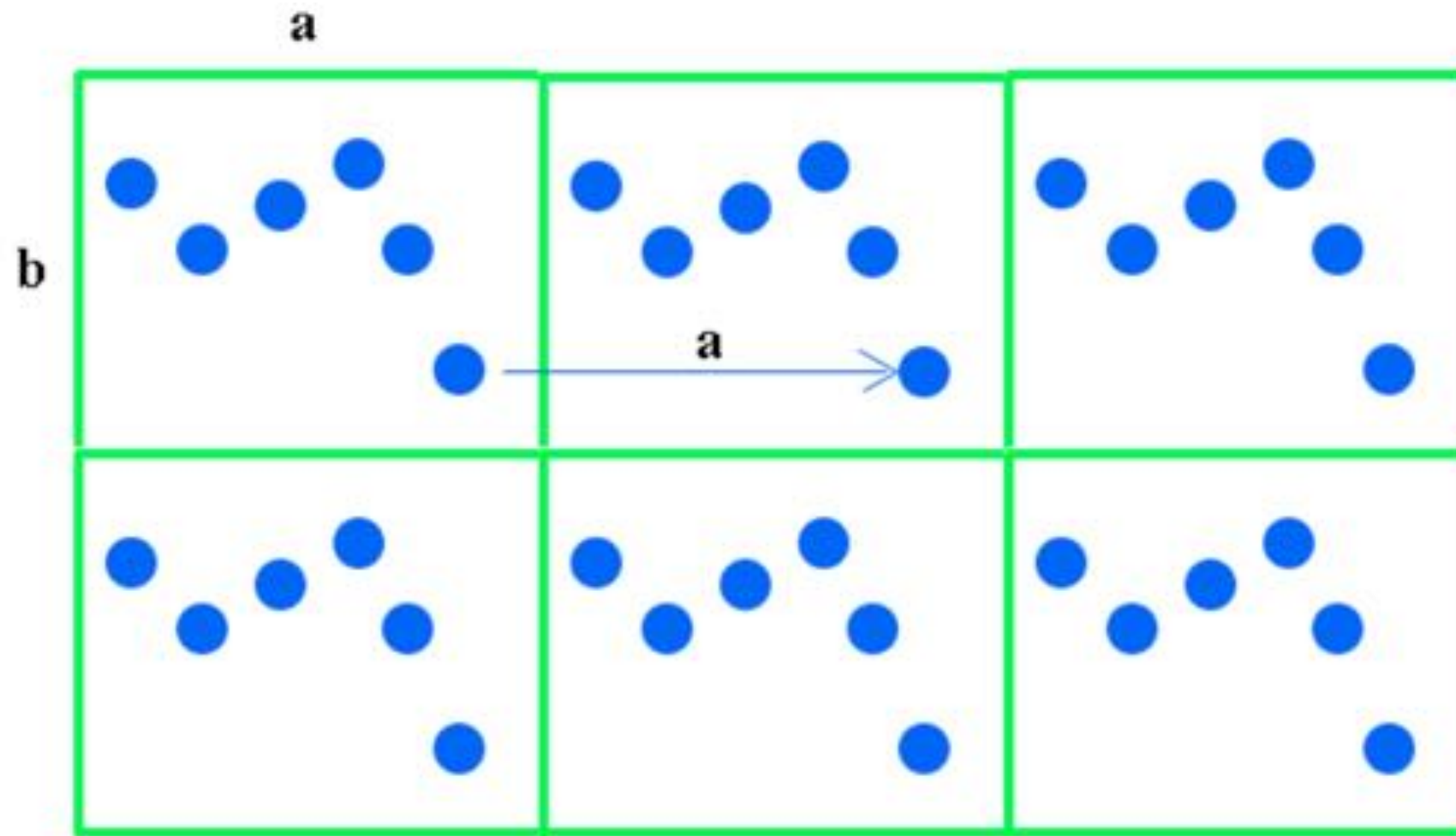
Needed almost in every simulation

- Periodic boundary conditions
- Interaction cut off
- Electrostatics
- Constant temperature/pressure simulations
- Rigid bonds
- Parallelization and HPC computing

# Periodic boundary conditions

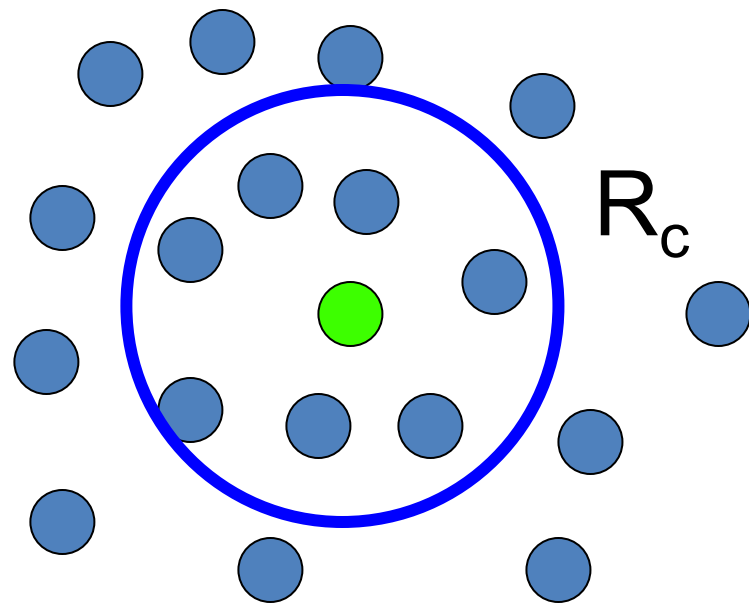
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A trade off to alleviate boundary effects



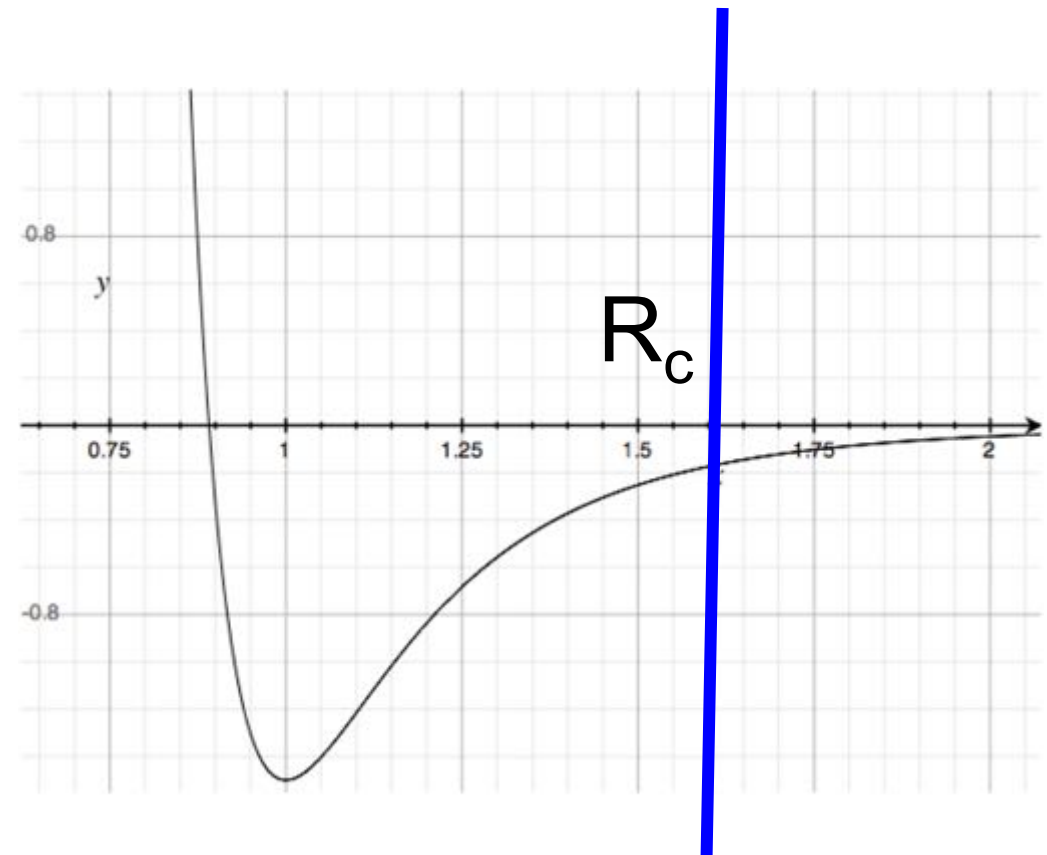
$$\vec{r}_{klm} = \vec{r} + k * \vec{a} + l * \vec{b} + m * \vec{c}$$

# Non bonded interaction cut off



Simple cut off radius

Switching function may be used to zero the truncated potential smoothly over some additional distance beyond cut off



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

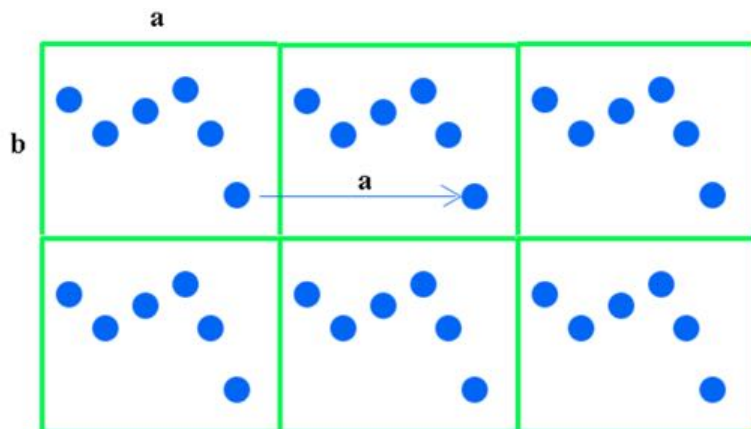
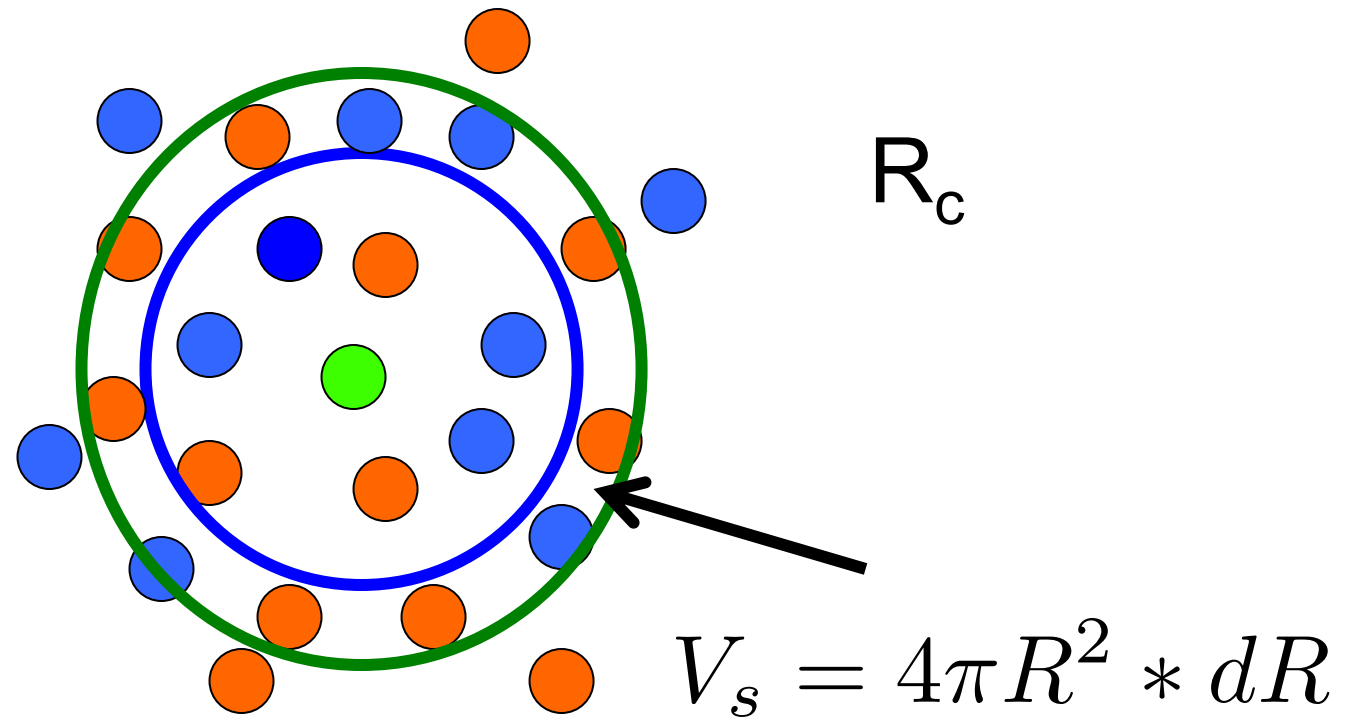
Lennard-Jones potential

# Is it fair to cut off electrostatics?

$$U_q = \frac{q_i q_j}{r}$$

Coulomb potential

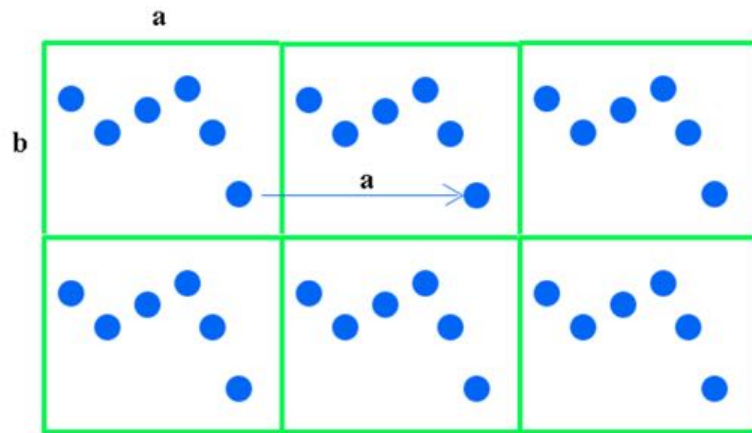
$$\phi(r_i) = q \sum_{j+}^{\infty} \frac{1}{|r_i - r_{j+}|} - q \sum_{j-}^{\infty} \frac{1}{|r_i - r_{j-}|}$$



Using plain cut offs for Coulomb interactions is known to be bad for charged systems

Eg.: DNA will be unstable, lipid simulations will behave badly, etc.

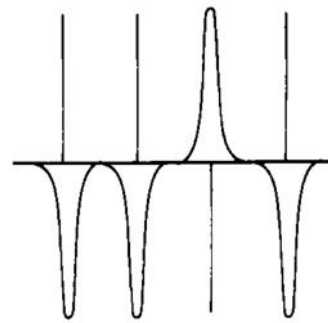
# Ewald summation method



$$-\nabla^2 \phi(\mathbf{r}) = 4\pi\rho(\mathbf{r})$$

Poisson equation – can be solved for periodic systems in Fourier space

$$U = \frac{1}{2} \sum_{i,j,n} \frac{q_i q_j}{|r_i - r_j + nL|}$$



Add and subtract a Gaussian smeared charge

$$\rho_{Gauss}(r) = -q_i (\alpha / \pi)^{3/2} \exp(-\alpha r^2)$$

How to calculate it?

Real part

Fourier part

$$U = \frac{1}{2} \sum_{i \neq j}^N \frac{q_i q_j \operatorname{erfc}(\sqrt{\alpha} r_{ij})}{r_{ij}} + \frac{1}{2V} \sum_{\mathbf{k} \neq 0} \frac{4\pi}{k^2} |\rho(\mathbf{k})|^2 \exp(-k^2 / 4\alpha) - (\alpha / \pi)^{1/2} \sum_{i=1}^N q_i^2$$

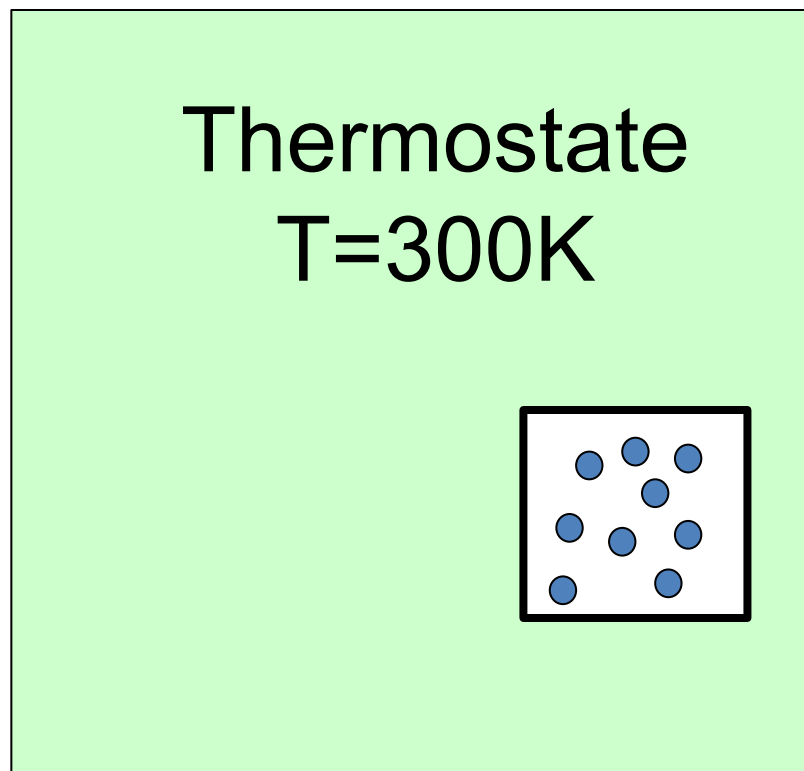
Faster modification: Particle Mesh Ewald (**PME**) method, makes use of grid interpolation and fast Fourier transforms, scales as  $N \cdot \log(N)$ . This is an accepted standard for MD simulations now.



