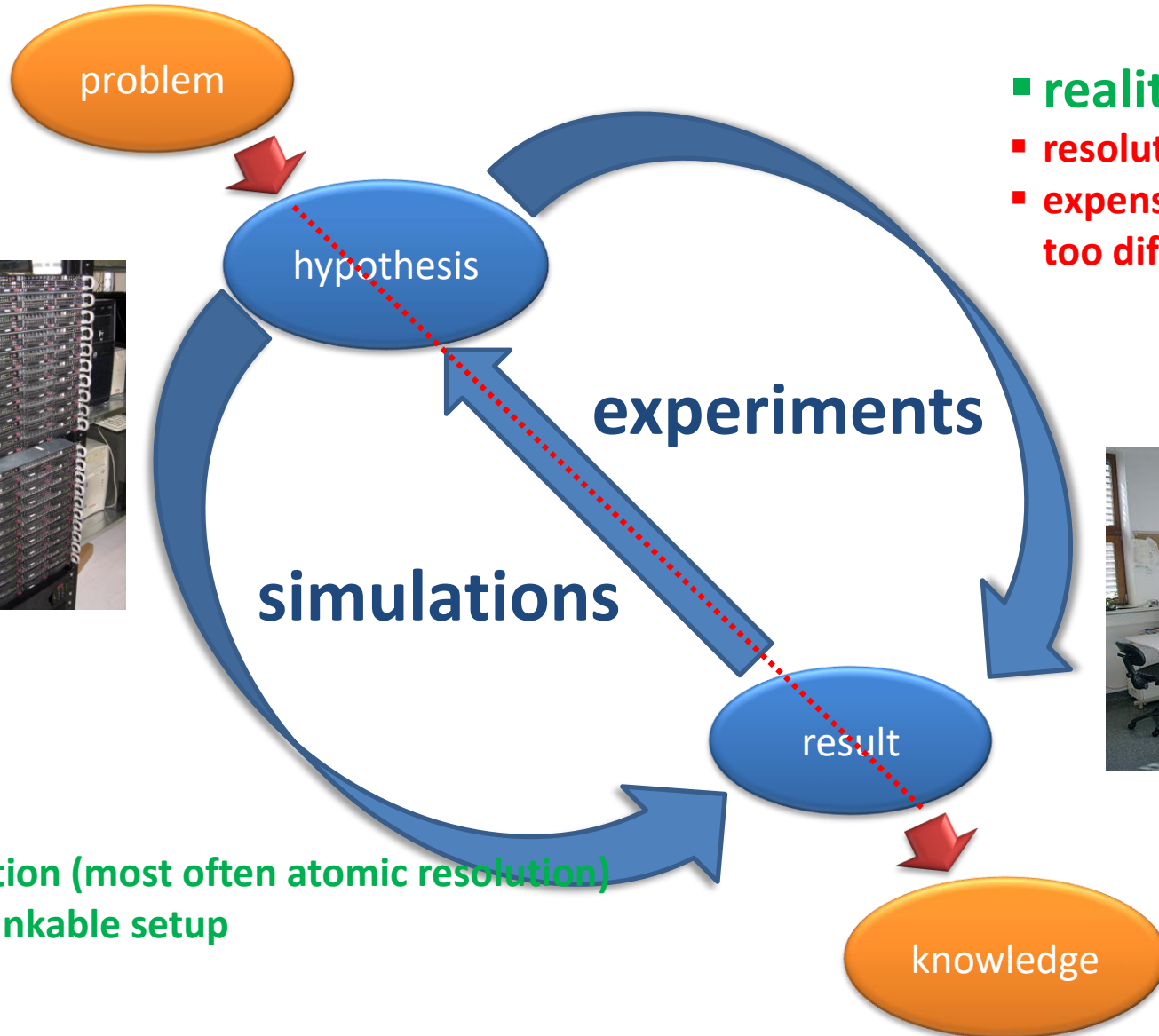


**CEITEC**  
**Central European Institute of Technology**  
**Brno, Czech Republic**

**Chemo part of Glycoinformatics:  
Molecular Modeling**

Jaroslav Koča  
([jkoca@ceitec.cz](mailto:jkoca@ceitec.cz))

# Experiment vs Simulations

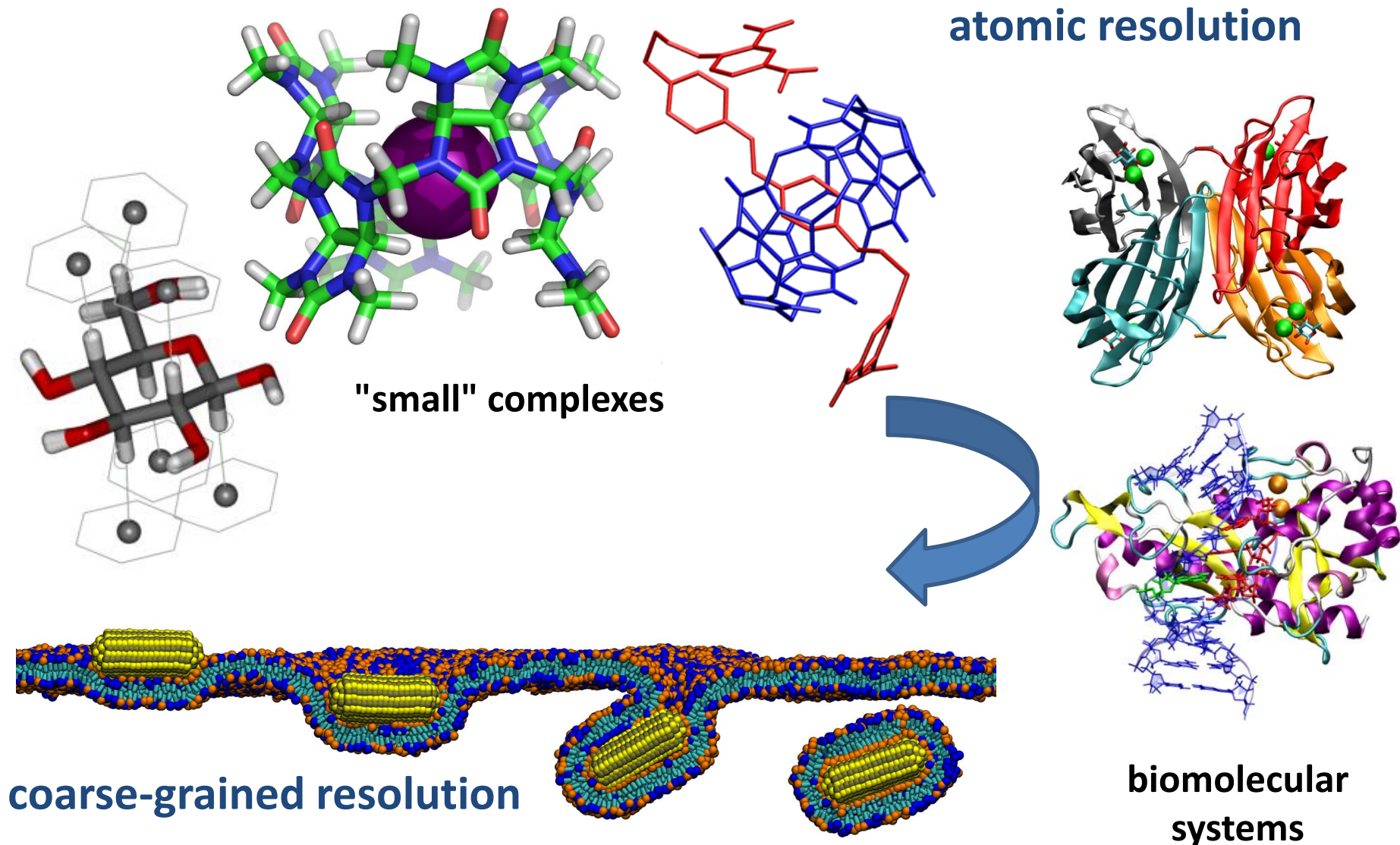


- reality around us
- resolution
- expensive, dangerous, too difficult to carry out

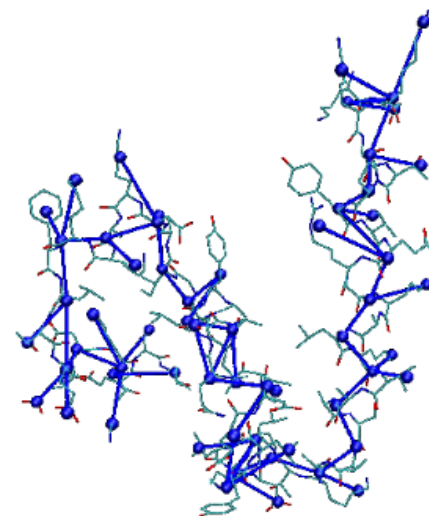
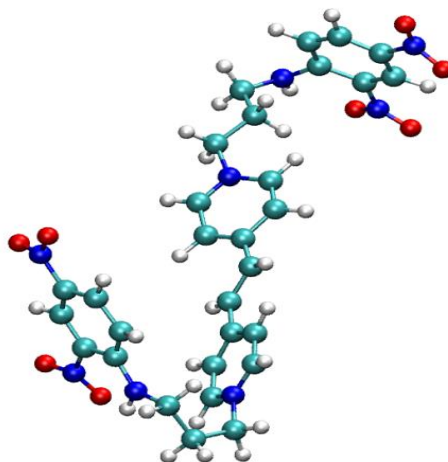
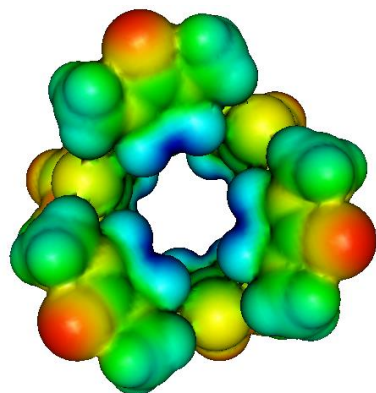


- resolution (most often atomic resolution)
- any thinkable setup
- model

# What can be studied?



# Levels of Theory



**Quantum Mechanics**

**Molecular Mechanics**

***Coarse-grained* Mechanics**

Atomic Resolution

Bead Resolution

reactivity

conformational movement

domain movement, folding

up to 1'000 atoms

up to 1'000'000 atoms

up to 1'000'000 beads

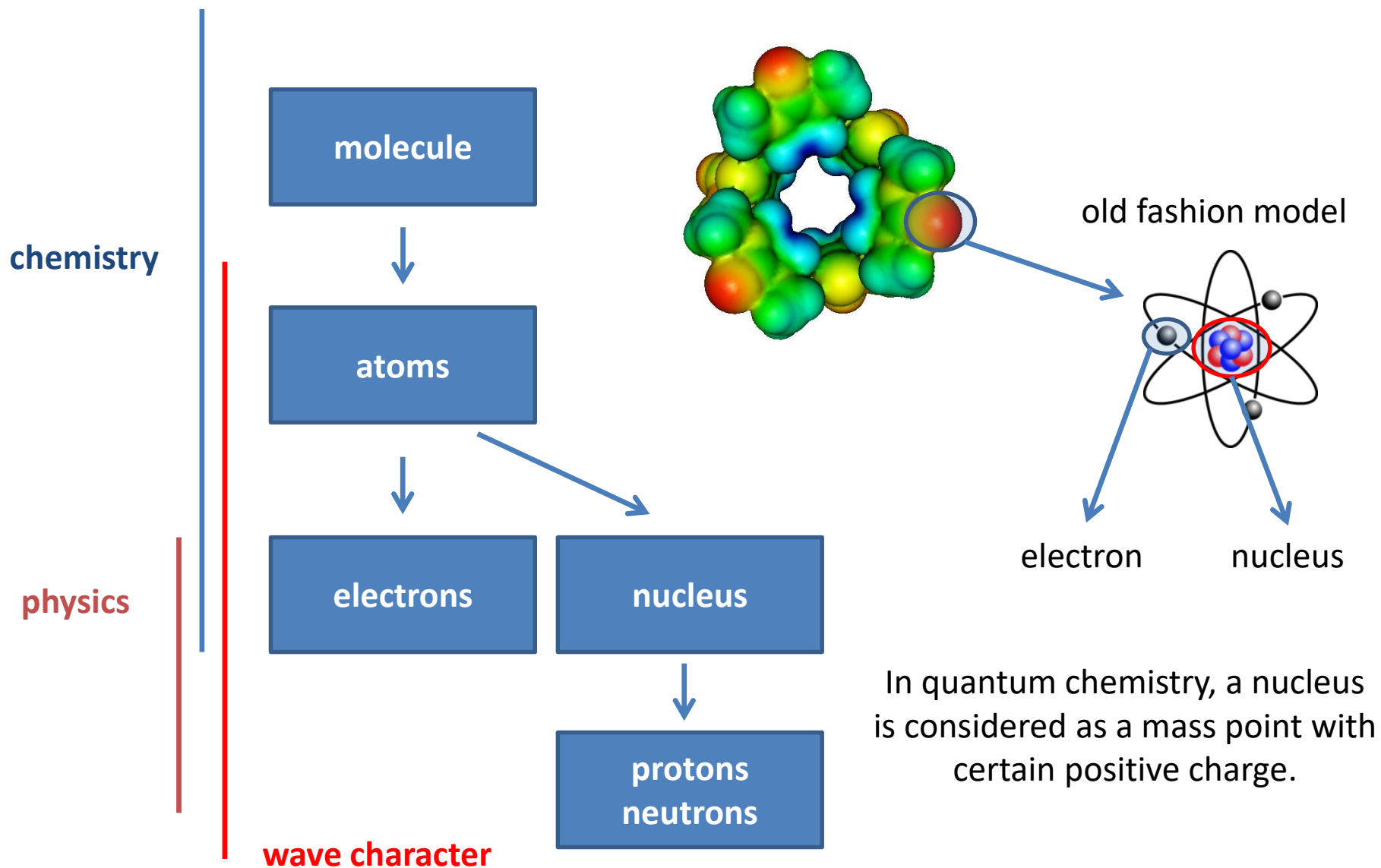
up to 100 ps

up to  $\mu$ s

up to ms

# Quantum Mechanics

# Composition of Molecules



# Schrödinger Equation

Due to **wave character of particles** (electrons and nuclei) it is necessary to solve the **Schrödinger equation**. Its **time dependent** version is however very difficult to solve and moreover it **does not provide** any information about **energy** of studied system due to the uncertainty principle. This can be overcome by neglecting time and introducing so called stationary states.

The **time-independent** Schrödinger equation:

$$\hat{H} \psi_k(\mathbf{r}) = E_k \psi_k(\mathbf{r})$$

**Hamilton operator**

(it defines a **system**, etc. number of particles and their mutual interactions)

**wavefunction**

(it determines a **state** of the system)

(positions of electrons and nuclei)

+ the **energy** of state

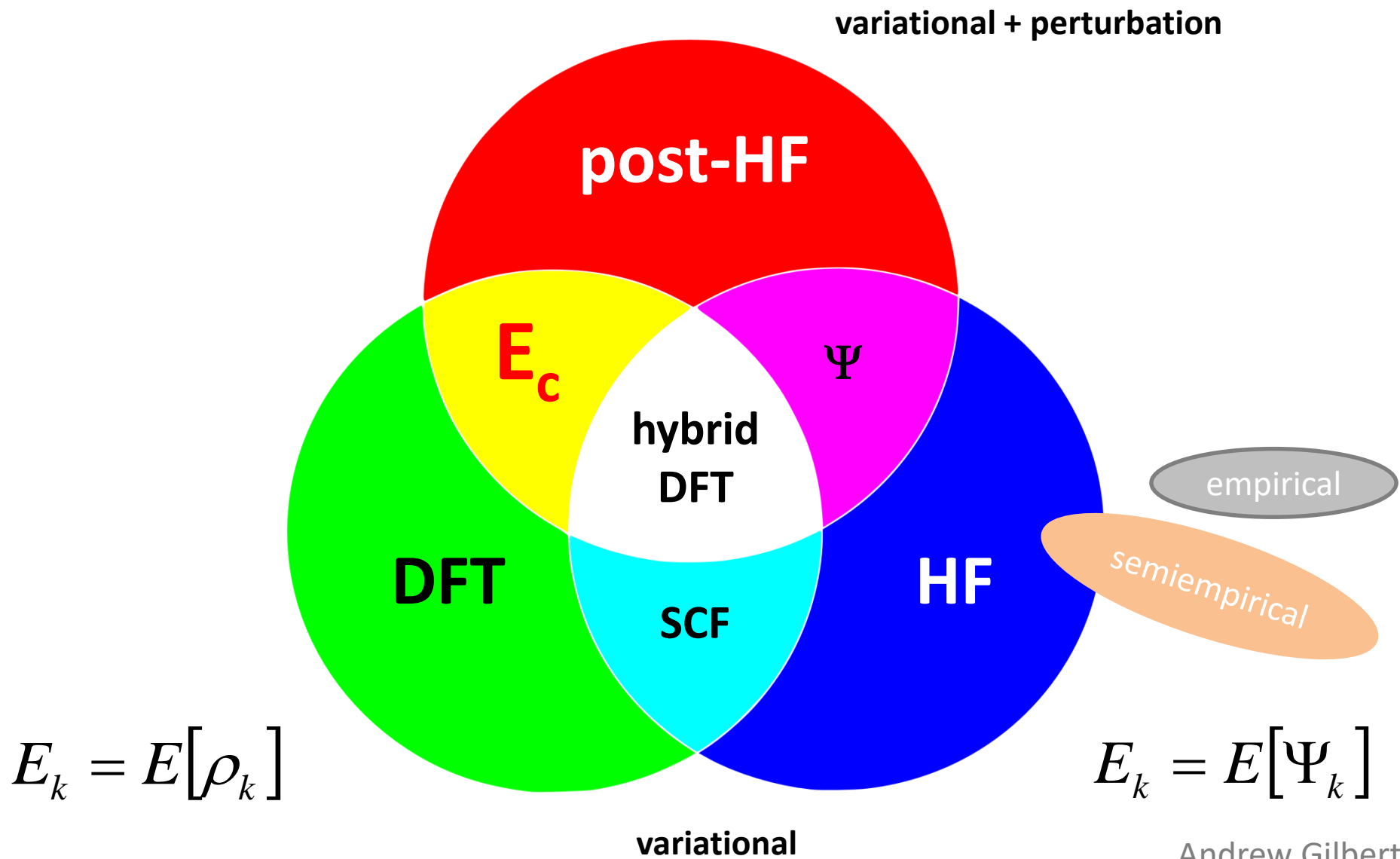
**Solutions are couples:**  $\psi_k$  and  $E_k$ . They represent full description of **allowed system stationary states** and their energies.