# Constant temperature simulations

---

- Why use temperature coupling?
- -Compensate energy drift
- -NVT ensemble



$$P_{microstate} \propto e^{-\frac{H}{kT}}$$

Gibbs distribution

Two possibilities:

- 1) Add stochastic interactions
- 2) Use modified equations of motion

# Constant temperature simulations 2

---

## Stochastic approach

Andersen thermostat  
-random collision with virtual particles

$$P(t) = \nu e^{-\nu t}$$

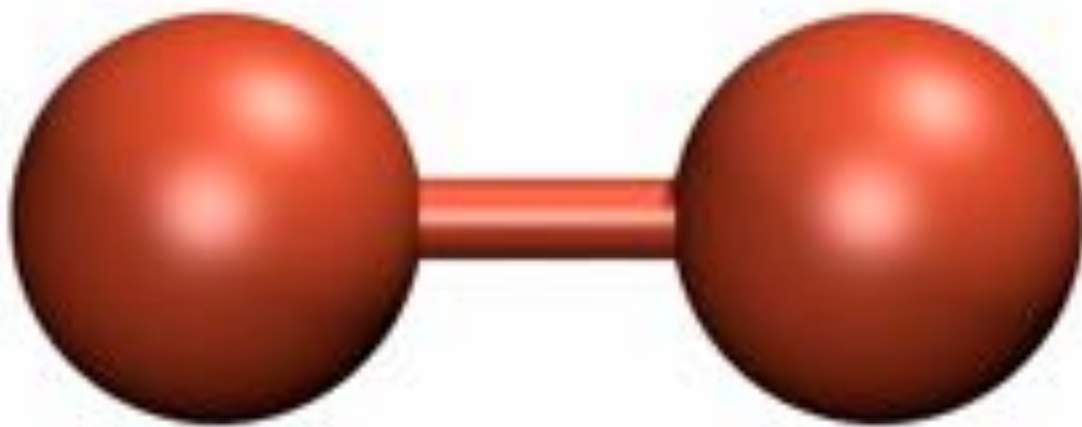
Langevin stochastic dynamics  
-add friction and stochastic term

$$m \frac{d^2 \vec{r}_i}{dt^2} = \vec{F}_i - \lambda \frac{d\vec{r}_i}{dt} + \boldsymbol{\eta}(t)$$

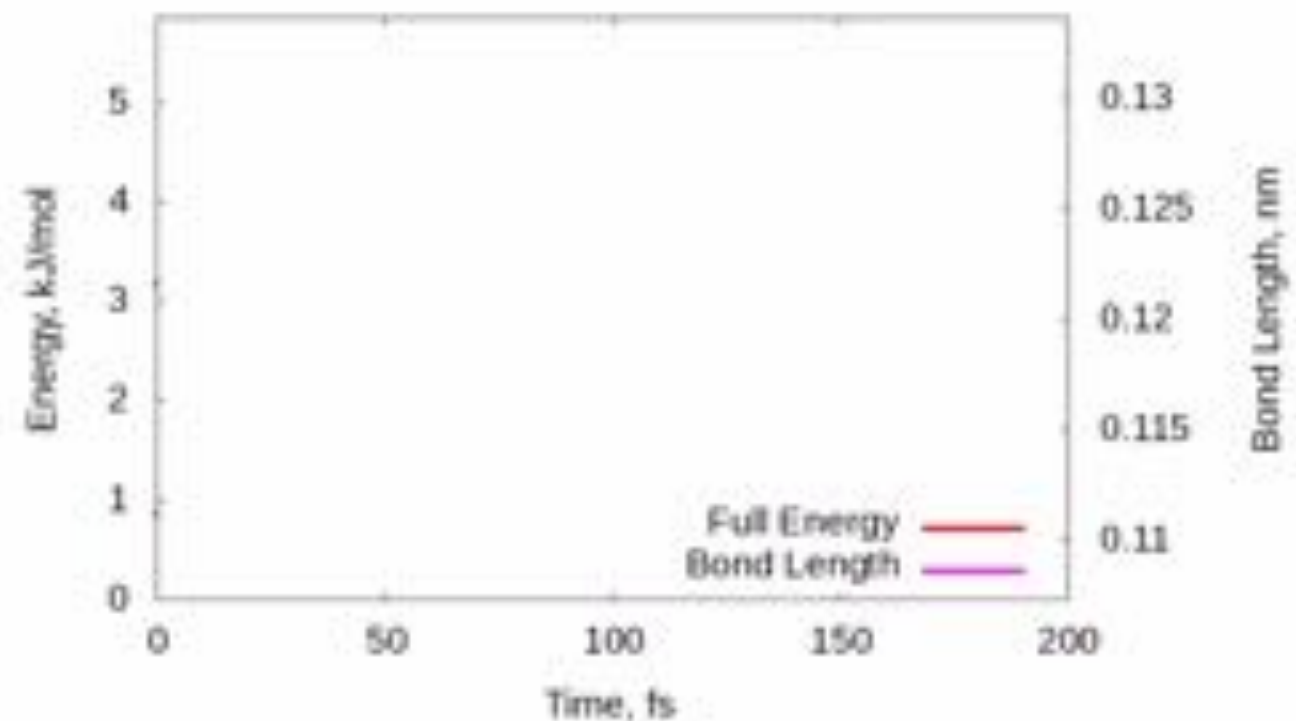
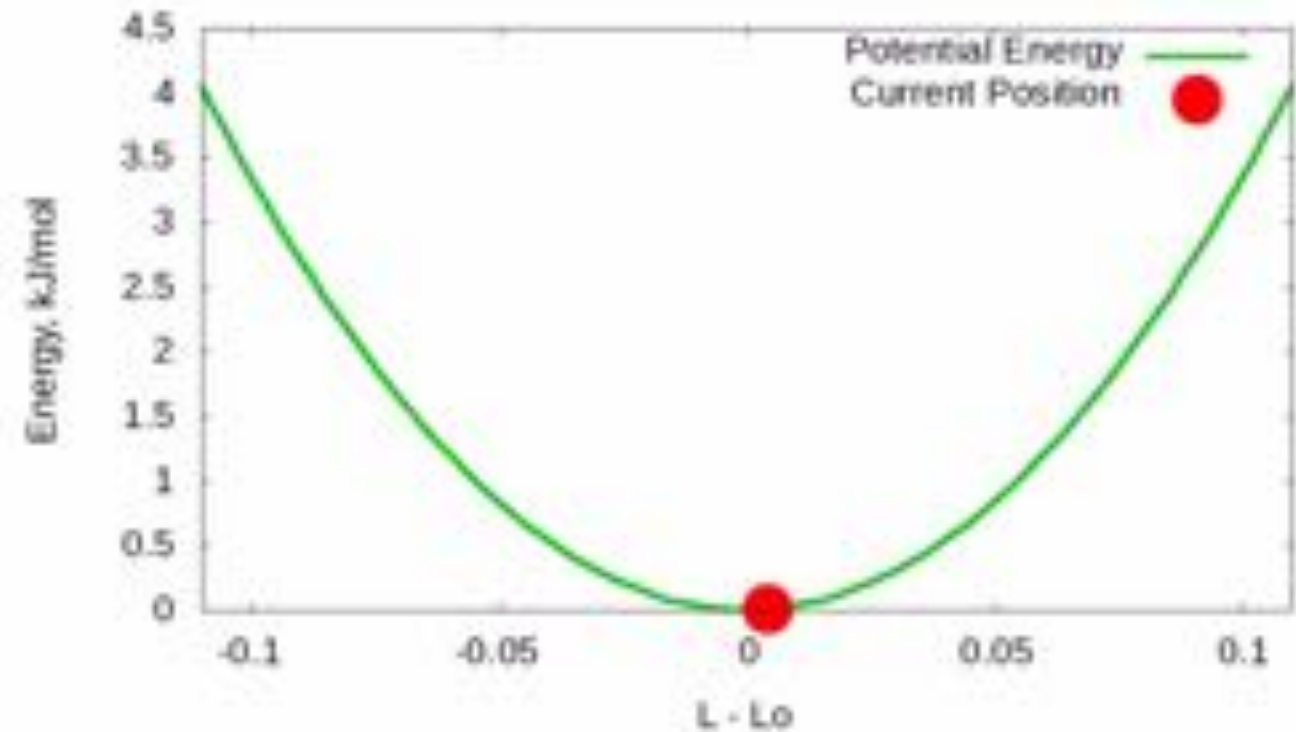
$$\langle \eta_i(t) \eta_j(t') \rangle = 2\lambda k_B T \delta_{i,j} \delta(t - t')$$

# Constant temperature simulations 2

## Langevin dynamics



Oxygen molecule  
Stochastic dynamics simulation



# Constant temperature simulations 3

---

## Berendsen thermostat

$$\frac{kT}{2}(3N - N_c) = \sum_{i=1}^N m_i \vec{v}_i^2 \quad \text{-instantaneous temperature}$$

Modify equations of motion

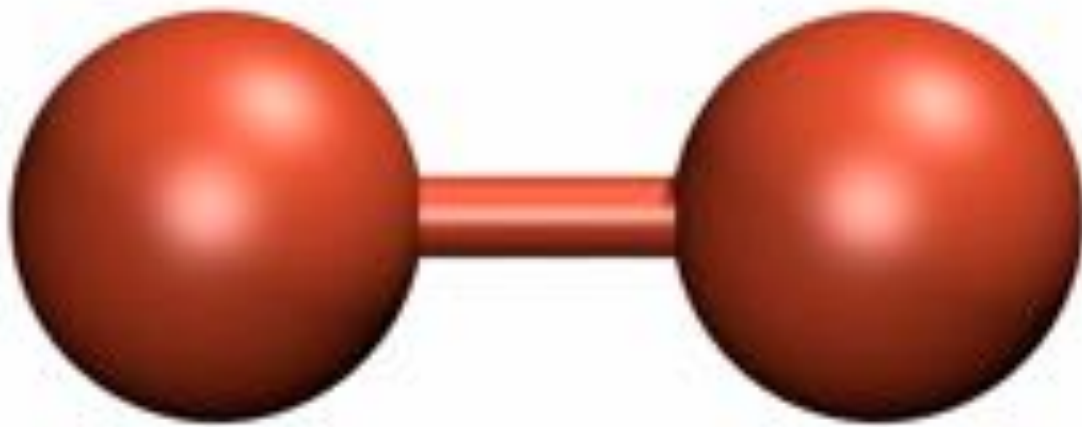
-re-scale the velocities of particles, multiply by

$$\lambda = \sqrt{T_0/T(t)}$$

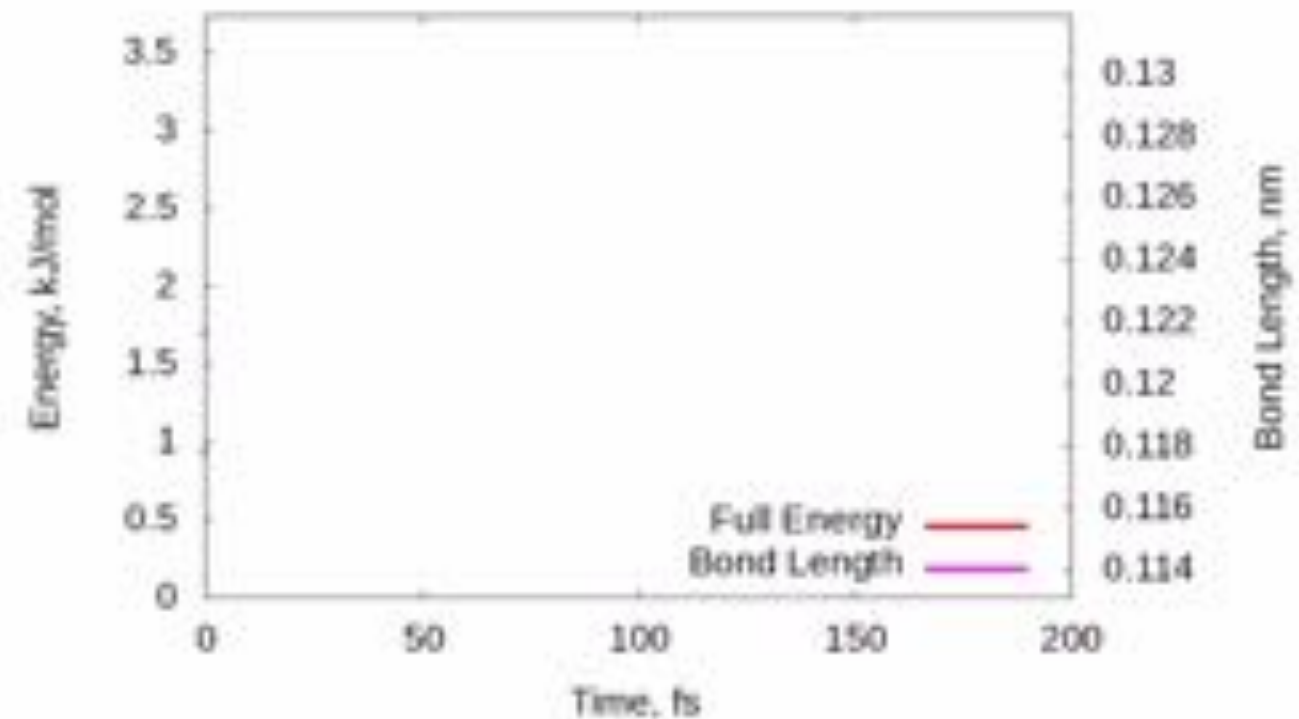
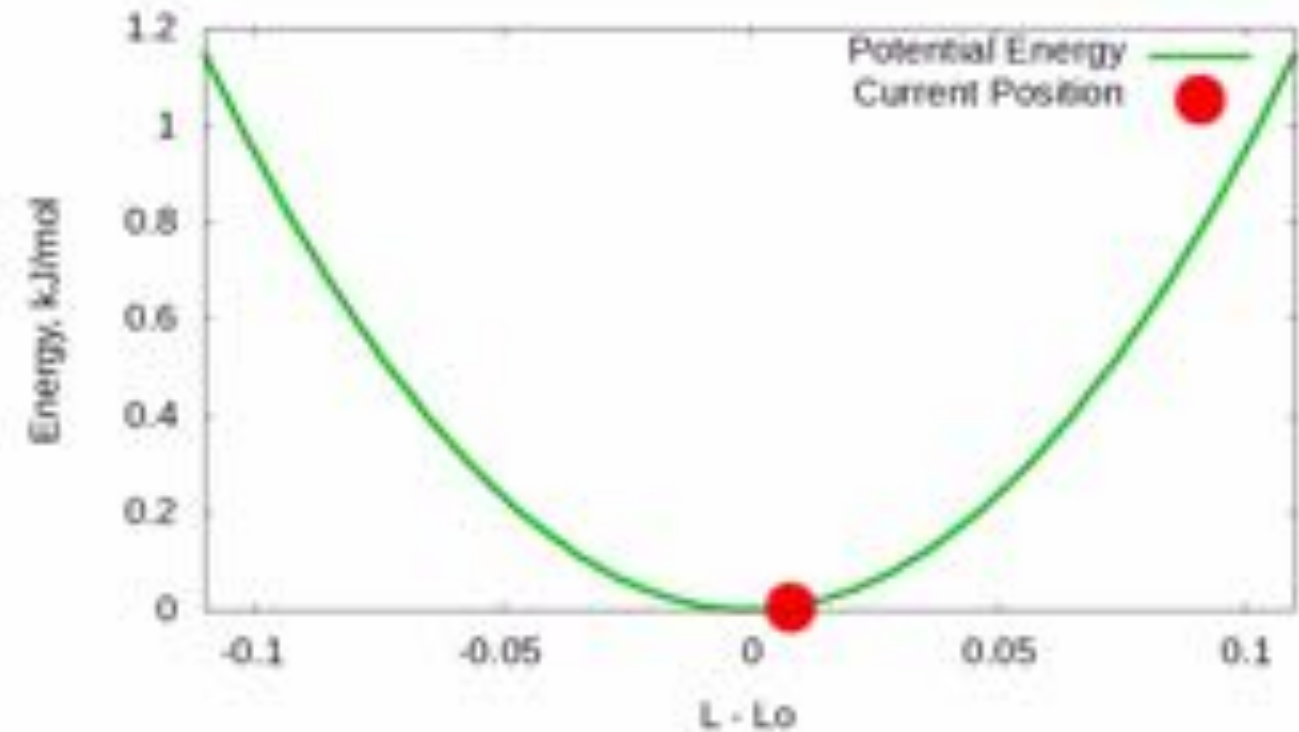
(!) incorrect ensemble, flying ice cube effect may happen

# Constant temperature simulations 3

## Berendsen thermostat



Oxygen molecule  
NVT simulation  
Leap-Frog integrator  
Integration step 1 fs  
Berendsen thermostat





# Constant temperature simulations 3

---

## Nose-Hoover thermostat

Extended system approach

-add a “bath particle”