# Basic Approximations

Even **time-independent** Schrödinger equation is very difficult to solve for "large" molecular systems (two and more atoms, two and more electrons). Therefore several fundamental approximations were introduced in the past:

- **Born-Oppenheimer approximation** – separation of motions of nuclei and electrons, which provides energy of the system as a function of atomic coordinates (PES - **potential energy surface**)
- **One-electron approximation** – it allows to solve SE of many-electron systems at all but it also introduces a **significant error** that is called the **correlation energy**
- **MO-LCAO** – approximate description of one-electron wavefunction as a linear combination of atomic orbitals (basis functions). It can provide an exact solution in the limit of **complete basis set**.

# Classifications of Methods

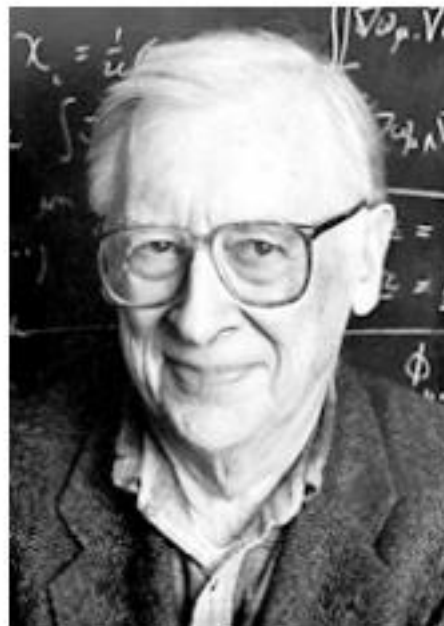


Andrew Gilbert

# The Nobel Prize in Chemistry 1998



Walter Kohn



John A. Pople

The Nobel Prize in Chemistry 1998 was divided equally between **Walter Kohn** "for his development of the **density-functional theory**" and **John A. Pople** "for his development of **computational methods in quantum chemistry**"

[http://www.nobelprize.org/nobel\\_prizes/chemistry/laureates/1998/](http://www.nobelprize.org/nobel_prizes/chemistry/laureates/1998/)

# Computational Complexity

Formal Scaling	Methods			
	HF	CI metods	MP metods	CC metods
$N^4 \rightarrow N^2 \rightarrow N^1$	HF, DFT			
$N^5$			MP2	CC2 (iterative)
$N^6$		CISD	MP3, MP4(SDQ)	CCSD (iterative)
$N^7$			MP4	CCSD(T), CC3 (iterative)
$N^8$		CISDT	MP5	CCSDT
$N^9$			MP6	
$N^{10}$		CISDTQ	MP7	CCSDTQ (iterative)

## Legend

**HF** – Hartree-Fock method

**DFT** – density functional theory methods

**CI** – configuration interaction methods

**MP** - Møller–Plesset perturbation methods

**CC** – coupled cluster methods

$N$  – number of basis functions

$$N \approx N_A \overline{N_{BF}}$$

Methods highlighted in the box can provide results, which include part of omitted correlation energy.

# Complexity & Accuracy

Formal Scaling	Methods			
	HF	CI metods	MP metods	CC metods
$N^4 \rightarrow N^2 \rightarrow N^1$	HF, DFT			
$N^5$			MP2	CC2 (iterative)
$N^6$		CISD	MP3, MP4(SDQ)	CCSD (iterative)
$N^7$			MP4	CCSD(T), CC3 (iterative)
$N^8$		CISDT	MP5	CCSDT
$N^9$			MP6	
$N^{10}$		CISDTQ	MP7	CCSDTQ (iterative)

$N$  – number of basis functions

$$N \approx N_A \overline{N_{BF}}$$

**Coupled cluster methods** are able to reach **chemical accuracy** but only for small molecules.

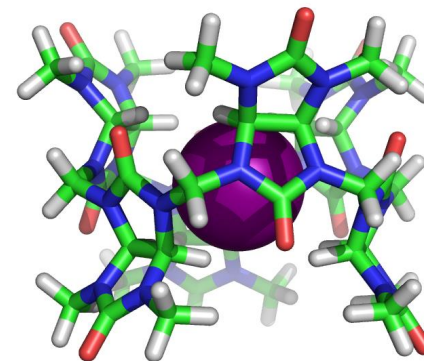
On currently available hardware, it is possible to apply the CCSD(T) method to systems containing up to **50 atoms**.

# Accuracy

## Small Numbers from Big Numbers

### RI-BLYP-d3/def2-TZVPP (vacuum)

BU6/I (-)	-4152.181032604	Hartree
BU6	-3854.321084579	Hartree
I (-)	-297.740268591	Hartree
-----		
	-0.119679434	Hartree
	~ -75.1	kcal/mol



bambus[6]uril/anion interaction  
(139 atoms)

## "Chemical" Accuracy

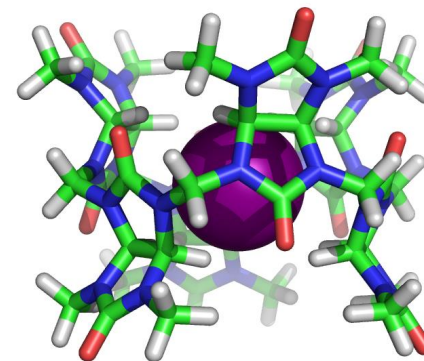
error < 1 kcal mol<sup>-1</sup>

# Accuracy

## Small Numbers from Big Numbers

### RI-BLYP-d3/def2-TZVPP (vacuum)

BU6/I (-)	-4152.181032604	Hartree
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bambus[6]uril/anion interaction  
(139 atoms)

## "Chemical" Accuracy

error < 1 kcal mol<sup>-1</sup>

# Take Home Message

## Quantum Mechanics

- **due to dual character** (particles/waves) of electrons and nuclei, any chemical system has to be described by the **Schrödinger equation** (SE)
- albeit very simple notation of SE, its **analytical** solution is not impossible even for simple chemical systems (two and more electrons)
- **several approximations** were introduced that make **numerical** solution of SE possible but some of them introduces very **serious errors** (correlation energy)
- it is possible to fix these errors but procedures are very **computationally demanding** even for small systems (up to 50 atoms)
- once **approximate solution** of SE is known then **any property** (including energy) can be easily obtained from **wavefunction of given state**
- SE is naturally able to describe **chemical reactions**

# Molecular Mechanics

Can we make calculations faster?

# Molecular Mechanics

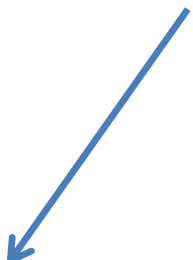
Schrodinger equation - quantum mechanical description

$$\hat{H} \psi_k^{\mathbf{R}}(\mathbf{r}_e) = E_k(\mathbf{R}) \psi_k^{\mathbf{R}}(\mathbf{r}_e)$$

approximation

electron motions is omitted

(electron motions is implicitly included in empirical parameters)


$$E_k(\mathbf{R}) = \underbrace{E_{bonds} + E_{angles} + E_{torsions}}_{\text{bonded contributions}} + \underbrace{E_{ele} + E_{vdw} + \dots}_{\text{non-bonded contributions}}$$

bonded contributions

non-bonded contributions

Classical physics - mechanical description

# Bonded Contributions

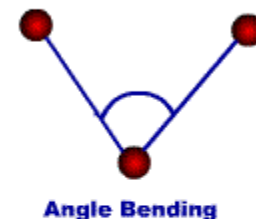
## Bonds

$$E_{bonds} = \sum_{b=1}^{bonds} \frac{1}{2} K_b (d_b - d_{b0})^2$$



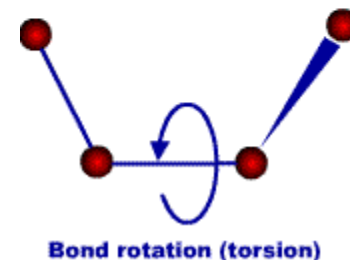
## Angles

$$E_{angles} = \sum_{a=1}^{angles} \frac{1}{2} K_a (\theta_a - \theta_{a0})^2$$



## Torsion angles

$$E_{torsions} = \sum_{t=1}^{torsions} \sum_n \frac{V_{t,n}}{2} (1 + \cos[n\varphi_t - \delta_{t,n}])$$

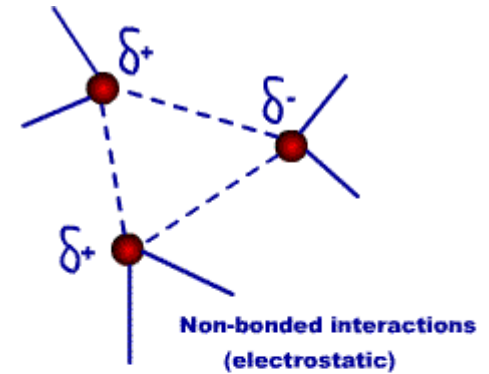


 empirical parameters

# Non-bonded Contributions

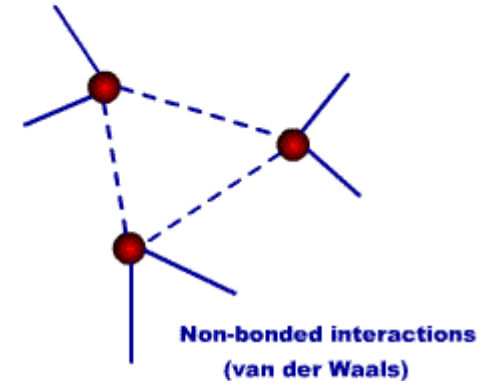
## Electrostatic interactions

$$E_{ele} = \sum_{i=1}^N \sum_{j=i+1}^N \frac{1}{4\pi\epsilon_o} \frac{q_i q_j}{r_{ij}}$$



## van der Waals interactions

$$E_{ele} = \sum_{i=1}^N \sum_{j=i+1}^N 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^6 \right]$$



PME – particle meshed Ewald ( $N \log_2 N$ )

$N$  – number of atoms

 empirical parameters

# Take Home Message

## Molecular Mechanics

- based on **classical mechanics**, **accuracy is compromised**
- **empirical parameters (parameter set, force field)** derived from experimental or high-level QM calculations are required
- **parameter transferability problems**, parameters are derived for limited set of systems (proteins, nucleic acids, lipids, saccharides, etc), no general parameter set yet
- **very fast calculations** of systems containing up to millions of atoms
- electrons are not explicitly accounted in the theory thus it is **not possible** to describe **chemical reaction** (exceptions: ReaxFF, EVB)
- suitable for study of **conformational changes and structure**

# Potential Energy Surface

# Configuration Space

$E(\mathbf{R})$

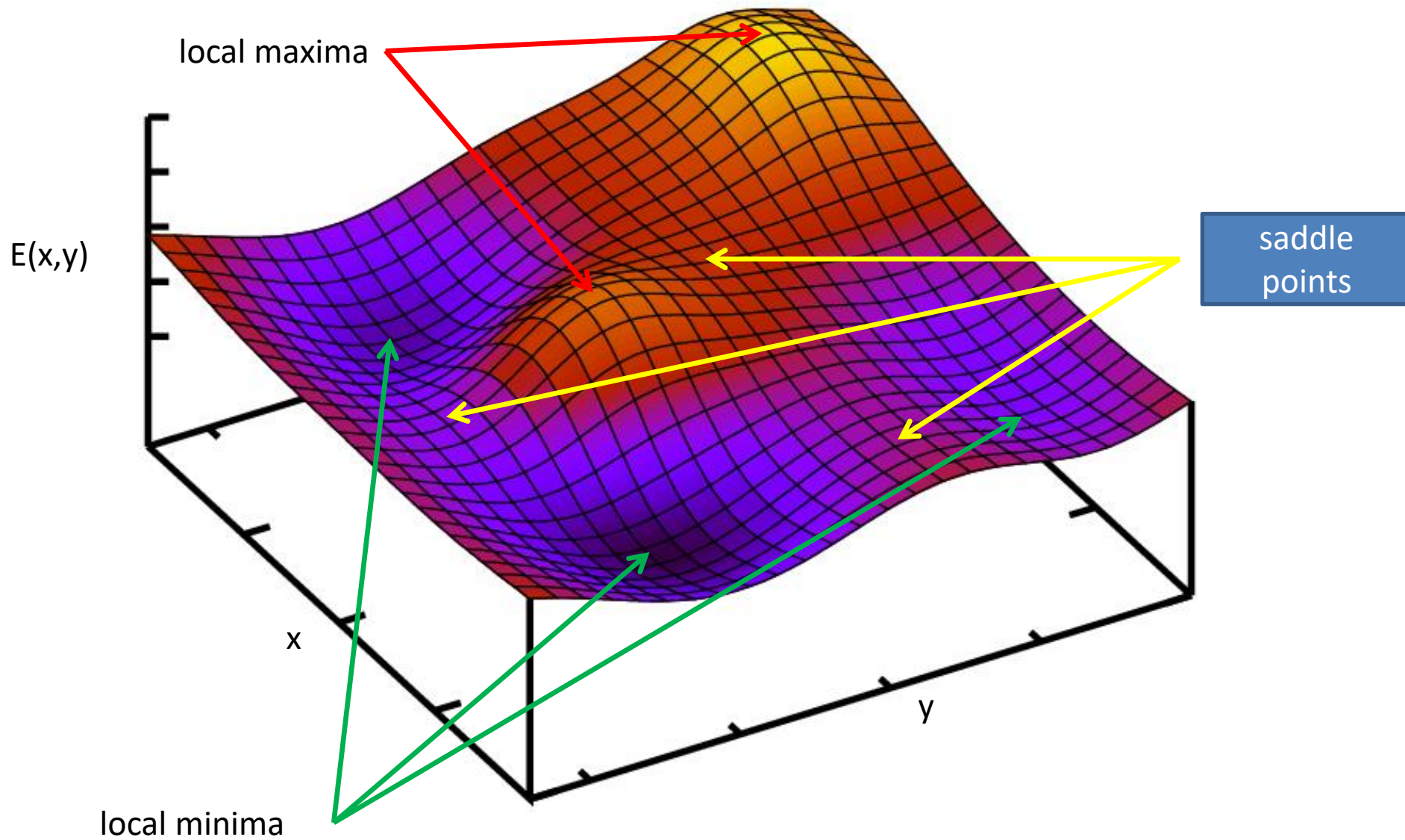
$\mathbf{R}$  = point in 3N-dimensional space (N is number of atoms)

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

Cartesian coordinates  
of the first atom

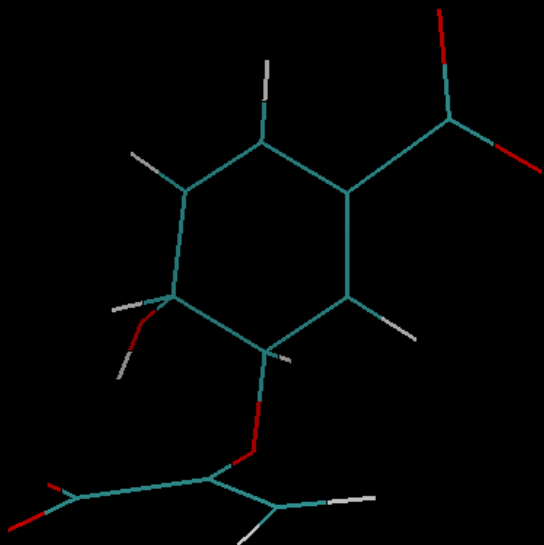
Individual points form the **configuration space**.  
**Every point** in the configuration space represents  
a **unique structure** of studied system.

# Two-dimensional Case

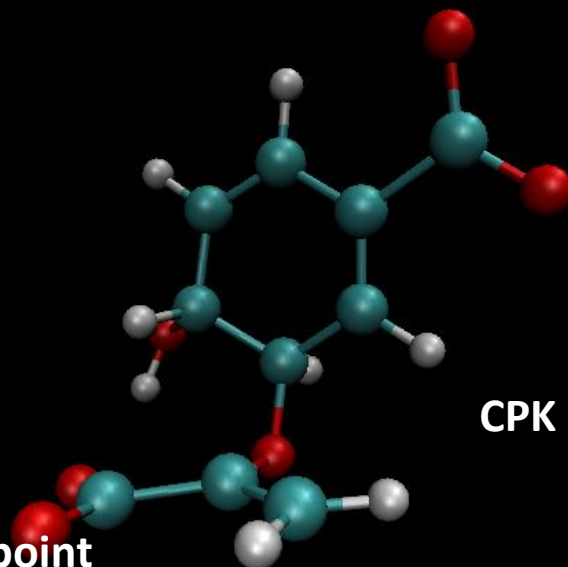


# Models – small molecules

lines

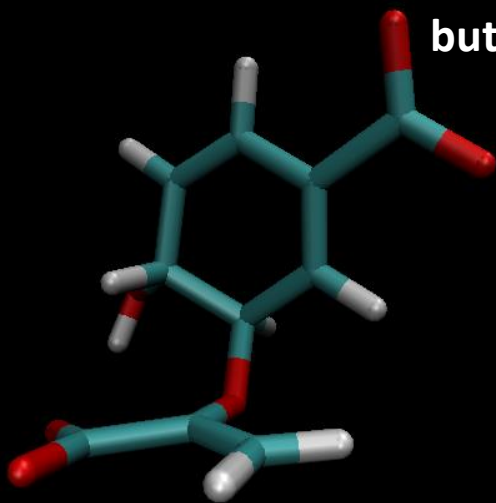


CPK model

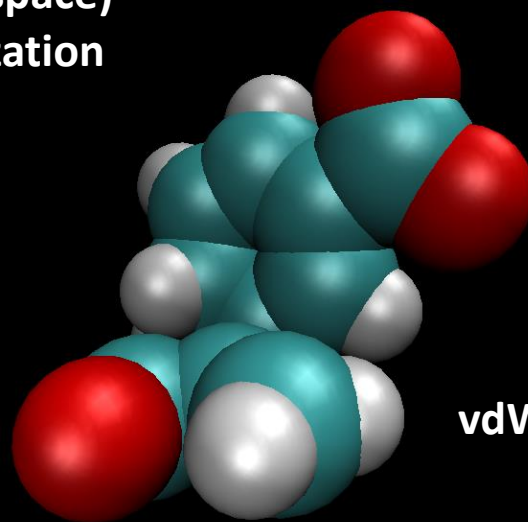


the same structure (point  
in the configuration space)  
but different visualization