-modify equations of motion, Non-Hamiltonian dynamics

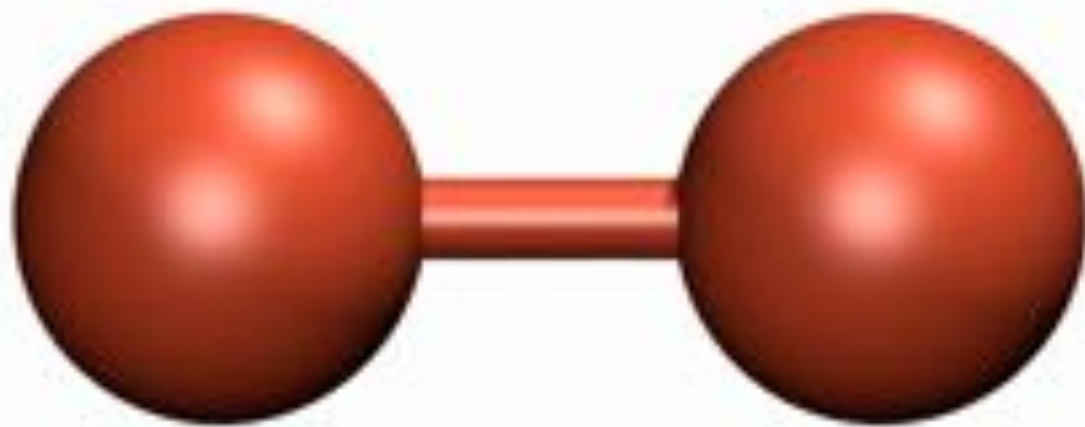
-gives NVT ensemble if:

1) No external forces, 2) there is only one conservation law, 3) the system is ergodic

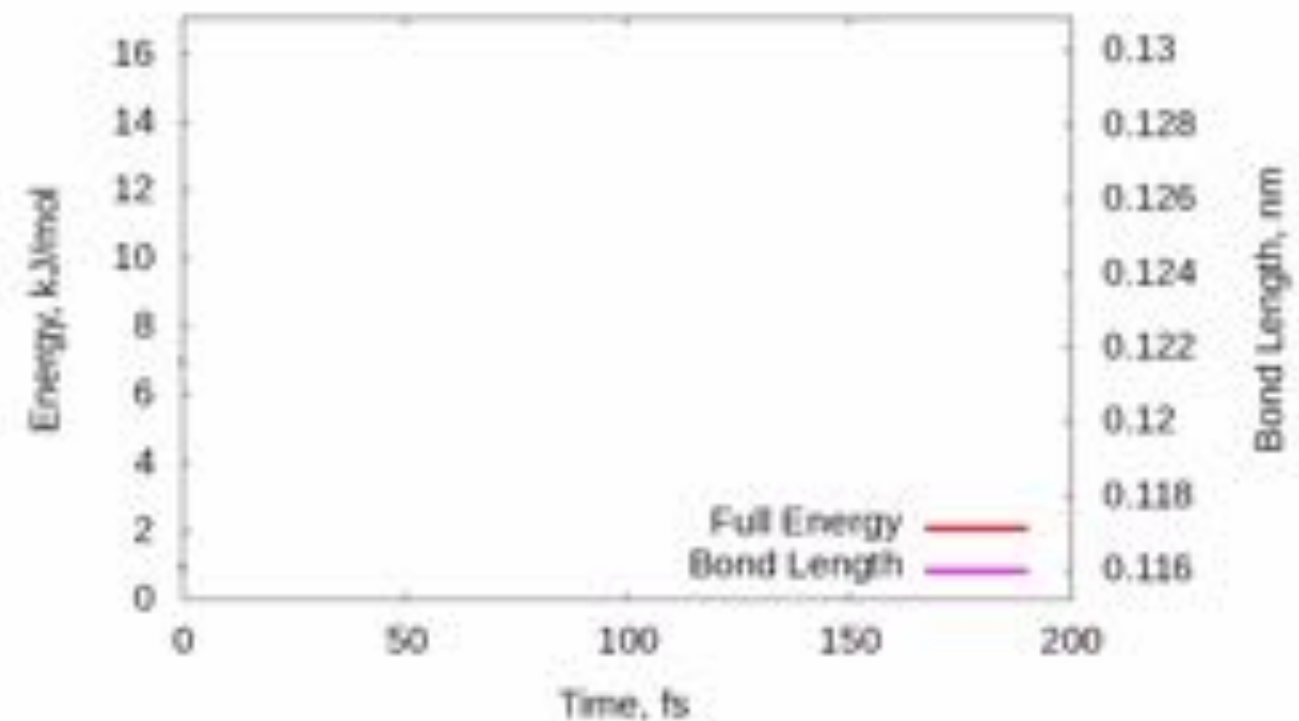
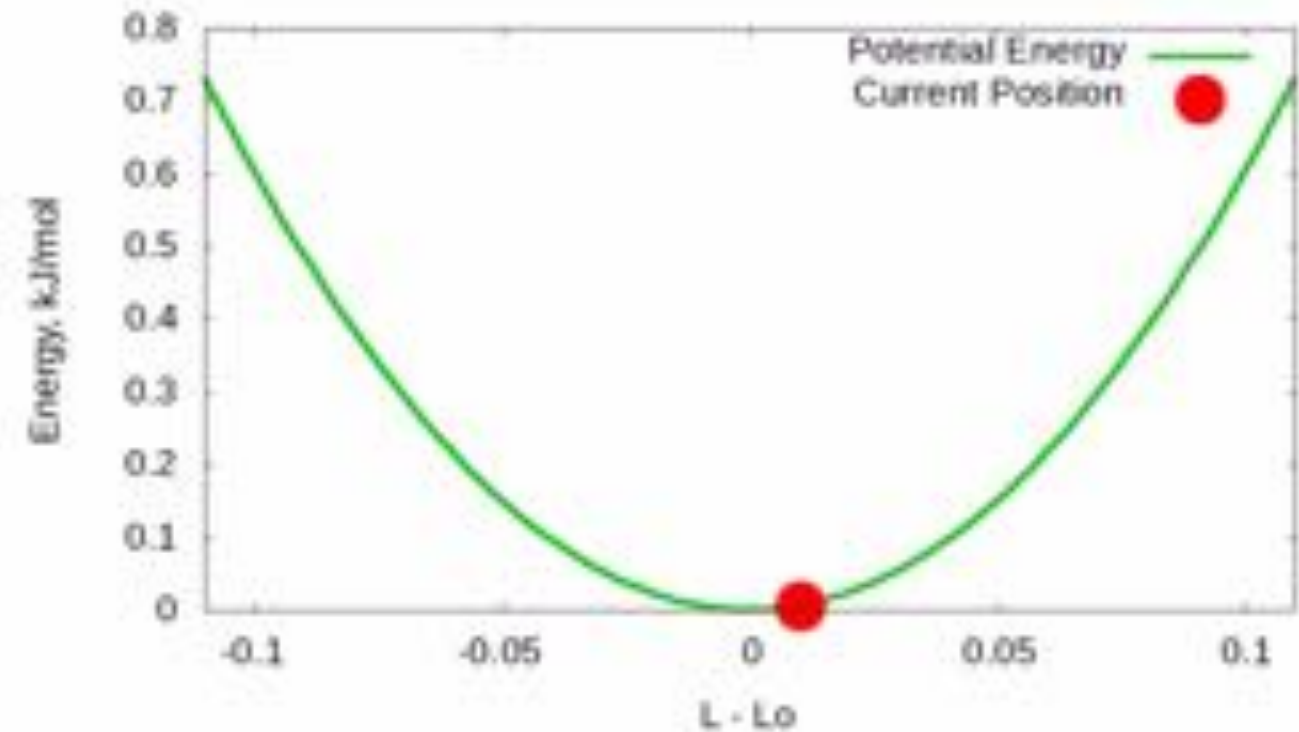
$$\left\{ \begin{array}{l} \frac{d^2 \vec{r}_i}{dt^2} = \frac{F_i}{m_i} - \frac{d\xi}{dt} \frac{d\vec{r}_i}{dt} \\ \frac{d^2 \xi}{dt^2} = \frac{N_f k}{Q} [T - T_0] \end{array} \right. \quad E_{NH} = E_k + U + \frac{1}{2} Q \dot{\xi}^2 + N_f k T \xi$$

# Constant temperature simulations 3

## Nose-Hoover thermostat

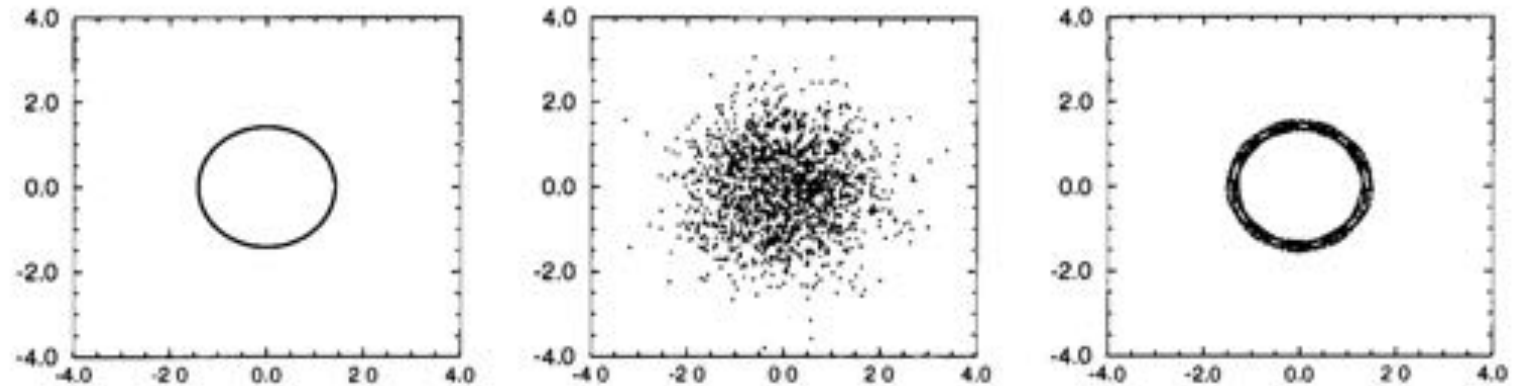


Oxygen molecule  
NVT simulation  
Verlet integrator  
Integration step 1 fs  
Nose-Hoover thermostat



# Constant temperature simulations 3

## Nose-Hoover chains



From D. Frenkel, B. Smit "Understanding Molecular Simulation, Second Edition: From Algorithms to Applications"

$$\dot{\mathbf{r}}_i = \frac{\mathbf{p}_i}{m_i}$$

$$\dot{\mathbf{p}}_i = \mathbf{F}_i - \mathbf{p}_i \dot{\xi}_1$$

$$\ddot{\xi}_1 = \frac{1}{Q_1} \left[ \sum_{i=1}^N m_i \mathbf{v}_i^2 - N_f k_B T_{set} \right] - \dot{\xi}_1 \dot{\xi}_2$$

$$\ddot{\xi}_j = \frac{1}{Q_j} \left[ Q_{j-1} \dot{\xi}_{j-1}^2 - k_B T_{set} \right] - \dot{\xi}_j \dot{\xi}_{j+1} \quad , j = 2, \dots, M-1$$

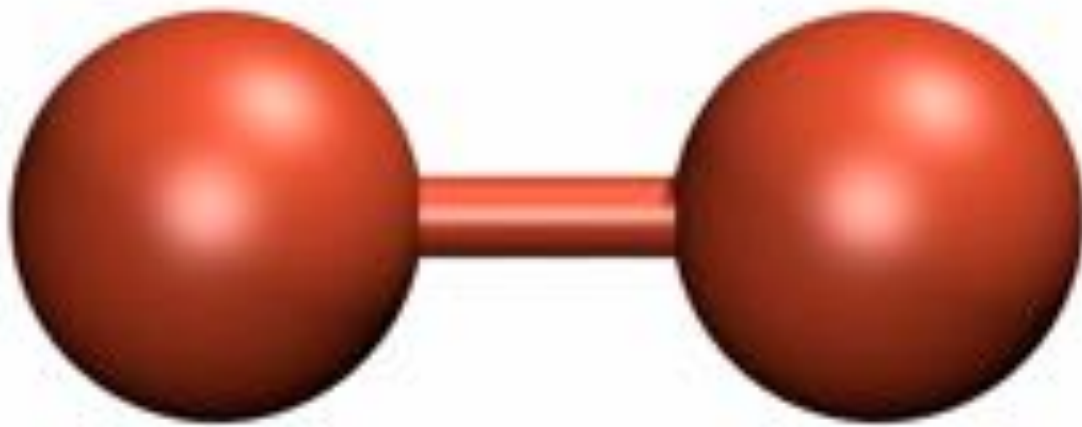
$$\ddot{\xi}_M = \frac{1}{Q_M} \left[ Q_{M-1} \dot{\xi}_{M-1}^2 - k_B T_{set} \right] \quad ,$$

Nose-Hoover will not be correct for an oscillator, and "harmonic" systems.

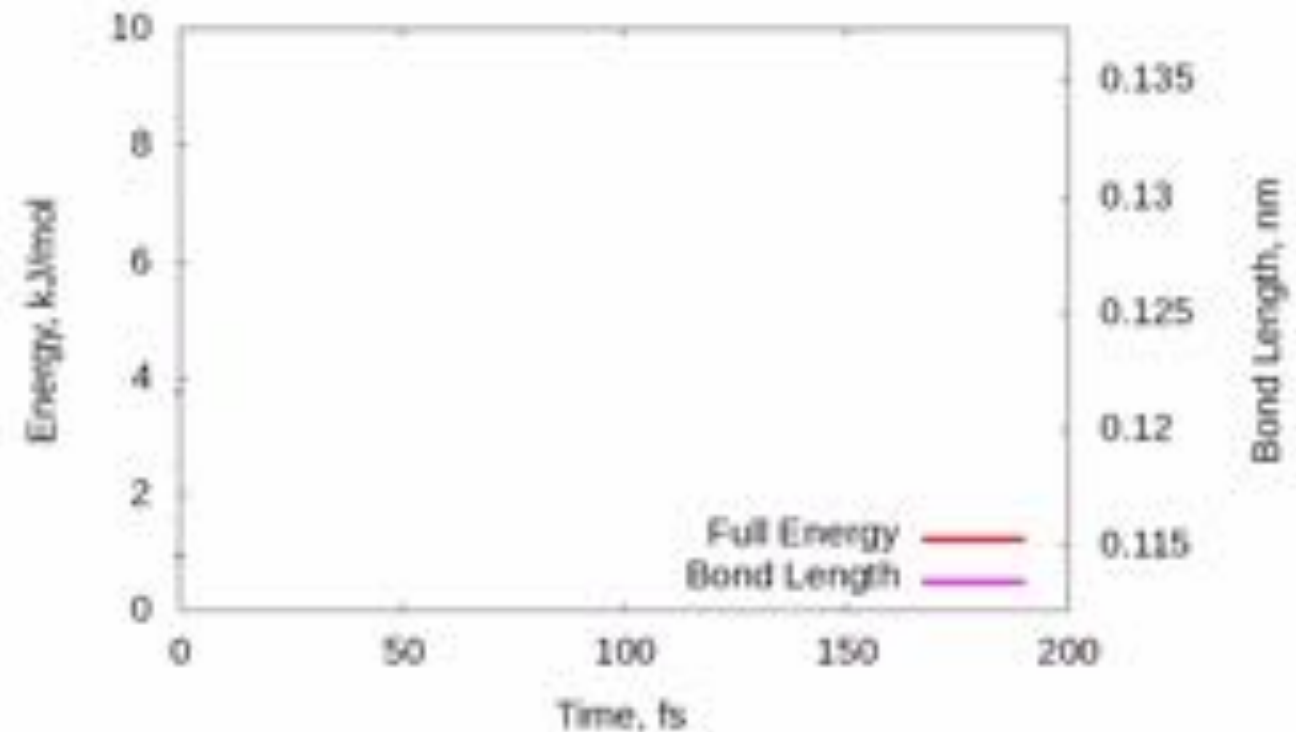
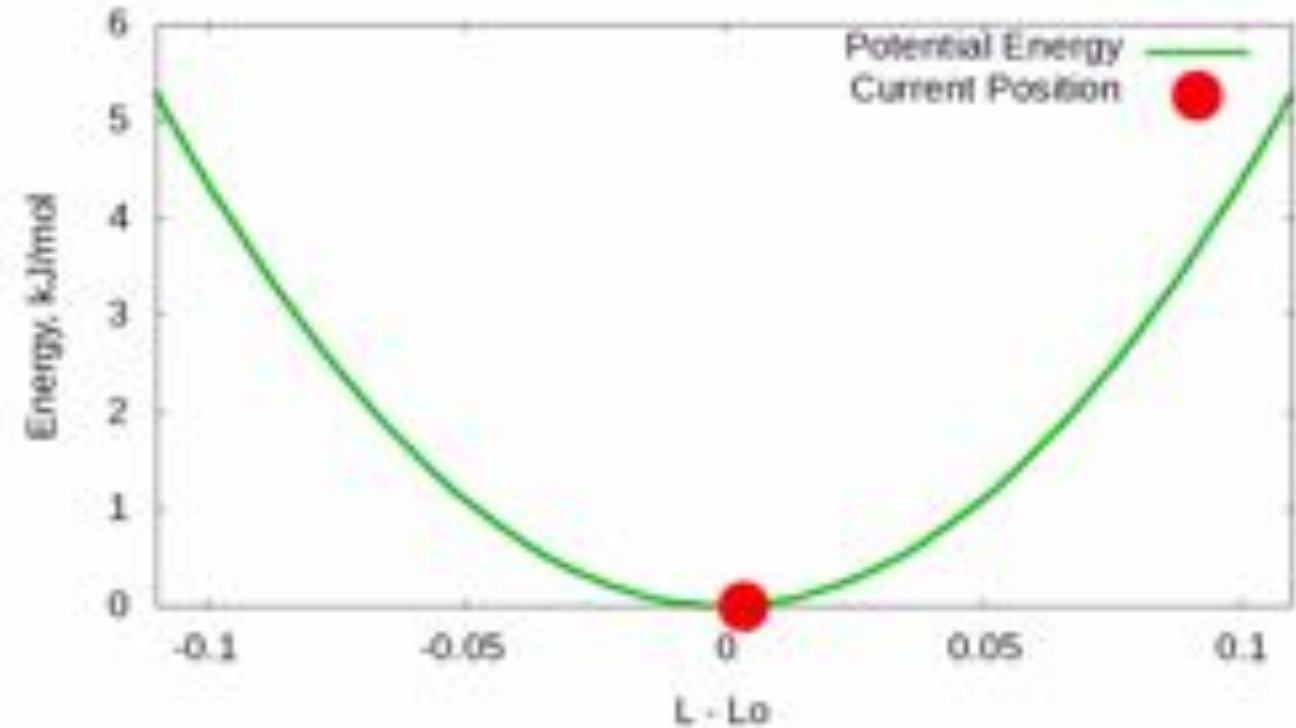
Use NH chains instead!