tubes

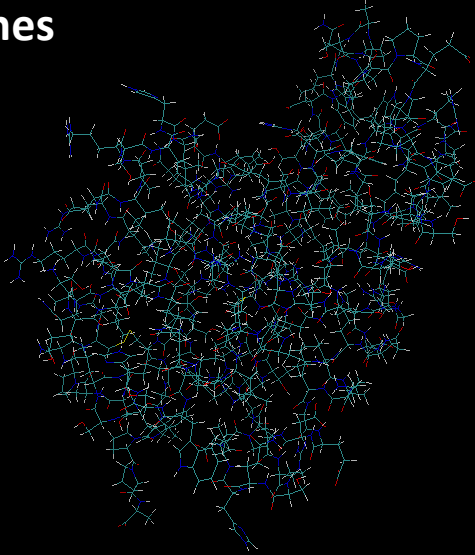


vdW model

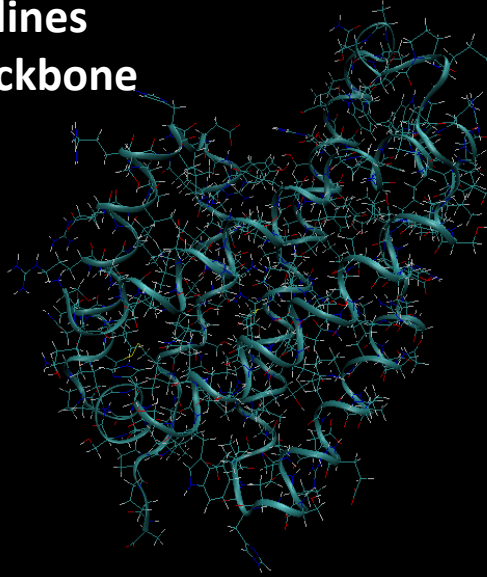


# Models – biomolecules

lines



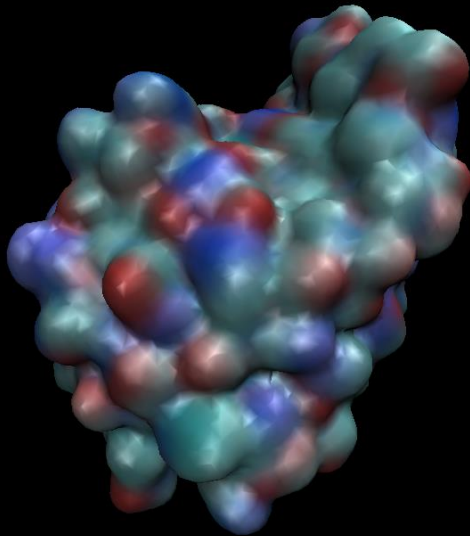
lines  
backbone



cartoon model



**the same structure (point  
in the configuration space)  
but different visualization**



surface

Different visualization models are used to depict various structural features or internal properties of molecules or molecular assemblies, which then improve perceptions of studied systems/problems.

# Take Home Message

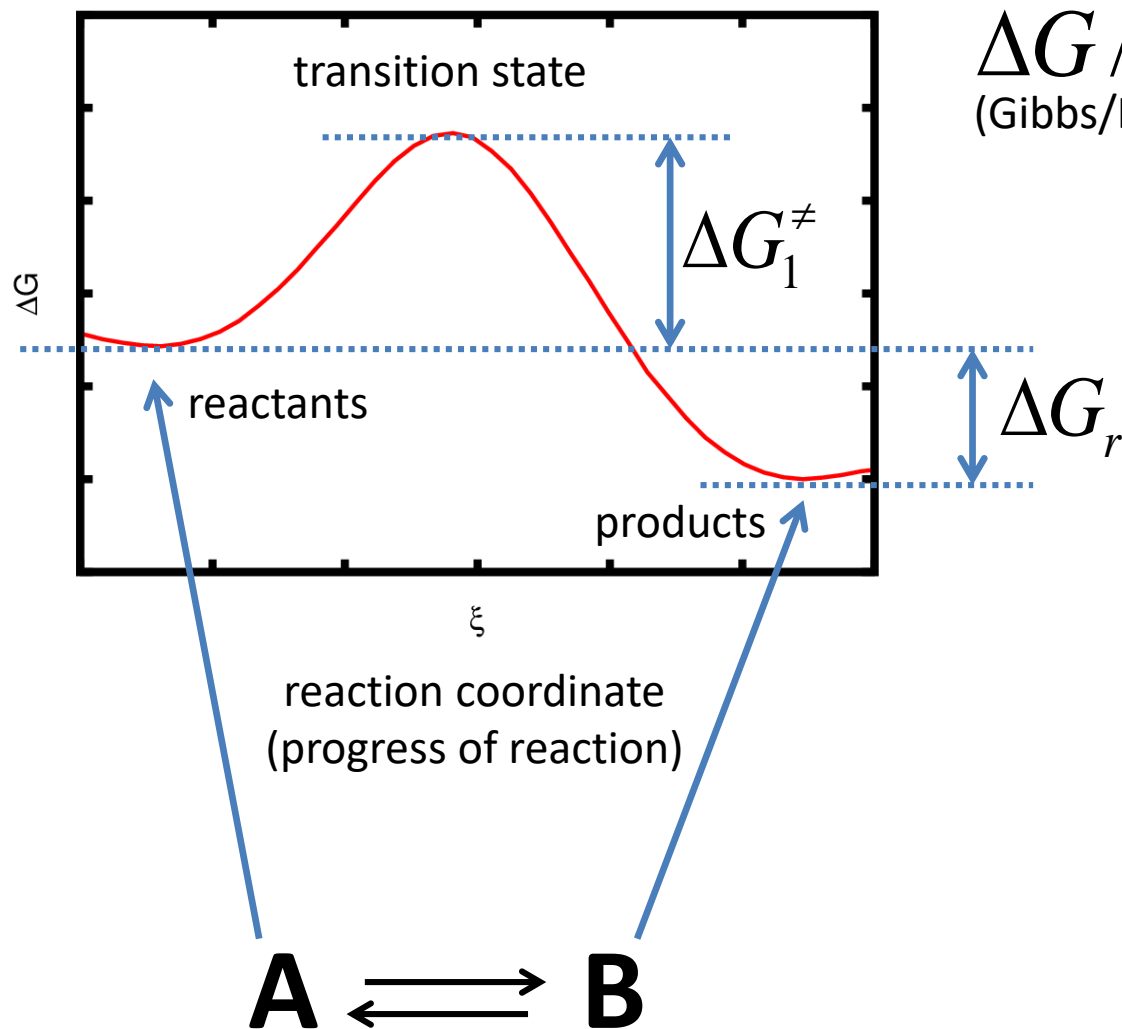
## Potential Energy Surface

- stationary points (**local minima** and **saddle points**) are very important for description of reactivity and kinetics of small molecular systems
- stationary points represents **unique structures** of molecular system

# Macroscopic Systems

Back to origin of our interest ...

# Thermodynamics & Kinetics



$\Delta G / \Delta A$  is change of the free energy  
(Gibbs/Helmholtz energy)

$$k = \kappa \frac{k_B T}{h} e^{-\frac{\Delta G^\ddagger}{RT}}$$

rate constant

equilibrium constant

$$\Delta G_r = -RT \ln K$$

# PES vs Free Energy

Gibbs (free) energy

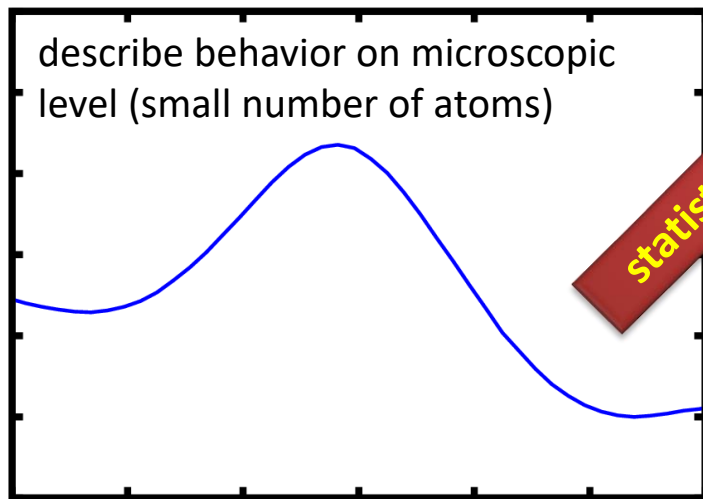
potential energy (QM, MM)

$E(R)$

PES – Potential Energy Surface

describe behavior on microscopic level (small number of atoms)