# Constant temperature simulations 3

## Nose-Hoover chains

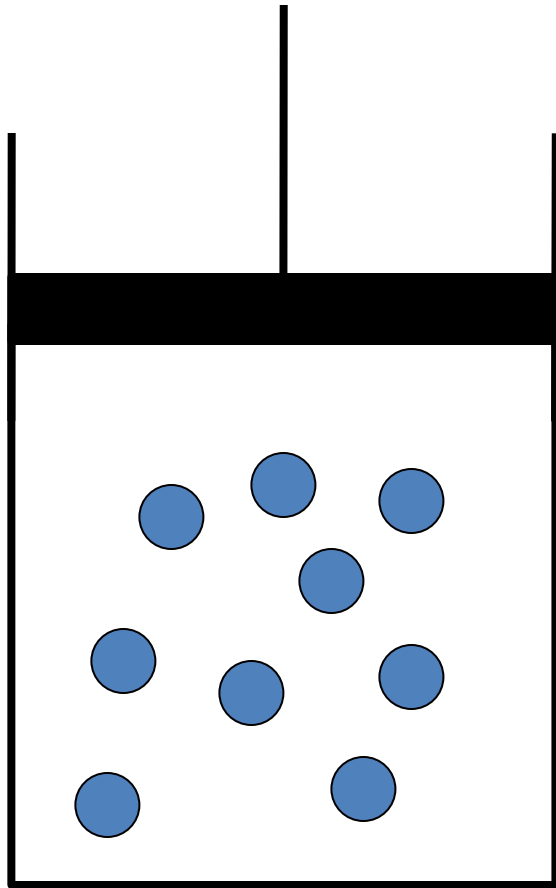


Oxygen molecule  
NVT simulation  
Verlet integrator  
Integration step 1 fs  
Nose-Hoover + chains thermostat



# Constant pressure simulations

## Berendsen Barostat



NPT-ensemble

$$P = nkT + vir/V$$

$$vir = \frac{1}{3} \sum \vec{f}_{ij} \vec{r}_{ij}$$

$$\begin{cases} \vec{r}_i \implies \mu \vec{r}_i \\ L \implies \mu L \end{cases}$$

$$\mu = \left[ 1 - \frac{\Delta t}{\tau_p} (P - P_0) \right]$$

A more robust and flexible algorithm is Parrinello-Rahman method, gives correct ensemble.



# Rigid bonds

---

- Special algorithms (SHAKE, RATTLE, SETTLES, etc.) can keep bonds between the atoms fixed. (Holonomic constraints)
- This usually allows to increase integration timestep to 2 fs.

# Computational costs of MD cycle

Initial coordinates

Computational time

Force calculation

$$\mathbf{F}_i = -\frac{\partial V}{\partial \mathbf{r}_i} \quad \mathbf{F}_i = \sum_j \mathbf{F}_{ij}$$

$$\left. \begin{aligned} &\sum_{\theta} K_{\theta}(\theta - \theta_0)^2 + \\ &\sum_{\phi} K_{\phi}(1 + \cos(n\phi - \phi_0)) \end{aligned} \right\} \sim 2\%$$

$$\left. \begin{aligned} &\sum_{\phi} \epsilon \left[ \left(\frac{\sigma}{r}\right)^{12} - \left(\frac{\sigma}{r}\right)^6 \right] + \\ &\sum_{ij} \frac{q_i q_j}{r_{ij}} \end{aligned} \right\} \sim 90\%$$

Coordinate update

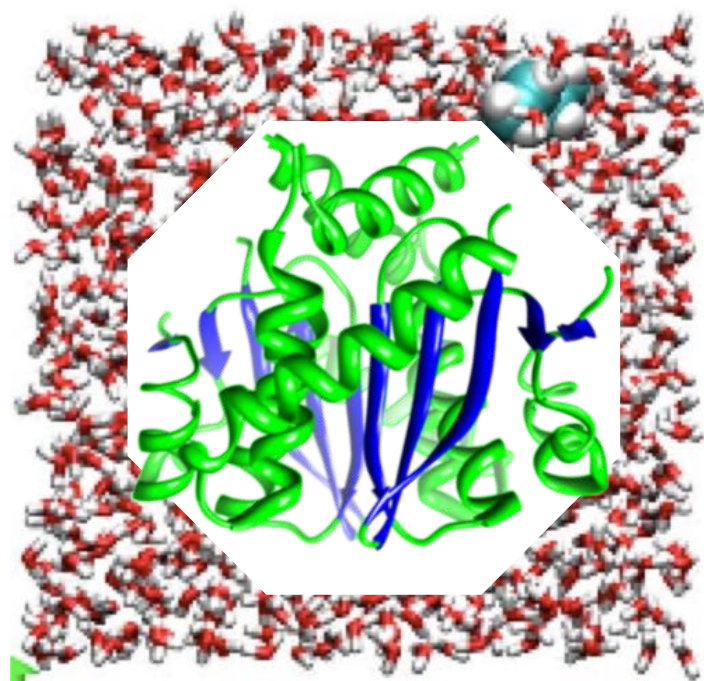
$$\frac{d^2 \mathbf{r}_i}{dt^2} = \frac{\mathbf{F}_i}{m_i}$$

$\sim 0.1\%$

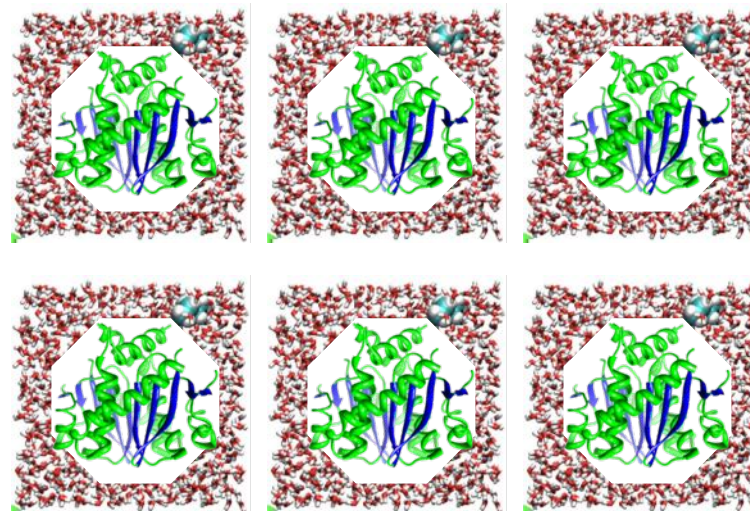
Data output



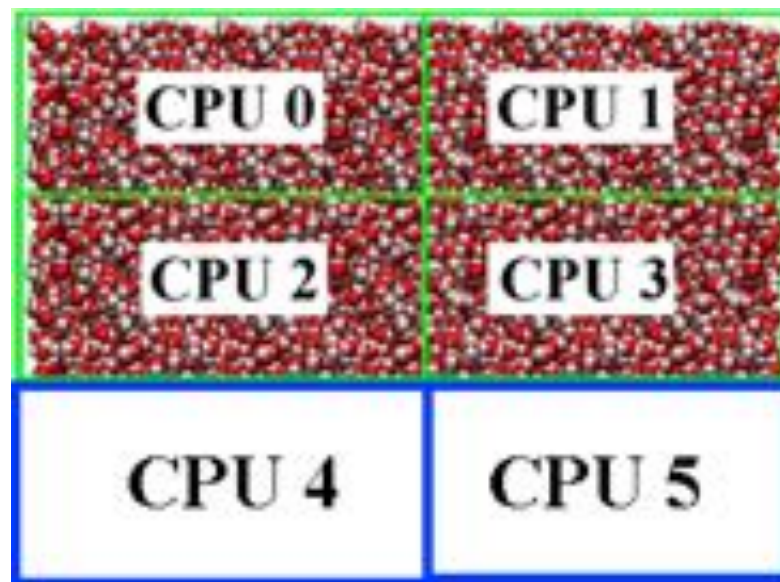
# Parallel computing



System under study



Multiple replica calculation



Domain/task decomposition



GRIDs, distributed computing, etc

supercomputing  
(general, with GPU, ASIC, etc)





# Special architectures

Specially designed Application Specific Integrated Circuits (ASIC):

- MD GRAPE, RIKEN, Japan
- ANTON computer, D.E. Shaw Research, USA



## David Shaw

**Born** David Elliot Shaw  
March 29, 1951 (age 67)

**Alma mater** [University of California, San Diego](#)  
[Stanford University](#)

**Occupation** Investor, computer scientist, and  
[hedge fund manager](#)

**Known for** Founding and managing [D. E. Shaw & Co.](#)

**Net worth** [US\\$ 6.2 billion \(June 2018\)](#)<sup>[1]</sup>



Chemical system (PDB ID)	Number of atoms	Approximate performance (microseconds/machine-day)*
DHFR (5DFR)	23558	17.4
aSFP (1SFP)	48423	11.7
FtsZ (1FSZ)	98236	5.7
T7Lig (1A01)	116650	5.5

# Software for MD simulations

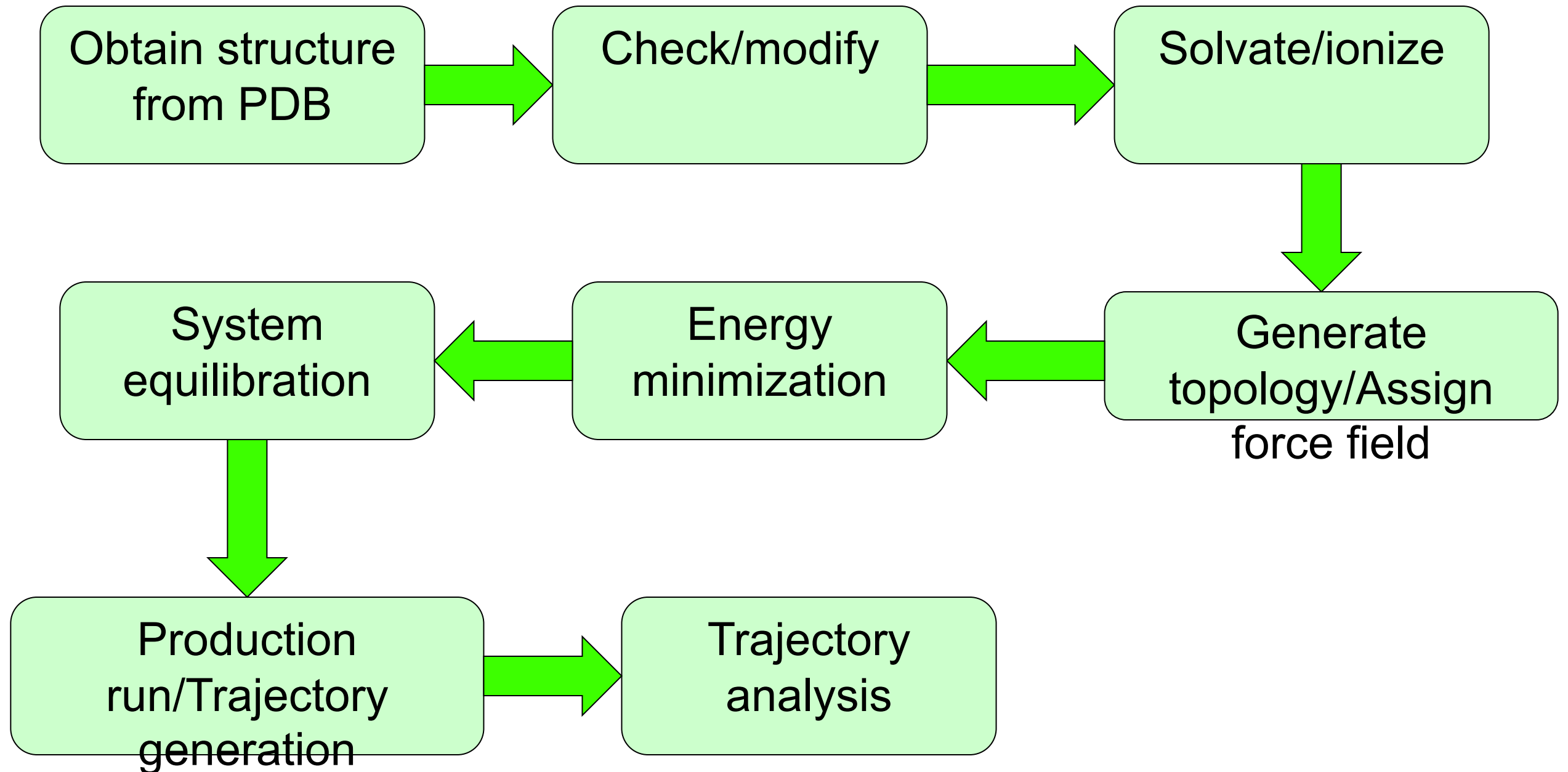
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- CHARMM
- AMBER
- NAMD
- GROMACS
- DESMOND
- TINKER
- LAMMPS
- DL\_POLLY
- GROMOS
- CPMD, CP2K, ...



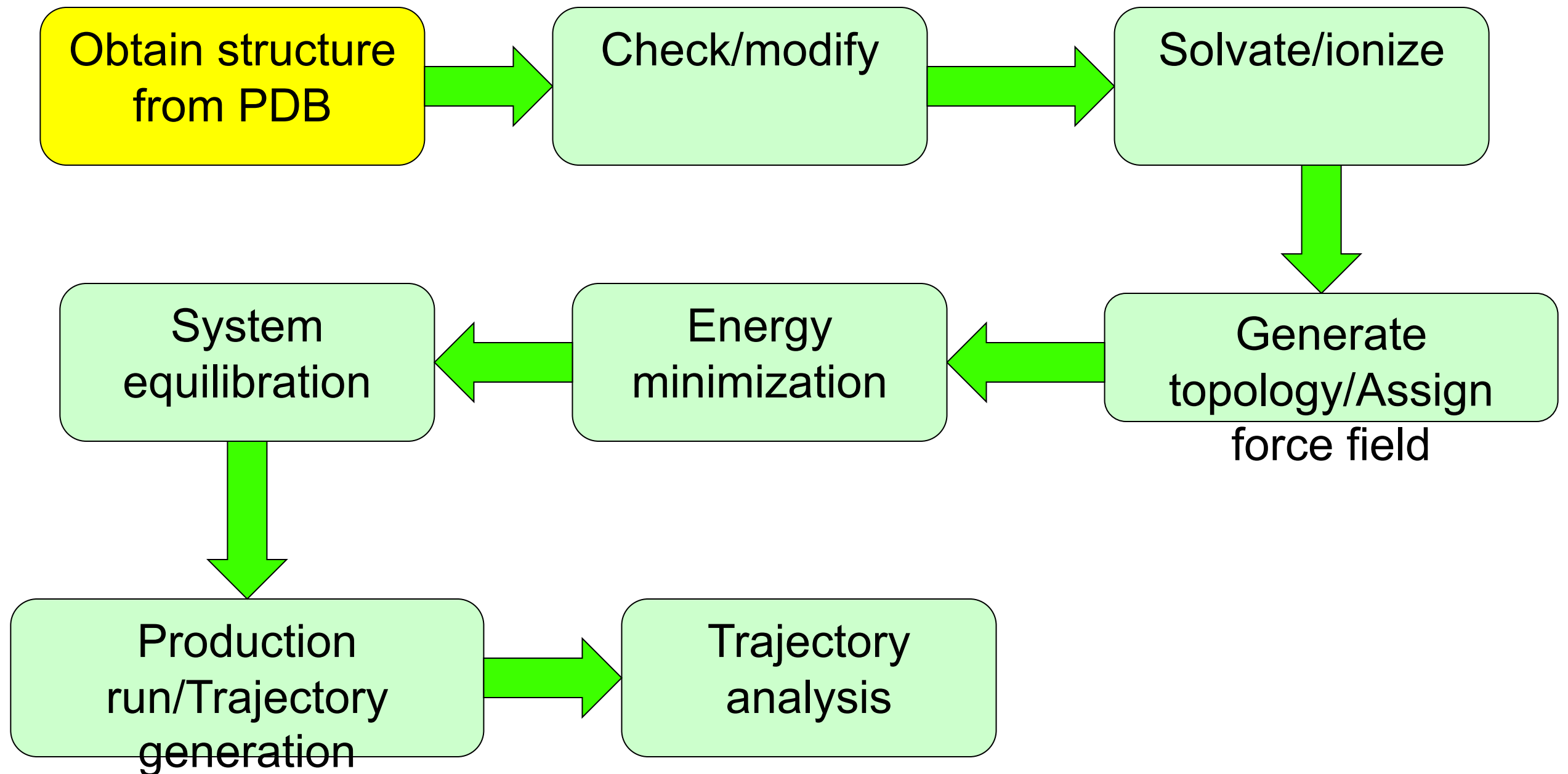
# How do I do an MD simulation?

---



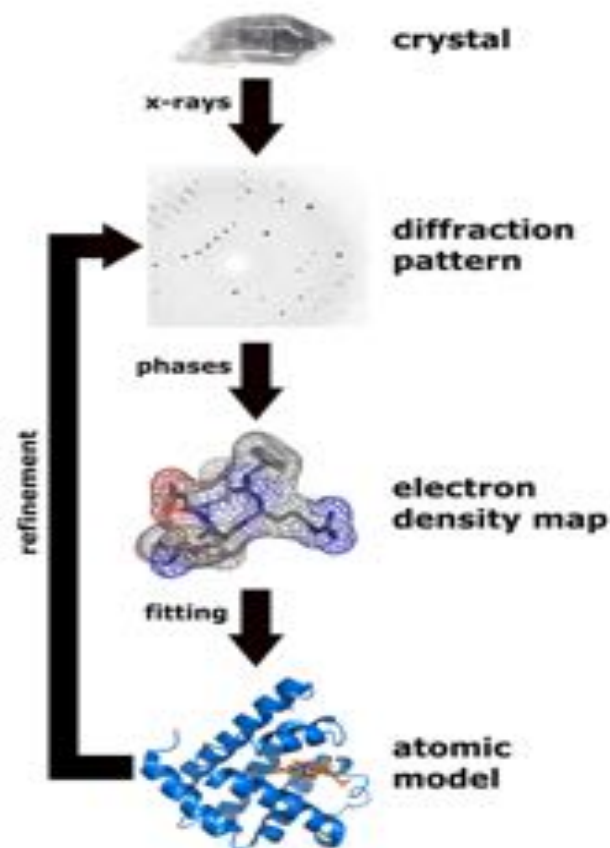
# PDB and MM crystallography

---



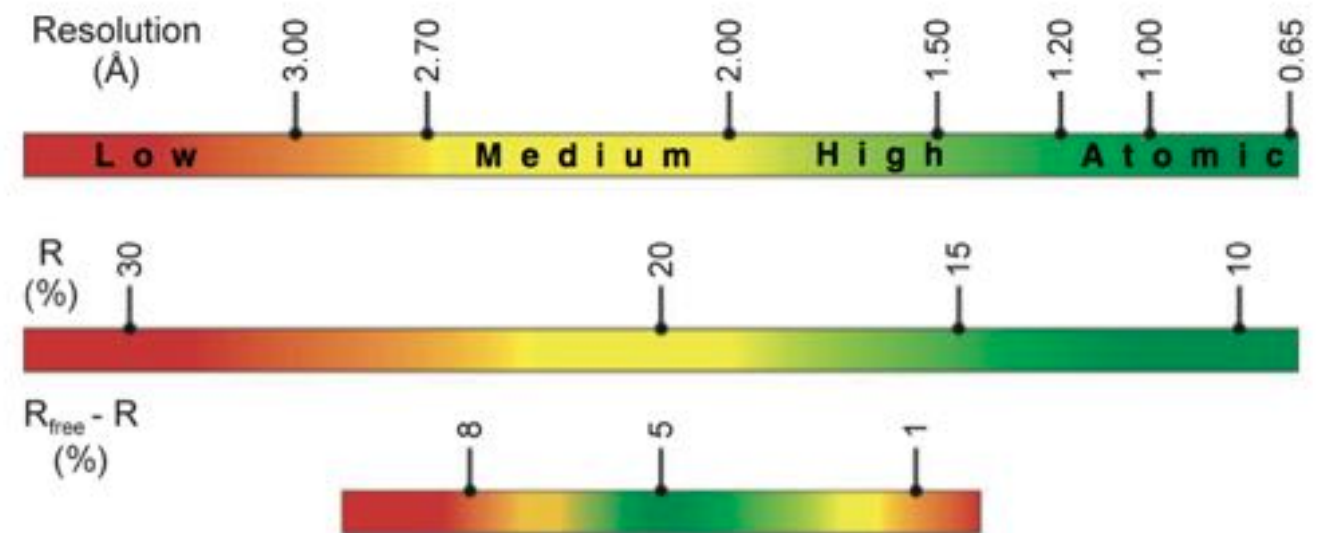
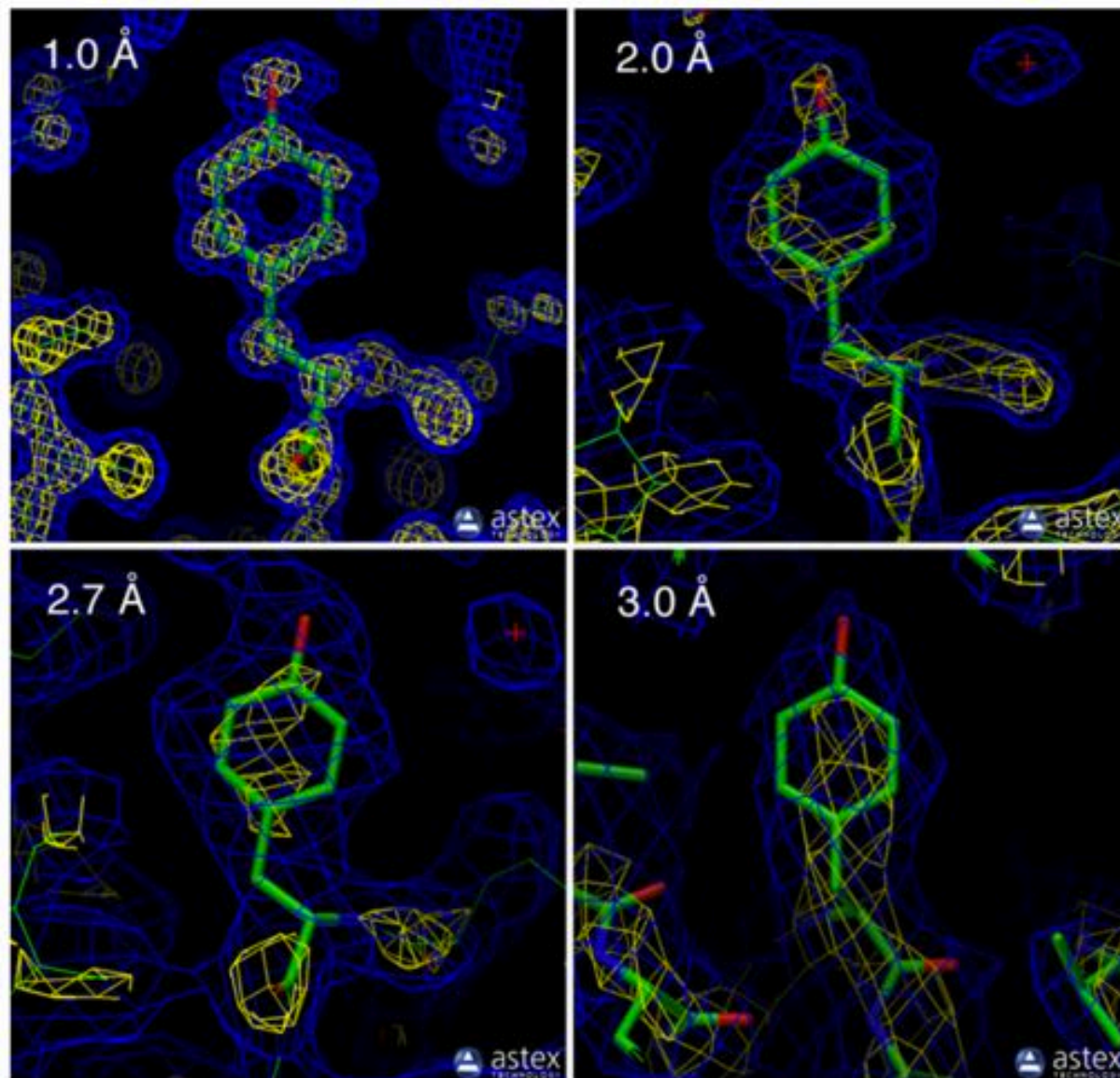
# PDB and MM crystallography

- Google PDB – go to PDB site
- Type 1ubq , press search
- Press 3D-View
- select Structure -> “asymmetric unit”; Crystal packing -> “3x3 unit cell ...”
- Go back to summary
- ~90% - determined by macromolecular crystallography
- How do I assess the quality of structure?



↑ Experimental Details		Hide
<b>Method:</b> X-RAY DIFFRACTION		
<b>Exp. Data:</b>		
<a href="#">BMRB</a>		
<a href="#">Structure Factors</a>		
<a href="#">EDS</a>		
<b>Resolution [Å]:</b>		1.80
<b>R-Value:</b>		0.176 (obs.)
<b>R-Free:</b>		n/a
<b>Space Group:</b>		<b>P 2<sub>1</sub> 2<sub>1</sub> 2<sub>1</sub></b>
<b>Unit Cell:</b>		
<u>Length [Å]</u>		<u>Angles [°]</u>
a = 50.84		α = 90.00
b = 42.77		β = 90.00
c = 28.95		γ = 90.00

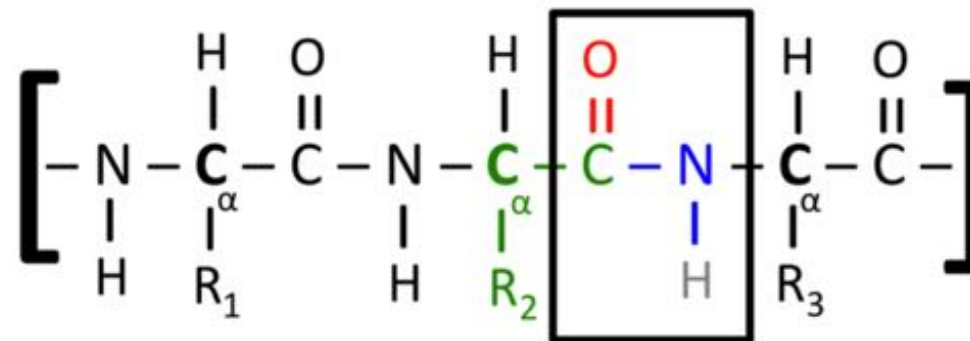
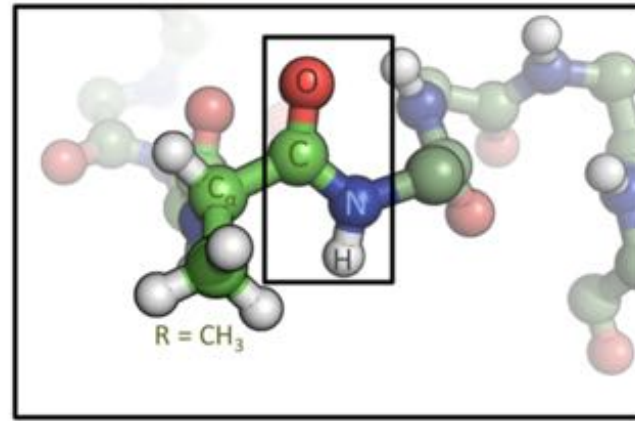
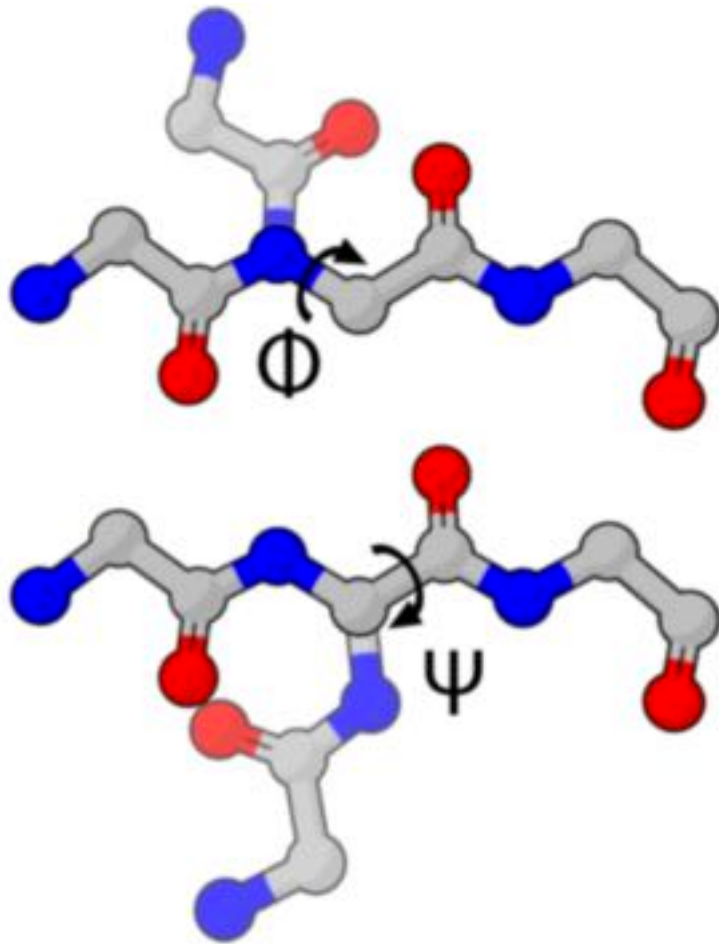
# Resolution, R-factor and quality



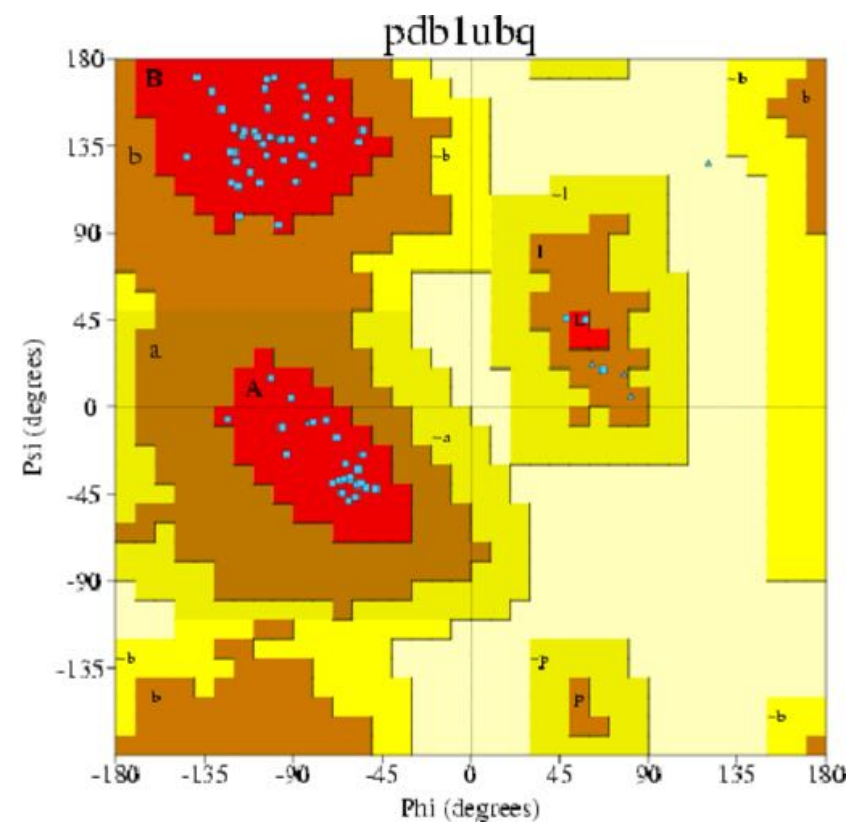
From Wlodawer A, Minor W, Dauter Z, Jaskolski M. FEBS J. 2008 Jan;275(1):1-21

Electron density maps at  
different resolutions

# Checking Ramachandran plot



- On PDB page click Links menu
- Click PDBSum
- Click PROCHECK





# PDB format

---

- Return back: You can Google 1ubq
- Click Display file -> PDB File

				Chain ID						B-factor	
ATOM	1	N	MET	A	1	27.340	24.430	2.614	1.00	9.67	N
ATOM	2	CA	MET	A	1	26.266	25.413	2.842	1.00	10.38	C
ATOM	3	C	MET	A	1	26.913	26.639	3.531	1.00	9.62	C
ATOM	4	O	MET	A	1	27.886	26.463	4.263	1.00	9.62	O
ATOM	5	CB	MET	A	1	25.112	24.880	3.649	1.00	13.77	C
ATOM	6	CG	MET	A	1	25.353	24.860	5.134	1.00	16.29	C
ATOM	7	SD	MET	A	1	23.930	23.959	5.904	1.00	17.17	S
ATOM	8	CE	MET	A	1	24.447	23.984	7.620	1.00	16.11	C
ATOM	9	N	GLN	A	2	26.335	27.770	3.258	1.00	9.27	N
ATOM	10	CA	GLN	A	2	26.850	29.021	3.898	1.00	9.07	C