$E$

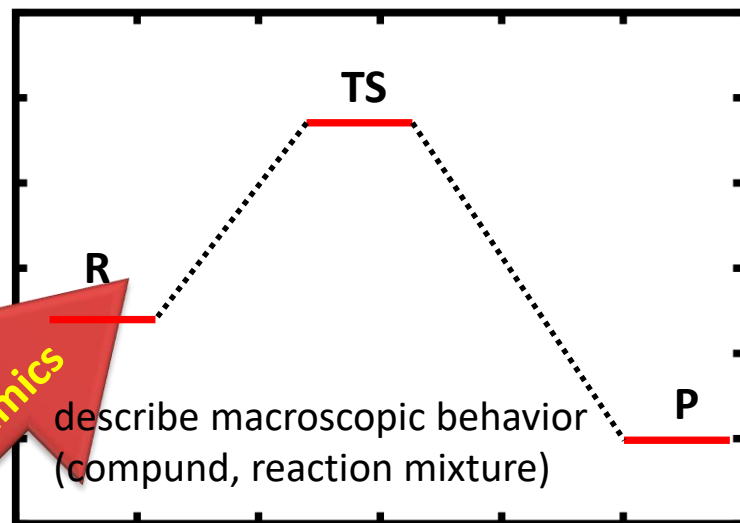


$R$

atom configurations

$\Delta G$

statistical thermodynamics



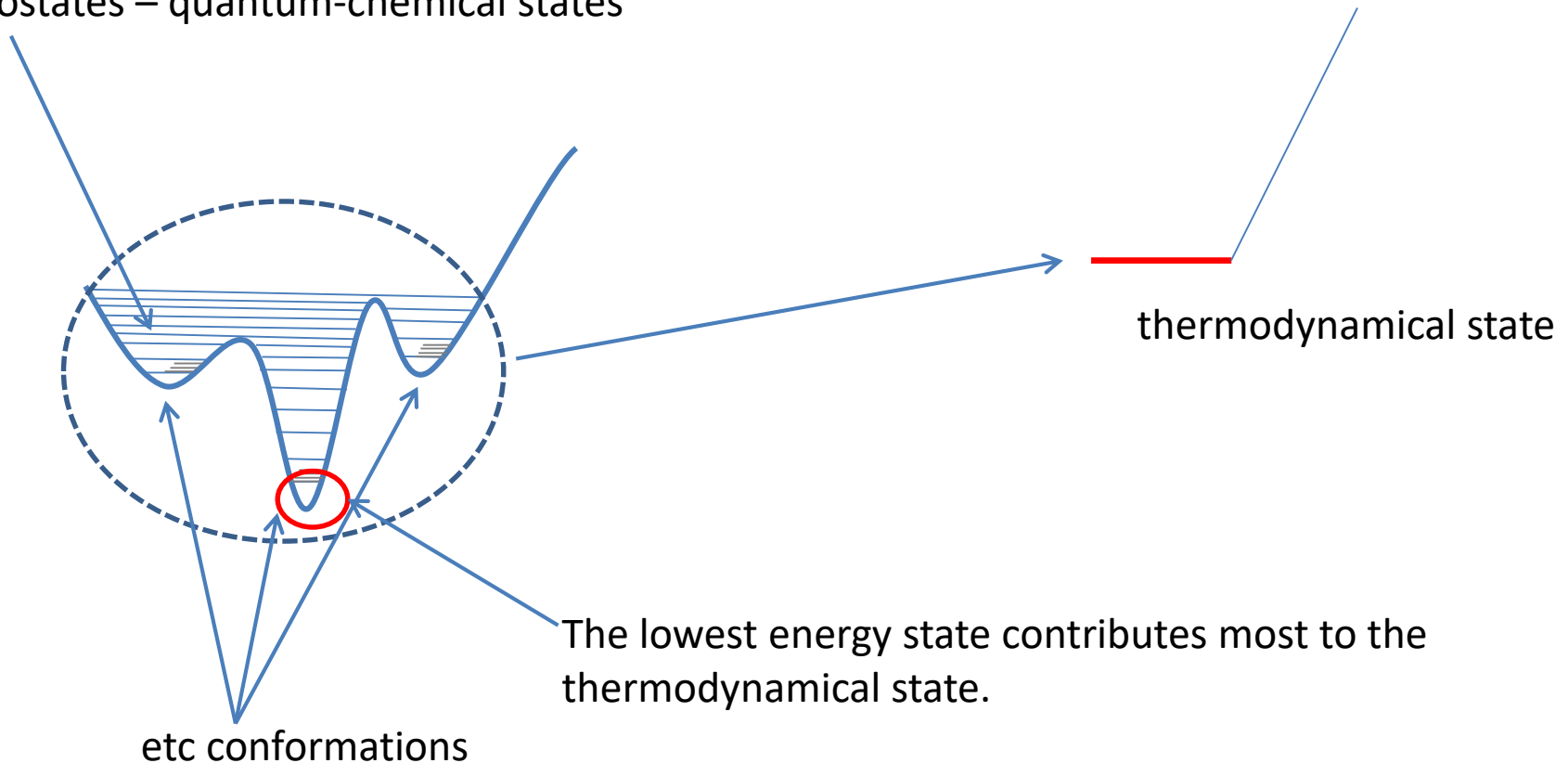
thermodynamical states

$\Delta G$  can be calculated from  $\Delta E$

# Thermodynamical vs QM state

**Thermodynamical state** (macro state) **is assemble of** **quantum-chemical states** (microstates), which are energetically accessible under given conditions (temperature, pressure).

microstates – quantum-chemical states

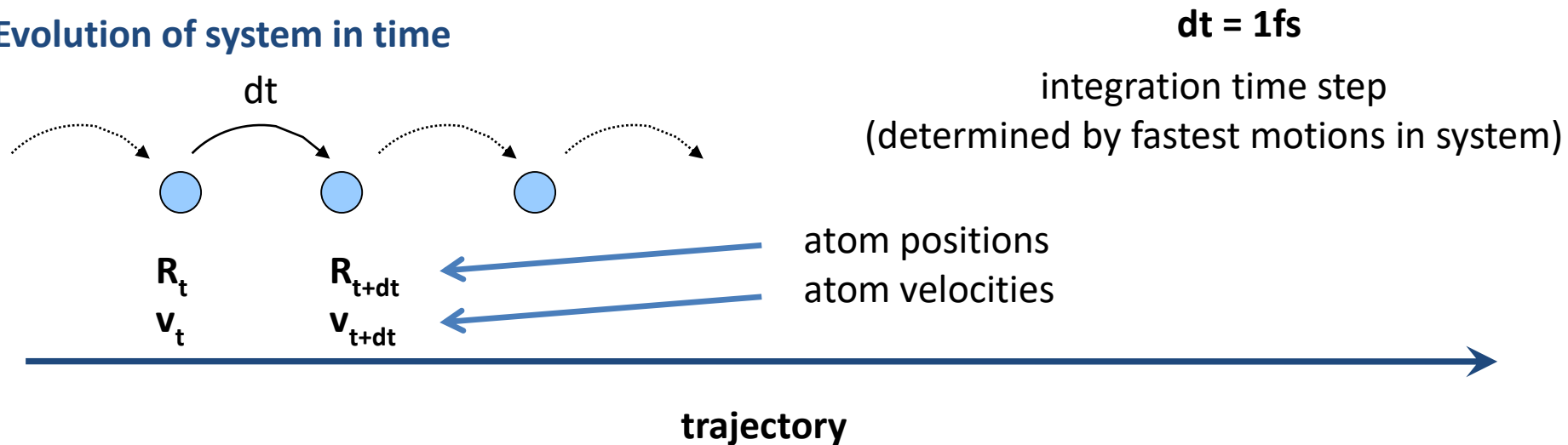


# Molecular Dynamics

How to get thermodynamical parameters of complex systems ...

# Molecular Dynamics

## Evolution of system in time



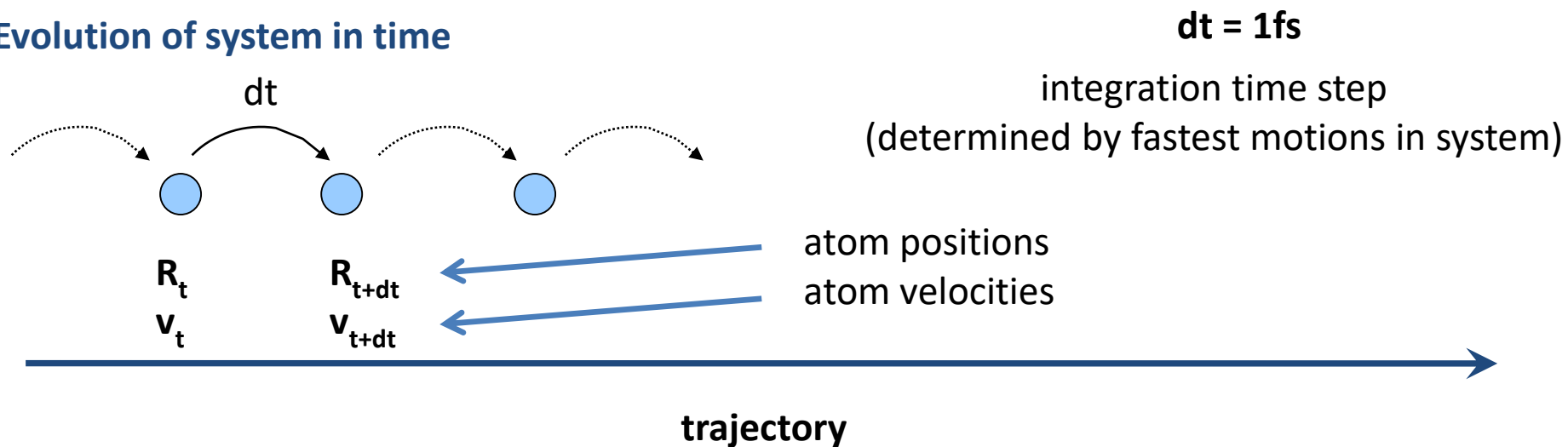
## Equation of Motions

$$-\frac{\partial^2 E(\mathbf{R})}{\partial \mathbf{r}_i^2} = m_i \frac{d^2 \mathbf{r}_i}{dt^2}$$

$$\mathbf{F}_i = m_i \mathbf{a}_i$$

# Molecular Dynamics

## Evolution of system in time



## Sampling problem

$$1\ \mu\text{s} = 10^9\ \text{fs}$$

1631 atoms, AMBER, GPU acceleration

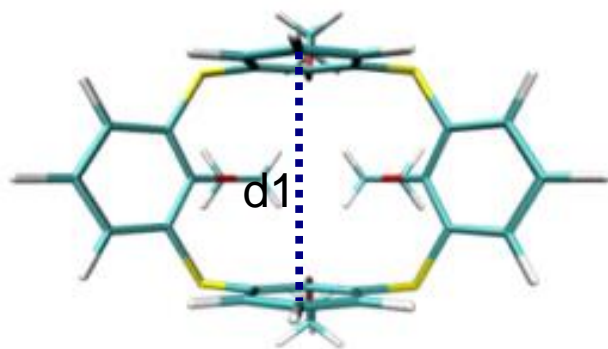
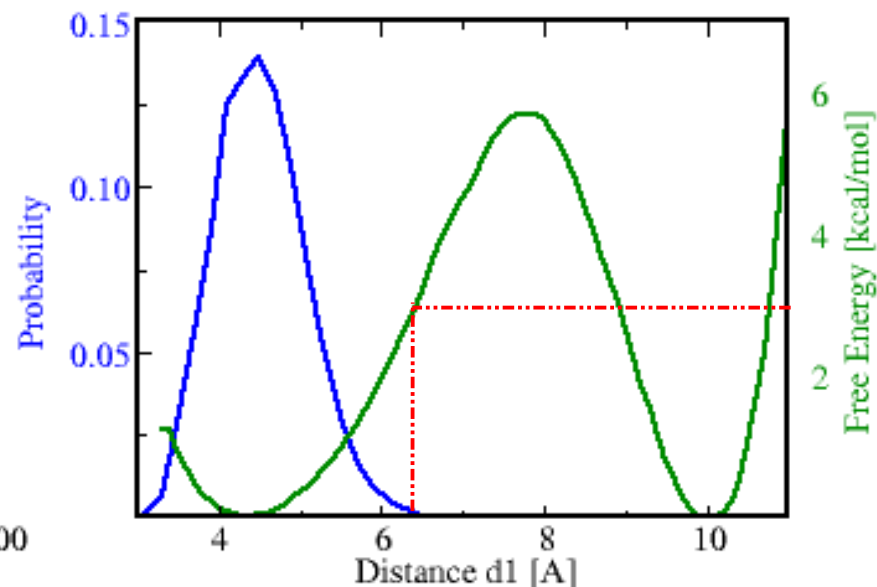
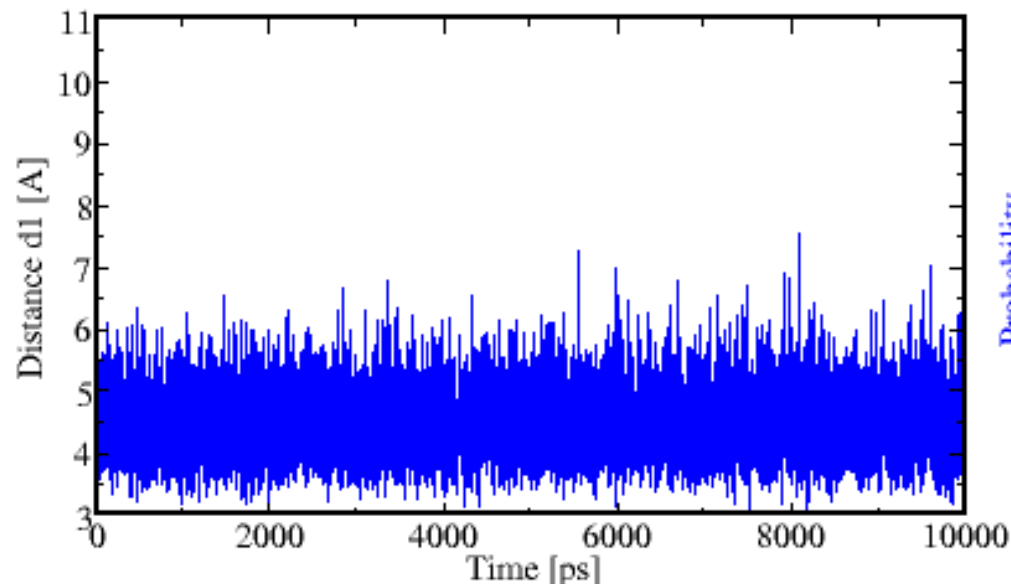
1 step  $\sim 1\ \text{ms}$  CPU/GPU time

$10^9$  steps  $\sim 12$  days CPU/GPU time

### Characteristic timescales:

- Protein folding (ms)
- Chemical reactions (ms, s, h)

# Sampling Problem



**10 ns** long simulation is able to discover free energy landscape with depth only about **3 kcal/mol**.

# Free Energy Calculations

A system has to be **biased** achieving efficient sampling in the region of interest. We need to know how to obtain the **unbiased free energy** from such biased simulation.

## Available methods:

### ➤ ***constrained dynamics***

system is biased by constraining reaction coordinate

### ➤ ***adaptive biasing force***

system is biased by force which is opposite to potential of mean force

### ➤ ***umbrella sampling***

system is biased by restraining reaction coordinate

### ➤ ***metadynamics***

system is biased by Gaussian hills, which fill free energy landscape

# Free Energy Calculations

## ➤ Alchemical Transformation

one system is slowly changed to another one (changes are very often unrealistic, atoms are created and/or annihilated)

**what:** mostly *changes* in binding free energies:

**how:** thermodynamic integration (TI), free energy perturbation (FEP)

## ➤ Potential of Mean Force

system is changed along reaction coordinate

**what:** free energy of conformation changes, **reaction free energies**

**how:** constrained dynamics, adaptive biasing force, umbrella sampling, metadynamics, steered dynamics

## ➤ End-points Methods

free energy of every state is calculated independently

**what:** mostly binding free energies

**how:** MM/XXSA; XX=PB, GB, LRA

# Multiscale Methods

## Coarse-grained Simulations

How to study really very large molecular assemblies?