Atom name

Residue name

Residue number

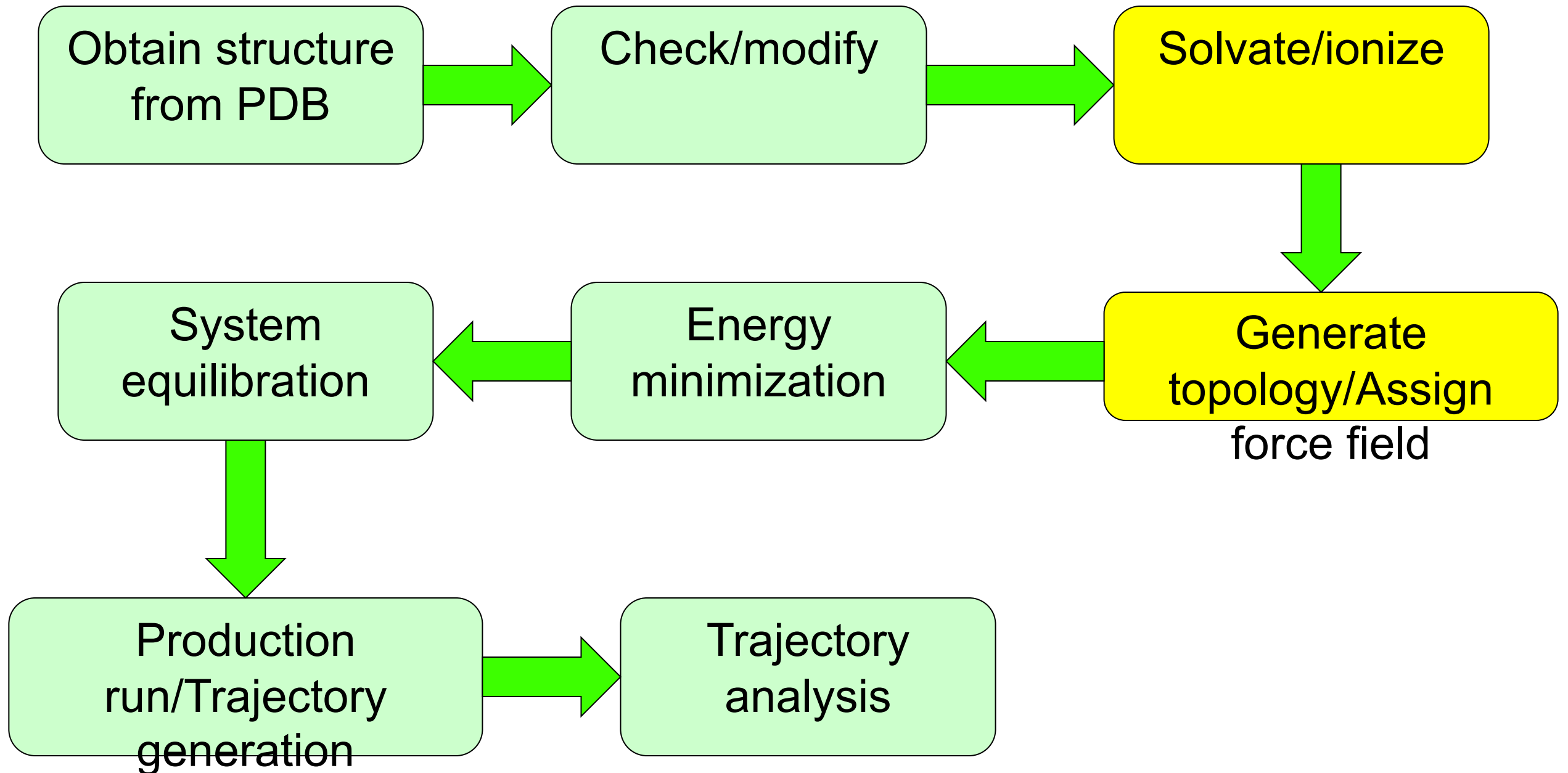
X,Y,Z

Occupancy

The diagram illustrates the PDB format with a table of atom data. Blue arrows point from labels to specific columns in the table: 'Atom name' points to the first column, 'Residue name' points to the second, 'Residue number' points to the fifth, 'X,Y,Z' points to the next three columns (X, Y, Z coordinates), 'Occupancy' points to the tenth, and 'B-factor' points to the eleventh. A blue bracket groups the X, Y, and Z columns under the label 'X,Y,Z'.

# How do I do an MD simulation?

---



# Topology file

```

RESI ARG          1.00
GROUP
ATOM N    NH1    -0.47  !      |      HH11
ATOM HN   H      0.31  !  HN-N      |
ATOM CA   CT1    0.07  !      |      HB1 HG1 HD1 HE      NH1-HH12
ATOM HA   HB     0.09  !      |      |      |      |      // (+)
GROUP     !  HA-CA--CB--CG--CD--NE--CZ
ATOM CB   CT2   -0.18  !      |      \
ATOM HB1  HA     0.09  !      |      HB2 HG2 HD2      NH2-HH22
ATOM HB2  HA     0.09  !  O=C      |
GROUP     !      |      HH21
ATOM CG   CT2   -0.18
ATOM HG1  HA     0.09
ATOM HG2  HA     0.09
GROUP
ATOM CD   CT2    0.20
ATOM HD1  HA     0.09
ATOM HD2  HA     0.09
ATOM NE   NC2   -0.70
ATOM HE   HC     0.44
ATOM CZ   C      0.64
ATOM NH1  NC2   -0.80
ATOM HH11 HC     0.46

```

# Force field parameters file

---

```
BONDS
!  
!V(bond) = Kb(b - b0)**2  
!  
!Kb: kcal/mole/A**2  
!b0: A  
!  
!atom type Kb          b0  
!  
!Carbon Dioxide  
CST  OST   937.96      1.1600 ! JES  
!Heme to Sulfate (PSUL) link  
SS   FE    250.0       2.3200 !force constant a guess  
                !equilibrium bond length optimized to reproduce  
                !CSD survey values of  
                !2.341pm0.01 (mean, standard error)  
                !adm jr., 7/01  
C    C     600.000     1.3350 ! ALLOW ARO HEM  
                ! Heme vinyl substituent (KK, from propene (JCS))  
CA   CA    305.000     1.3750 ! ALLOW  ARO  
                ! benzene, JES 8/25/89  
CE1  CE1   440.000     1.3400 !  
                ! for butene; from propene, yin/adm jr., 12/95  
CE1  CE2   500.000     1.3420 !
```



# NAMD conf file

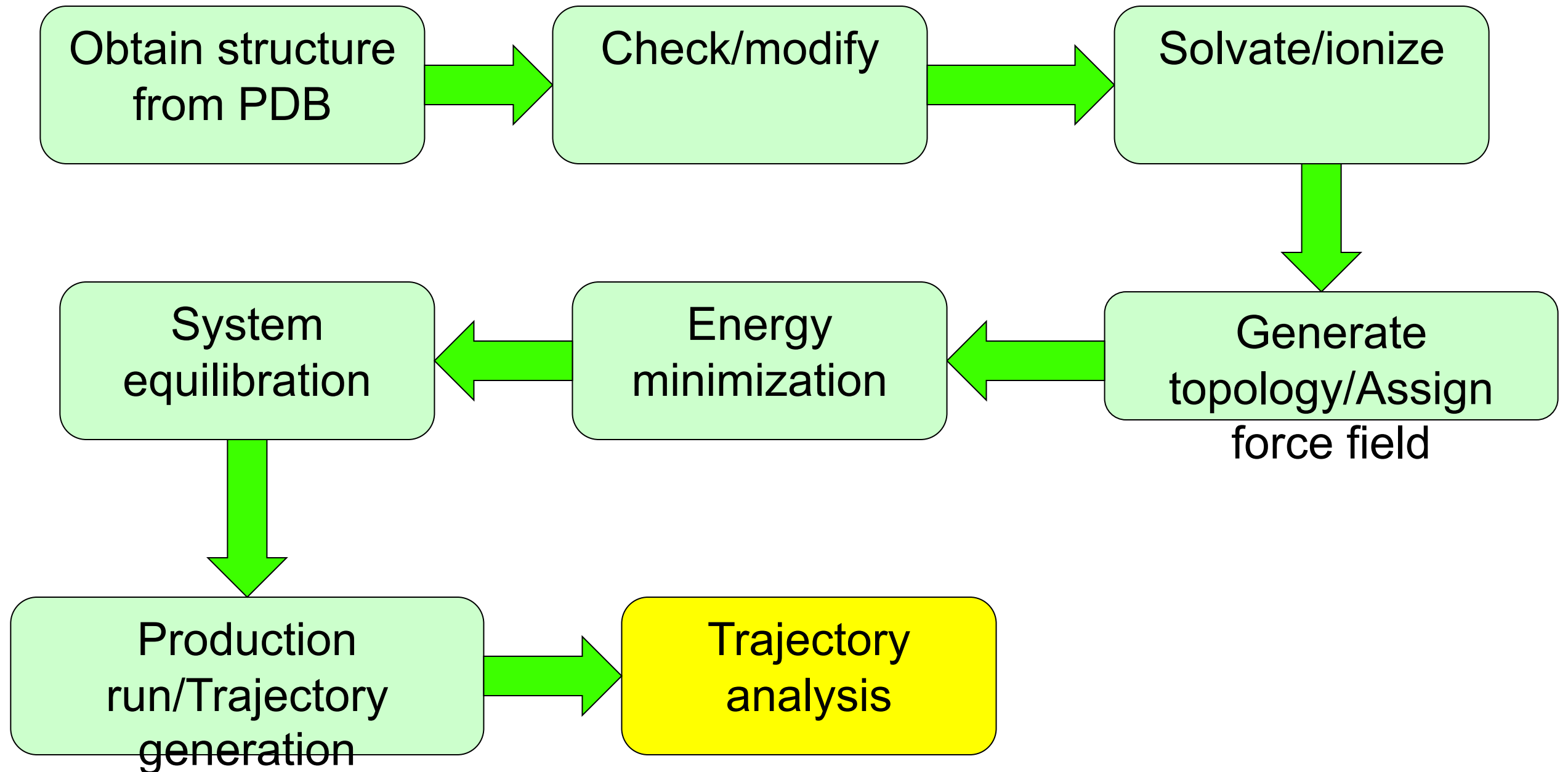
---

```
#####  
## JOB DESCRIPTION ##  
#####  
  
# Minimization and simulation  
# of Ubiquitin in a Water box  
  
#####  
## ADJUSTABLE PARAMETERS ##  
#####  
  
structure          ubq_ready.psf  
coordinates        ubq_ready.pdb  
  
set temperature    310  
set outputname     simul  
  
firsttimestep      0  
  
#####  
## SIMULATION PARAMETERS ##  
#####
```



# How do I do an MD simulation?

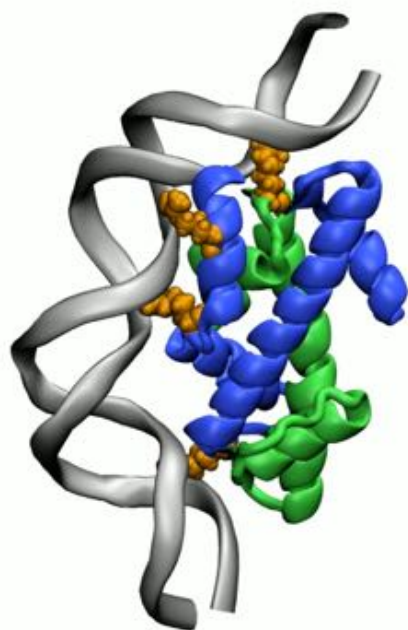
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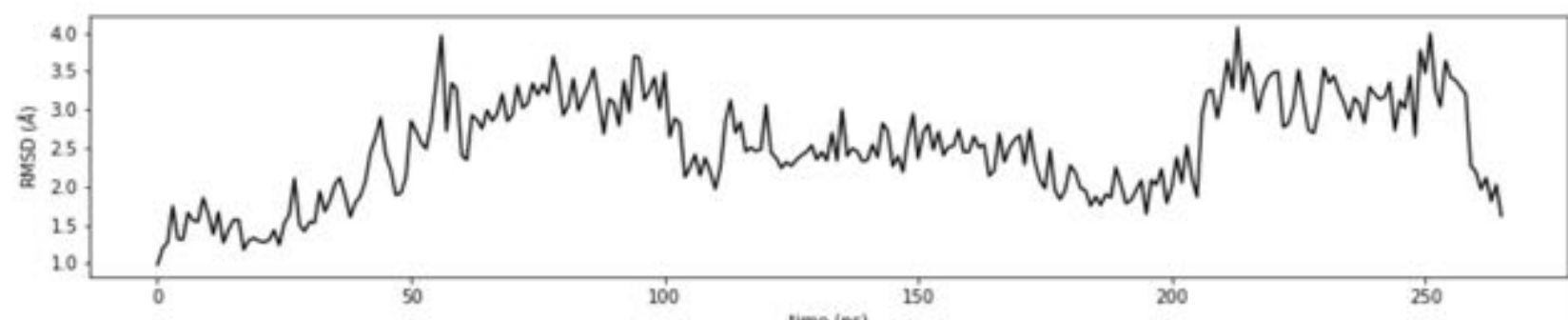
# Trajectory analysis

MD simulations of H3–H4 with DNA, tails truncated

Histones H3  
 Histones H4  
 Histones H2A  
 Histones H2B  
 Min groove ARG  
 DNA  
 AT pairs  
 GC pairs



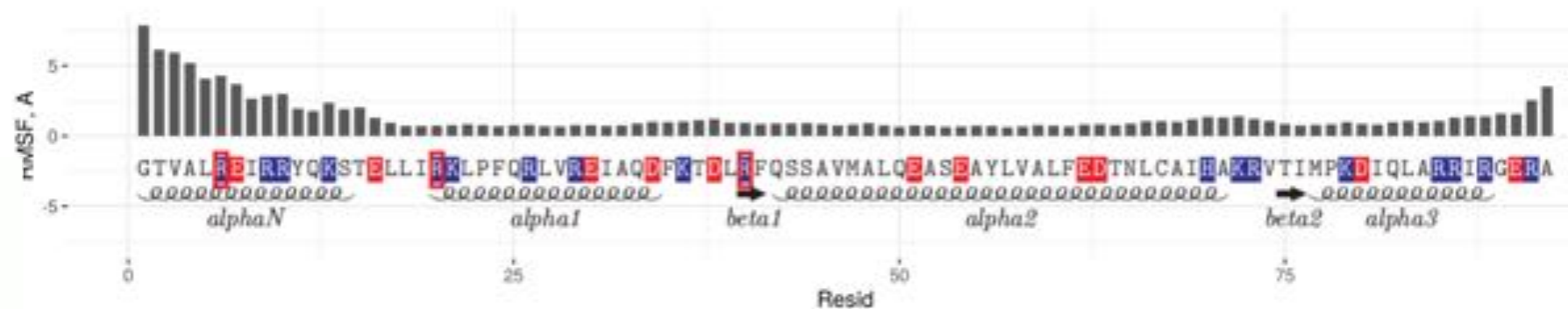
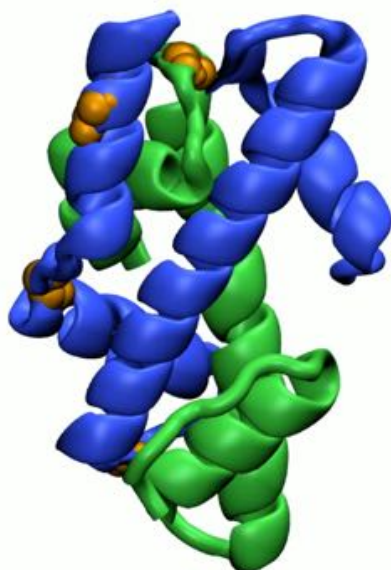
Time: 1.0 ns



$$RMSD = \min_{rot,trans} \sqrt{\frac{1}{N} \sum_{i=1}^N (r_a - r_{a0})^2}$$

MD simulations of H3–H4, tails truncated. PCA eigenv. 1 interp

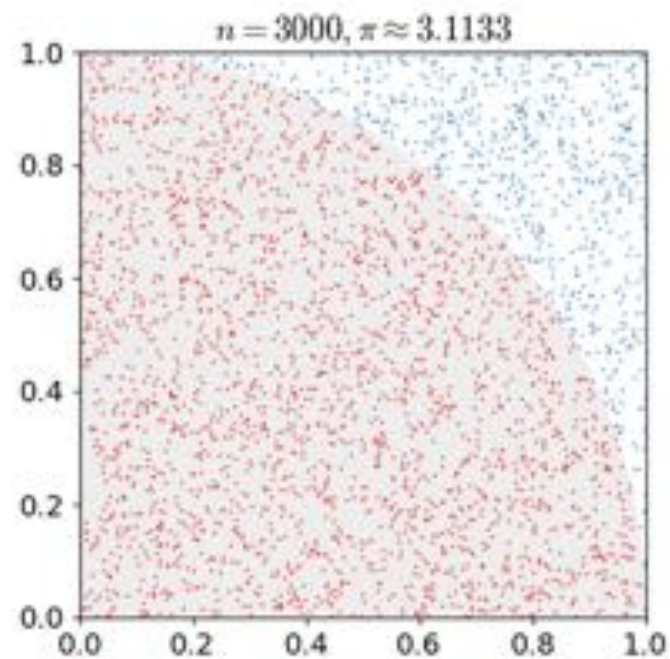
Histones H3  
 Histones H4  
 Histones H2A  
 Histones H2B  
 Min groove ARG  
 DNA  
 AT pairs  
 GC pairs



# Методы Монте-Карло

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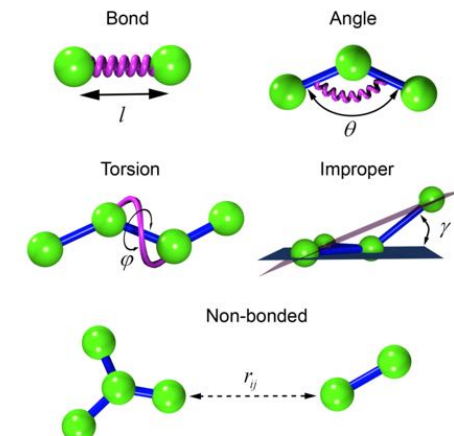
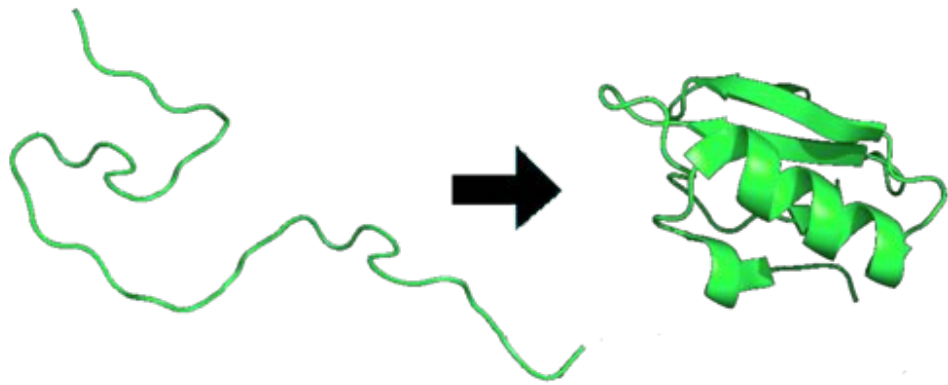
- Решение детерминированных задач с использованием генератора случайных чисел.



Вычисление  
числа Пи

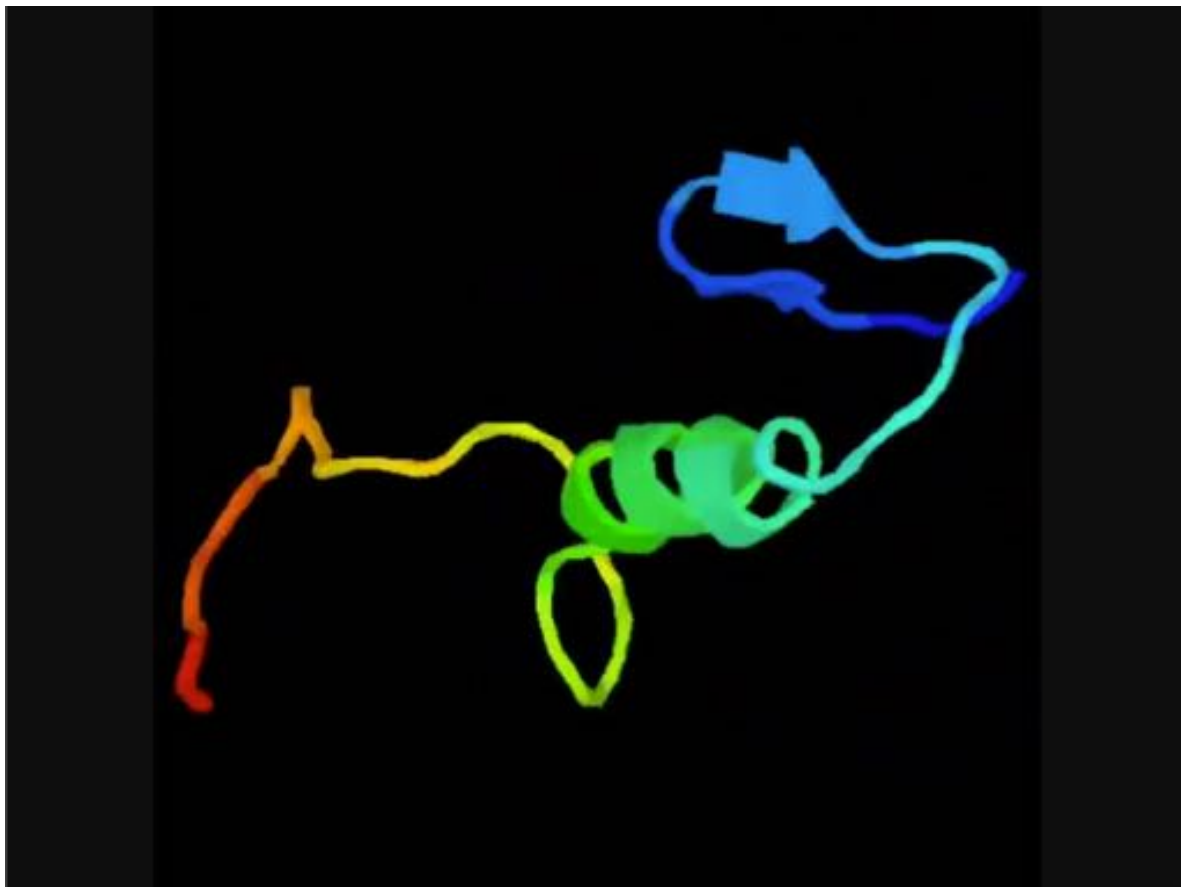


# Распределение Гиббса/Больцмана



$$U(\{\vec{r}_i\}) = \sum_{\text{bonds}} \frac{1}{2} k_b (l - l_0)^2 + \sum_{\text{angles}} \frac{1}{2} k_\theta (\theta - \theta_0)^2 + \sum_{\text{torsions}} \frac{1}{2} V_n [1 + \cos(n\phi - \phi_0)]$$

$$+ \sum_{\text{improper}} \frac{1}{2} k_\gamma (\gamma - \gamma_0)^2 + \sum_{j=1}^{N-1} \sum_{i=j+1}^N \left\{ 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}} \right\} f_{ij}$$



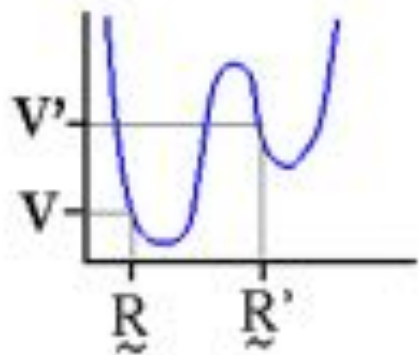
$$P_{\text{microstate}} \propto e^{-\frac{U}{kT}}$$

Распределение Гиббса



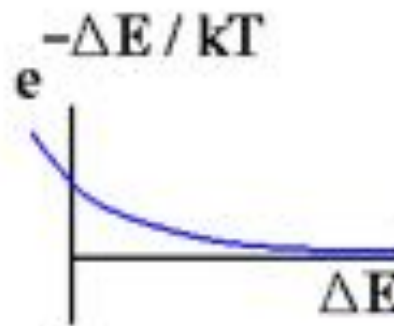
# Алгоритм Метрополиса-Хастингса

MC compares energies. No forces calculated.



In equilibrium at T:

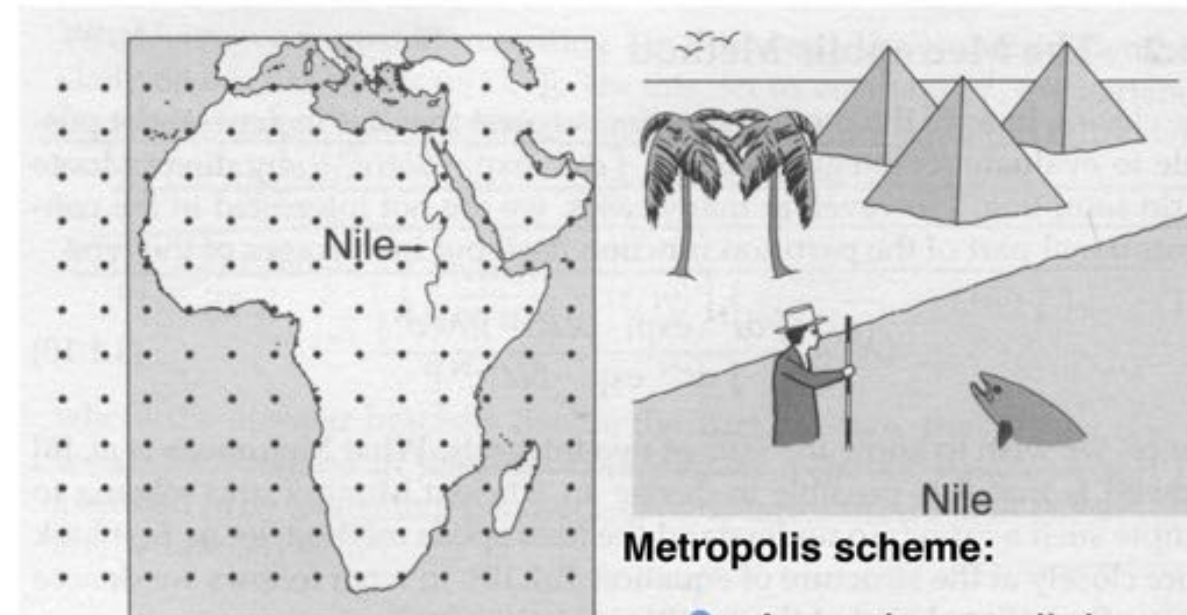
$$\frac{p(E')}{p(E)} = e^{-\frac{(E' - E)}{kT}}$$



$$P_{microstate} \propto e^{-\frac{U}{kT}}$$

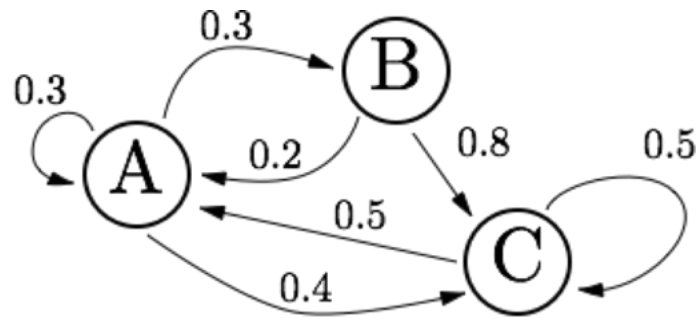
Gibbs distribution

- Prescribes transition probabilities to satisfy detailed balance, given desired limiting distribution
- Recipe:  
From a state  $i$ ...
  - with probability  $\tau_{ij}$ , choose a trial state  $j$  for the move (note:  $\tau_{ij} = \tau_{ji}$ )
  - if  $\pi_j > \pi_i$ , accept  $j$  as the new state
  - otherwise, accept state  $j$  with probability  $\pi_j / \pi_i$   
generate a random number  $R$  on  $(0,1)$ ; accept if  $R < \pi_j / \pi_i$
  - if not accepting  $j$  as the new state, take the present state as the next one in the Markov chain ( $\pi_{ii} \neq 0$ )

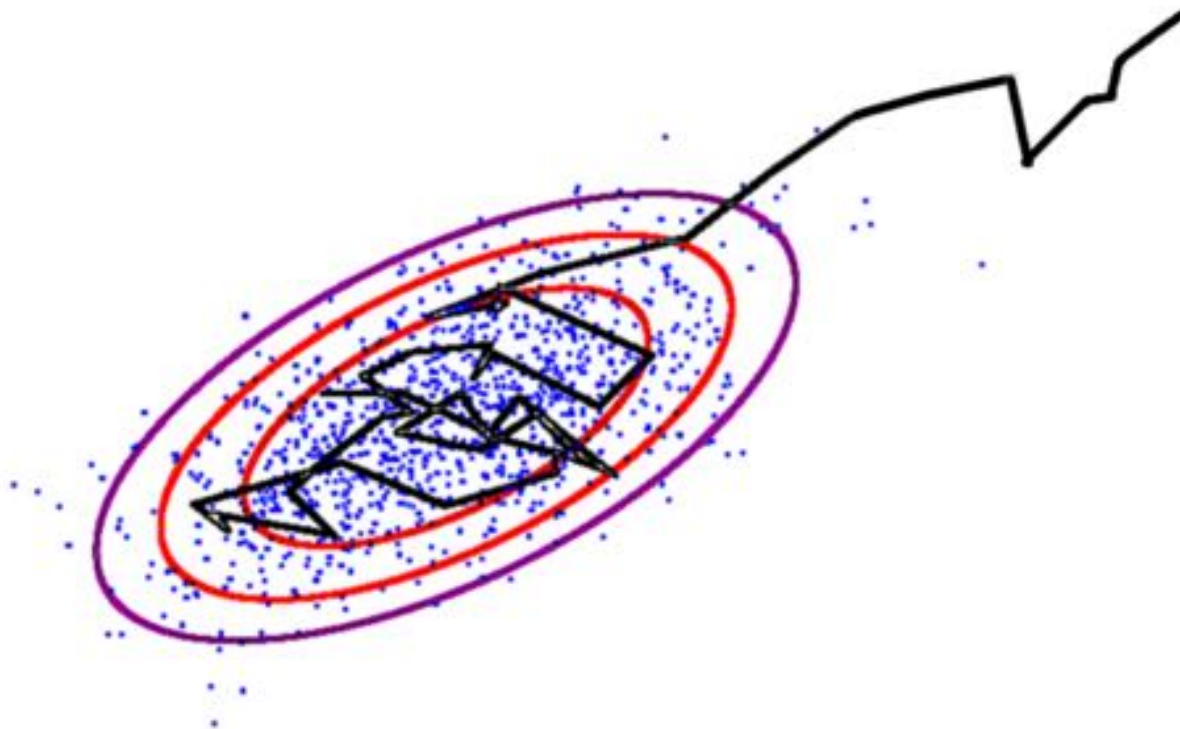




# Markov Chain Monte Carlo (MCMC)



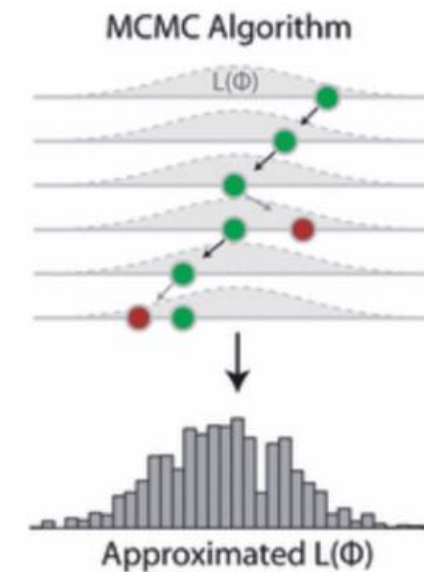
Цепи Маркова



Андрей Андреевич Марков

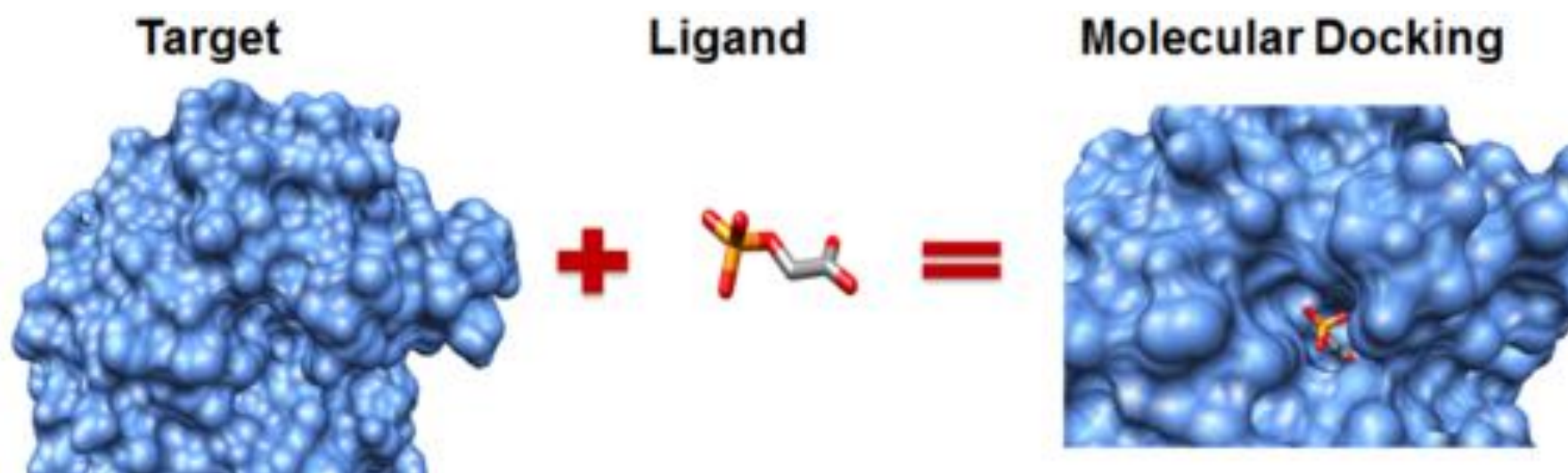


Дата рождения 2 (14) июня 1856 или 14 июня 1856<sup>[1]</sup>  
Место рождения Рязань, Российская империя<sup>[2]</sup>  
Дата смерти 20 июля 1922<sup>[2][1]</sup> (66 лет)  
Место смерти Петроград, РСФСР<sup>[2]</sup>

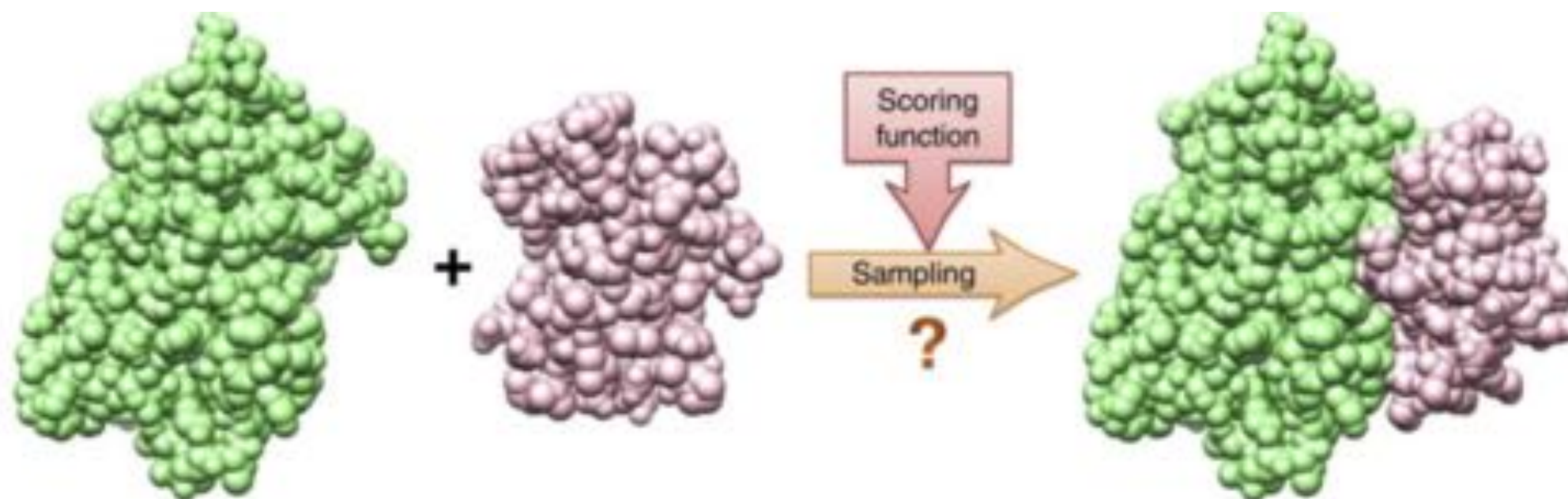


- 1) Draw new parameter  $\Phi'$  close to the old  $\Phi$
- 2) Calculate  $L(\Phi')$
- 3) Jump proportional to  $L(\Phi')/L(\Phi)$

# Методы докинга



## Докинг лигандов

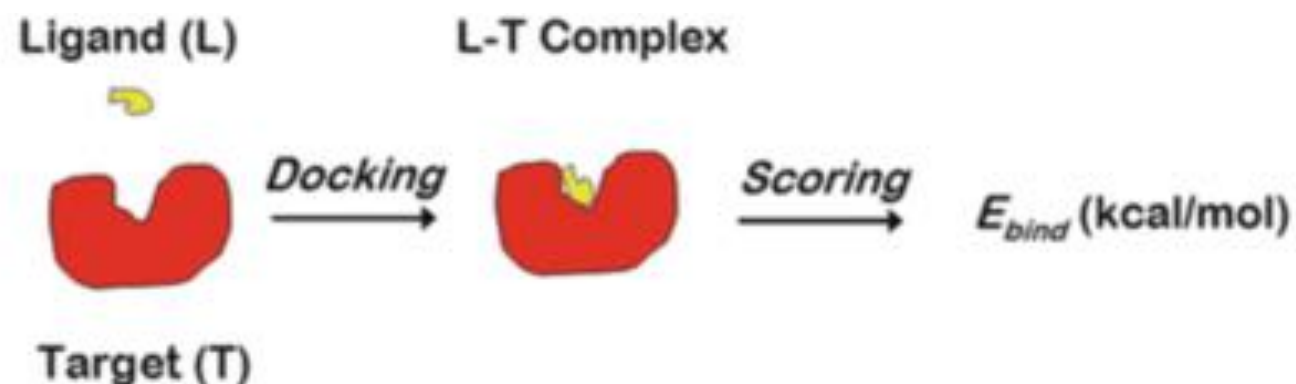


*Drug Discovery Today*

## Белок-белковый докинг

# Методы докинга: функции скоринга

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## 1. Molecular mechanics force field-based scoring function:

$$E_{bind} = \sum_{i=1}^{lig} \sum_{j=1}^{rec} \left( \frac{A_{ij}}{r_{ij}^{12}} - \frac{B_{ij}}{r_{ij}^6} + 332 \frac{q_i q_j}{\epsilon_0 r_{ij}} \right)$$

## 2. Empirical scoring function:

$$E_{bind} = E_0 + E_{hb} \sum_{hb} f(\Delta R, \Delta \alpha) + E_{ionic} \sum_{ionic} f(\Delta R, \Delta \alpha) + E_{lipo} \sum_{lipo} |A_{lipo}| + E_{rot} NROT$$

## 3. Knowledge-based scoring function:

$$E_{bind} = \gamma \sum_{i=1}^{lig} \sum_{j=1}^{rec} E_{ij}(r) + (1 - \gamma) \times \left[ \sum_{i=1}^{lig} E_i(SASA, SASA_0) + \sum_{j=1}^{rec} E_j(SASA, SASA_0) \right]$$

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# История и некоторые примеры

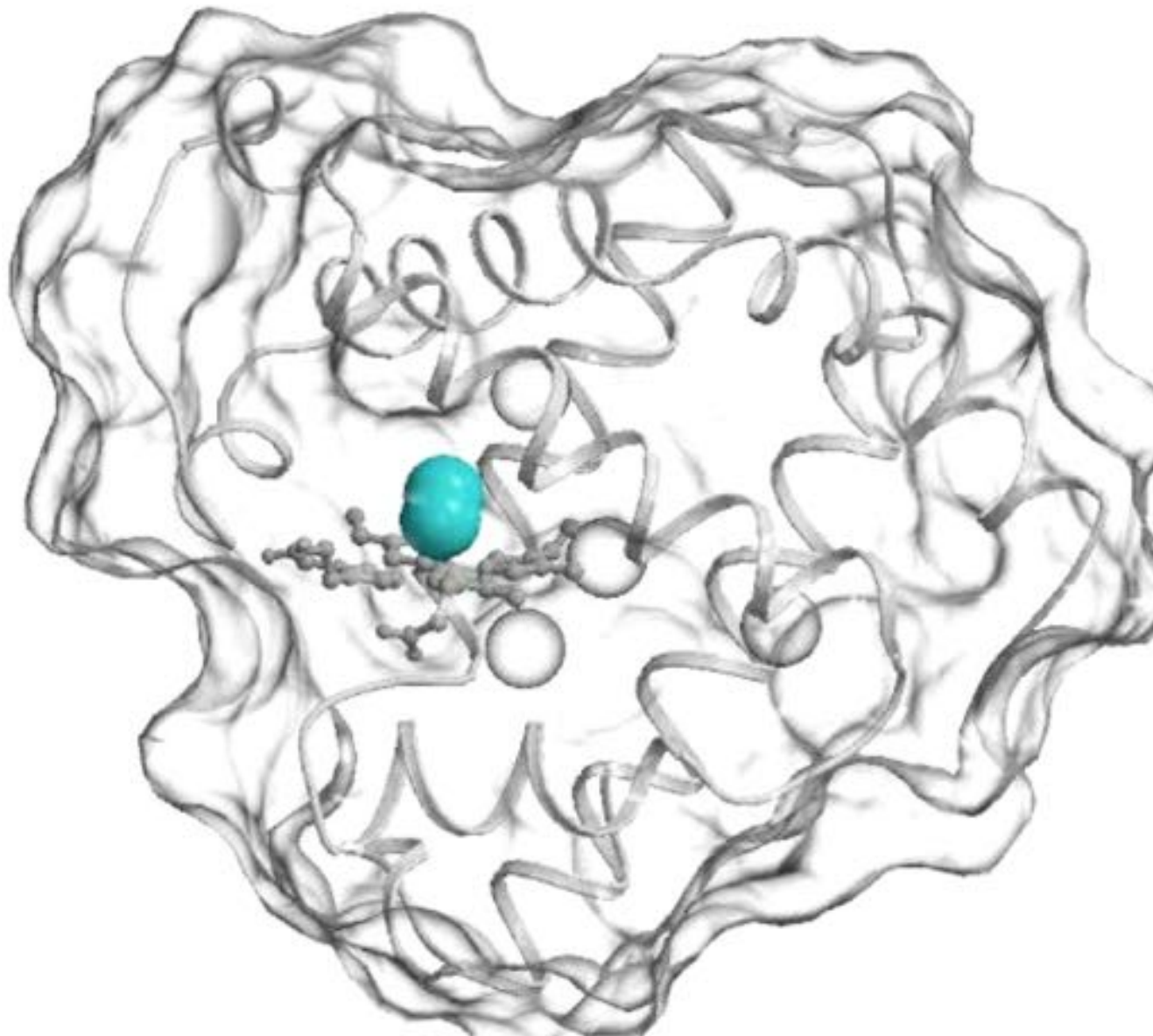
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- **1953** – Metropolis, N.; Rosenbluth, A.W.; Rosenbluth, M.N.; Teller, A.H.; Teller, E. "Equations of State Calculations by Fast Computing Machines", JCC, **Monte-Carlo Method used for particle simulations**
- **1957** - Alder, B. J.; T. E. Wainwright (1959). "Studies in Molecular Dynamics. I. General Method". *J. Chem. Phys.* **31** (2): 459 – **First MD simulations**
- **1975** - M. Levitt & A. Warshel, "**Computer simulation of protein folding**", Nature
- **1979** - **Dynamics of ligand binding to heme protein**, DA Case, M Karplus *J Mol Biol*
- **1983** - Brooks BR, Bruccoleri RE, Olafson BD, States DJ, Swaminathan S, Karplus M (1983). "CHARMM: A program for macromolecular energy, minimization, and dynamics calculations". *J Comp Chem* **4** (2): 187–217.
- **1988** - M Levitt and R Sharon "Accurate simulation of protein dynamics in solution"  
**First MD in explicit solvent**



# История и некоторые примеры

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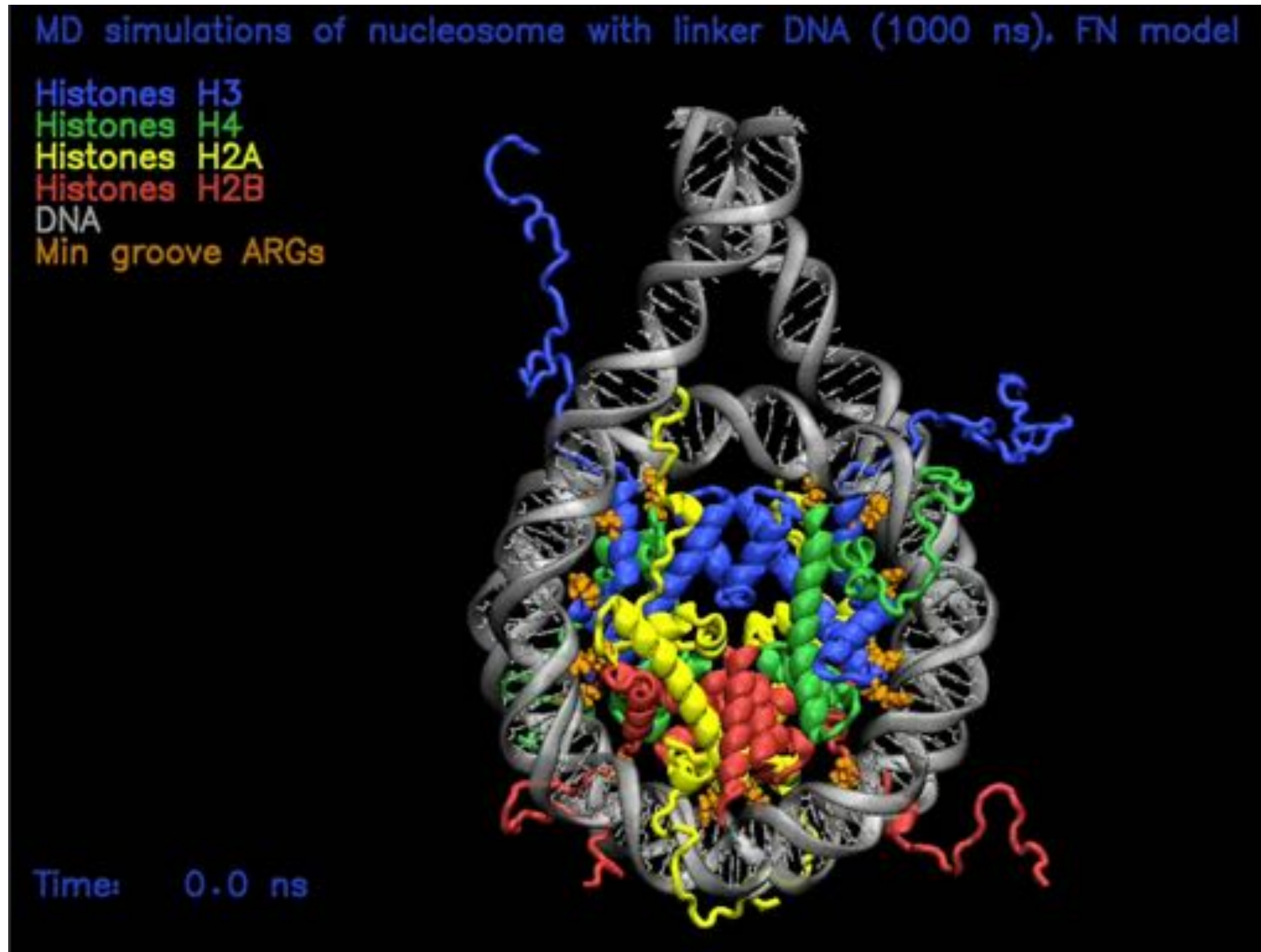
Диффузия  
СО через  
порталы в  
миоглобине

**PNAS** Atomic level computational identification of ligand migration pathways between solvent and binding site in myoglobin

Jory Z. Ruscio<sup>a</sup>, Deepth Kumar<sup>a</sup>, Maulik Shukla<sup>a</sup>, Michael G. Prisant<sup>a</sup>, T. M. Murali<sup>b</sup>, and Alexey V. Onufriev<sup>a,c</sup>  
<sup>a</sup>Genetics, Bioinformatics, and Computational Biology Program and Departments of <sup>b</sup>Computer Science and <sup>c</sup>Physics, Virginia Polytechnic Institute and State University, Blacksburg, VA 24061; and <sup>d</sup>Department of Biochemistry, Duke University Medical Center, Durham, NC 27710  
Edited by Robert L. Baldwin, Stanford University Medical Center, Stanford, CA, and approved March 25, 2008 (received for review November 15, 2007)



# История и некоторые примеры



## Нуклеосомы



# История и некоторые примеры

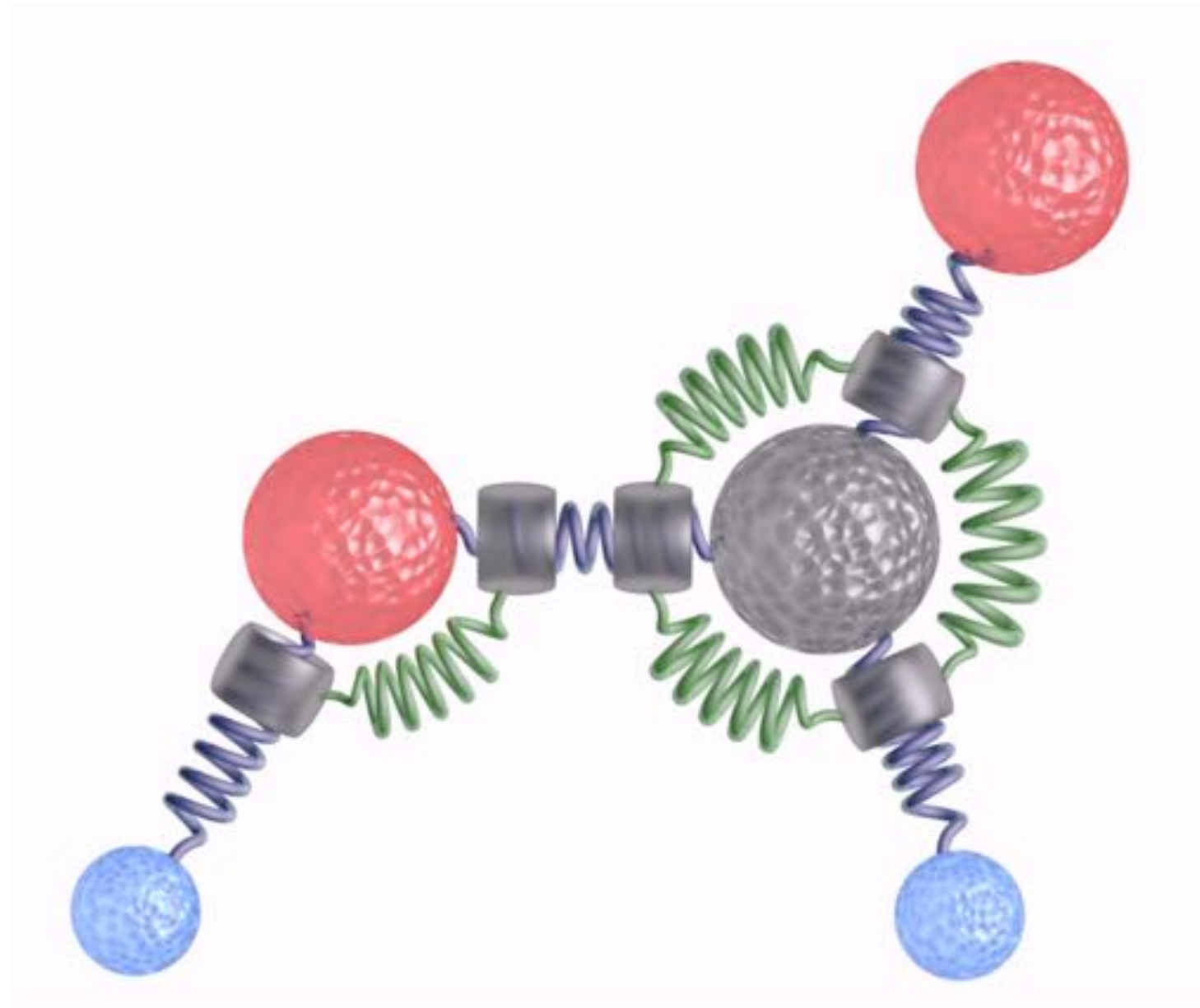


Ионные  
каналы

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# Thanks for your attention!

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# Suggested reading:

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## Text books:

- D. Frenkel, B. Smit, “Understanding Molecular Simulation, Second Edition: From Algorithms to Applications”

## Reviews:

- Dror RO, Dirks RM, Grossman JP, Xu H, Shaw DE, “Biomolecular simulation: a computational microscope for molecular biology“, Annu Rev Biophys. 2012;41:429-52

## Useful papers:

- Wlodawer A, Minor W, Dauter Z, Jaskolski M., “Protein crystallography for non-crystallographers, or how to get the best (but not more) from published macromolecular structures”, FEBS J. 2008 Jan;275(1):1-21

## Web links:

- NAMD <http://www.ks.uiuc.edu/Research/namd/>
- VMD <http://www.ks.uiuc.edu/Research/vmd/>
- AMBER <http://ambermd.org>
- CHARMM <http://www.charmmtutorial.org>
- GROMACS <http://www.gromacs.org>
- LAMMPS <http://lammps.sandia.gov>