# System Simplification

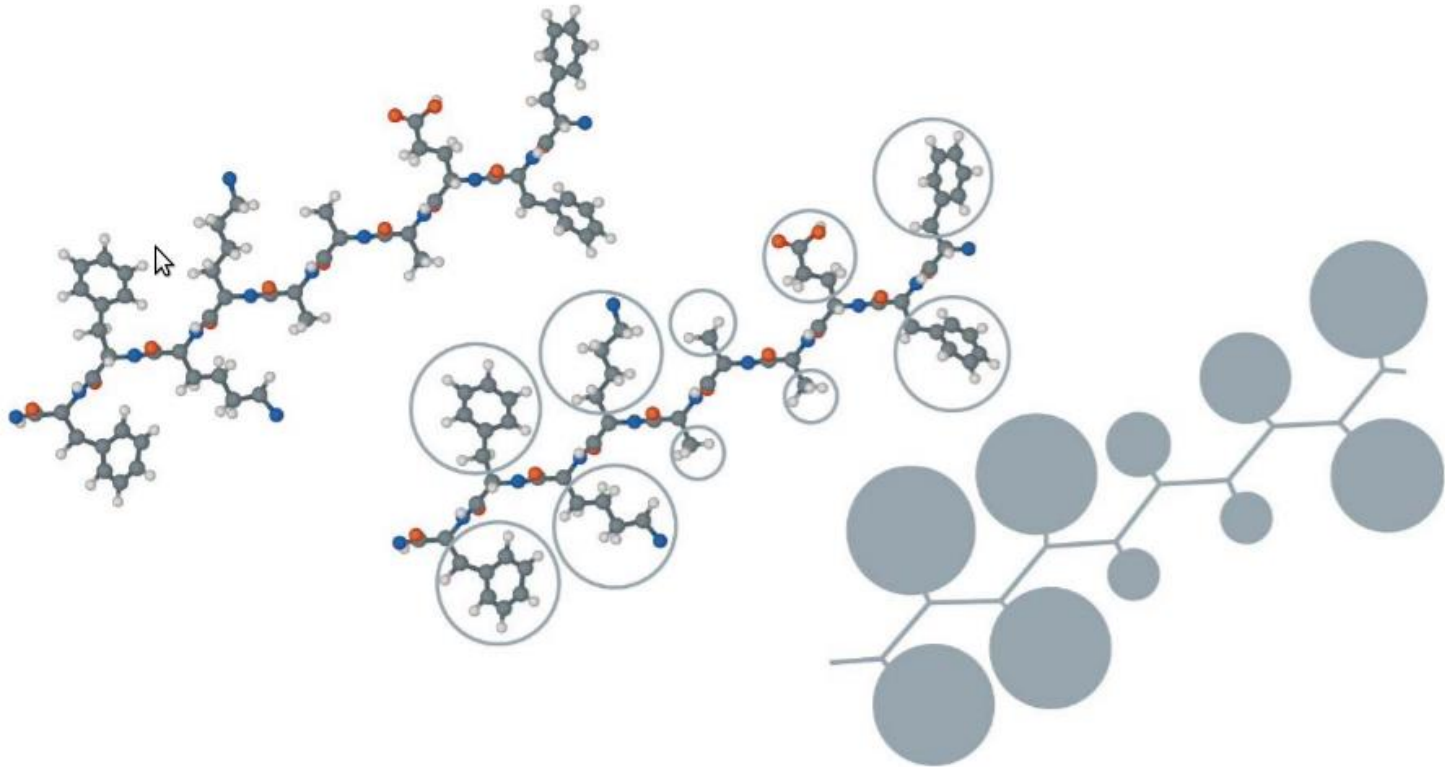
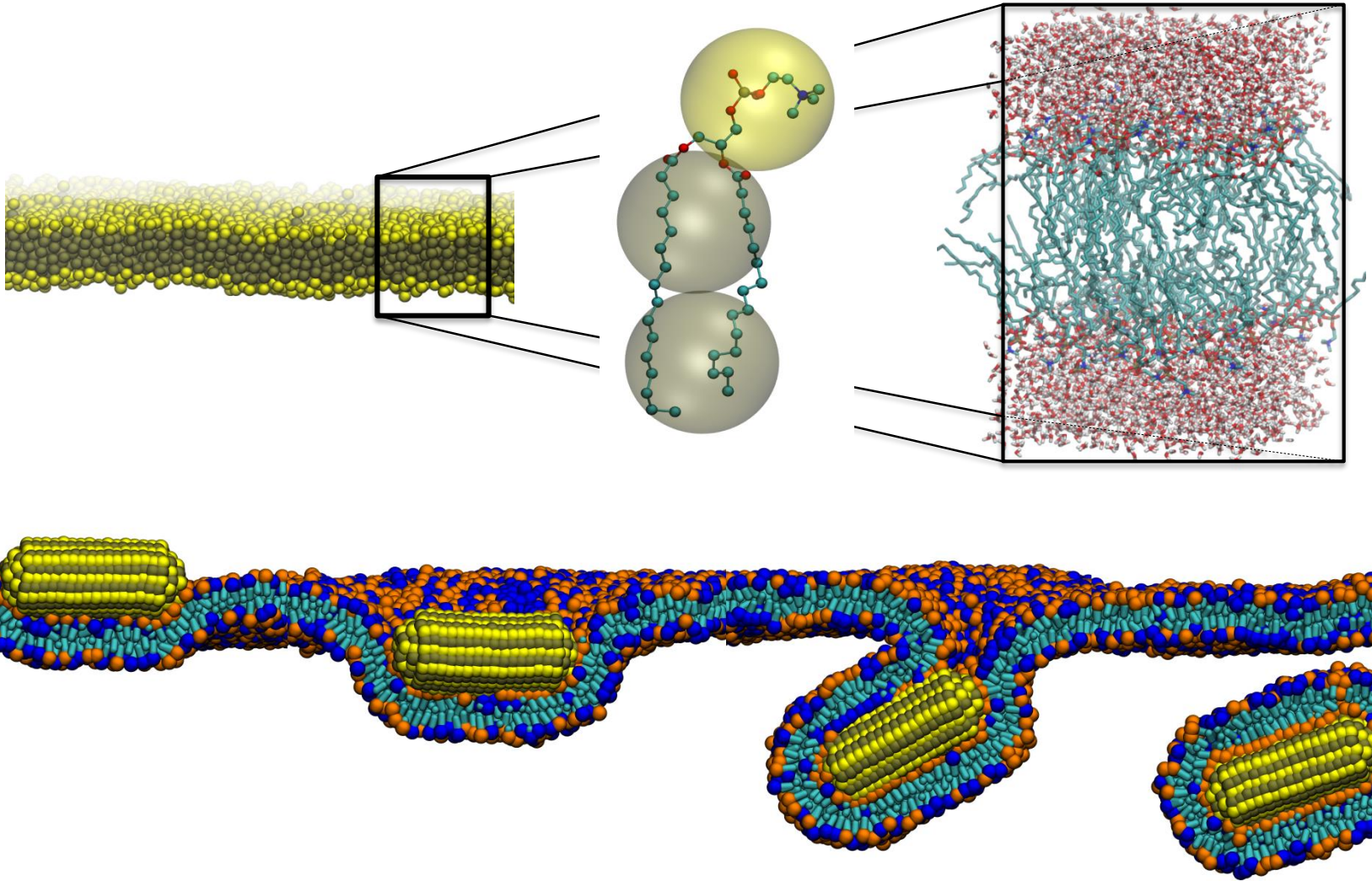


Figure 4. The detailed structure of a polypeptide chain (top) is simplified by assigning each amino acid residue with an interaction volume (middle) and the resulting string-of-pearls like structure (bottom) is used for the simulation.

# System Simplification



# Multiscale Methods

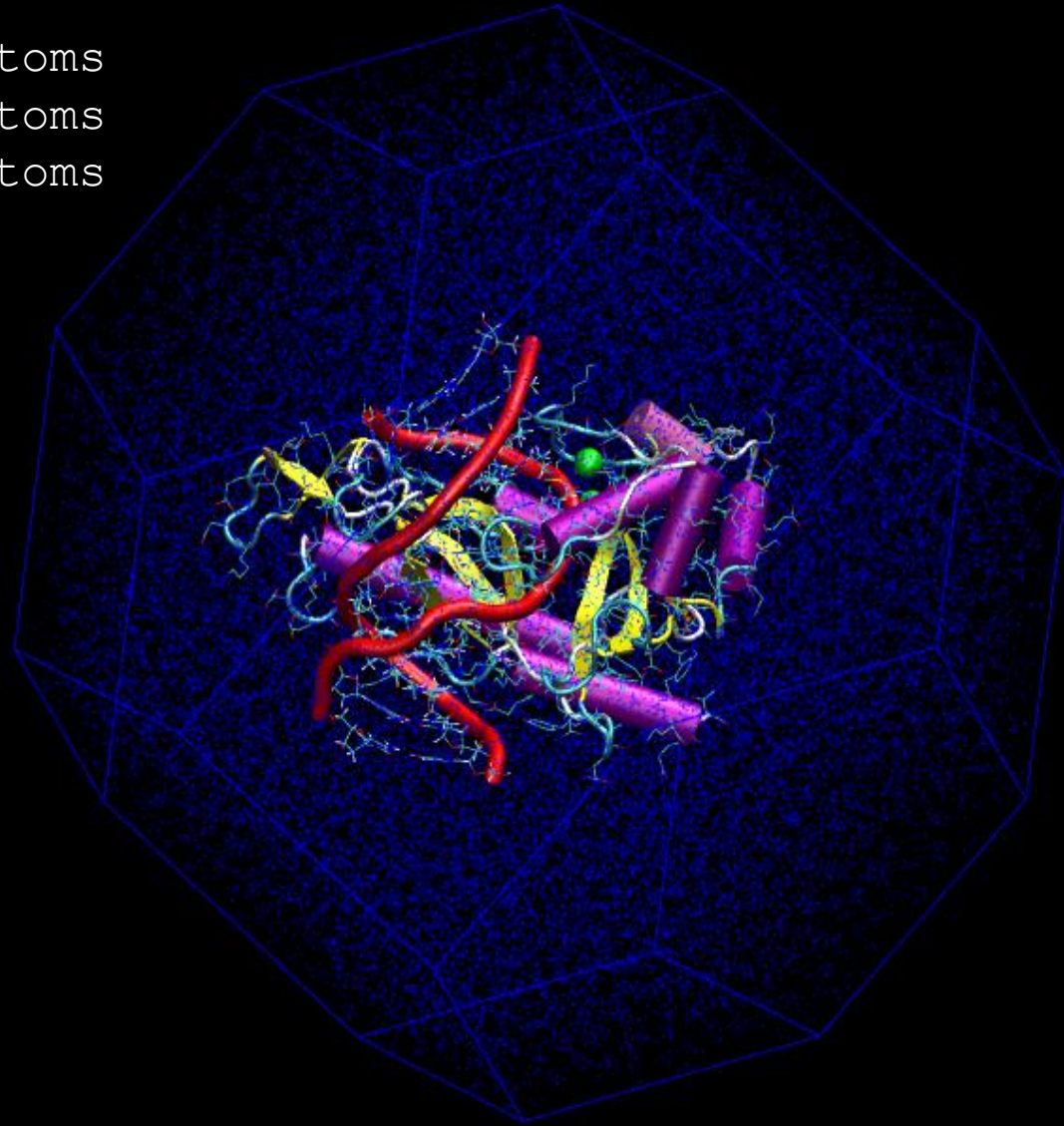
## QM/MM Methods

How to describe reactivity occurring in biomolecules (enzymes)?

# Enzymatic Reactions

Enzyme: ~4,300 atoms  
Water: ~42,000 atoms  
Total: ~46,500 atoms

**MutH**



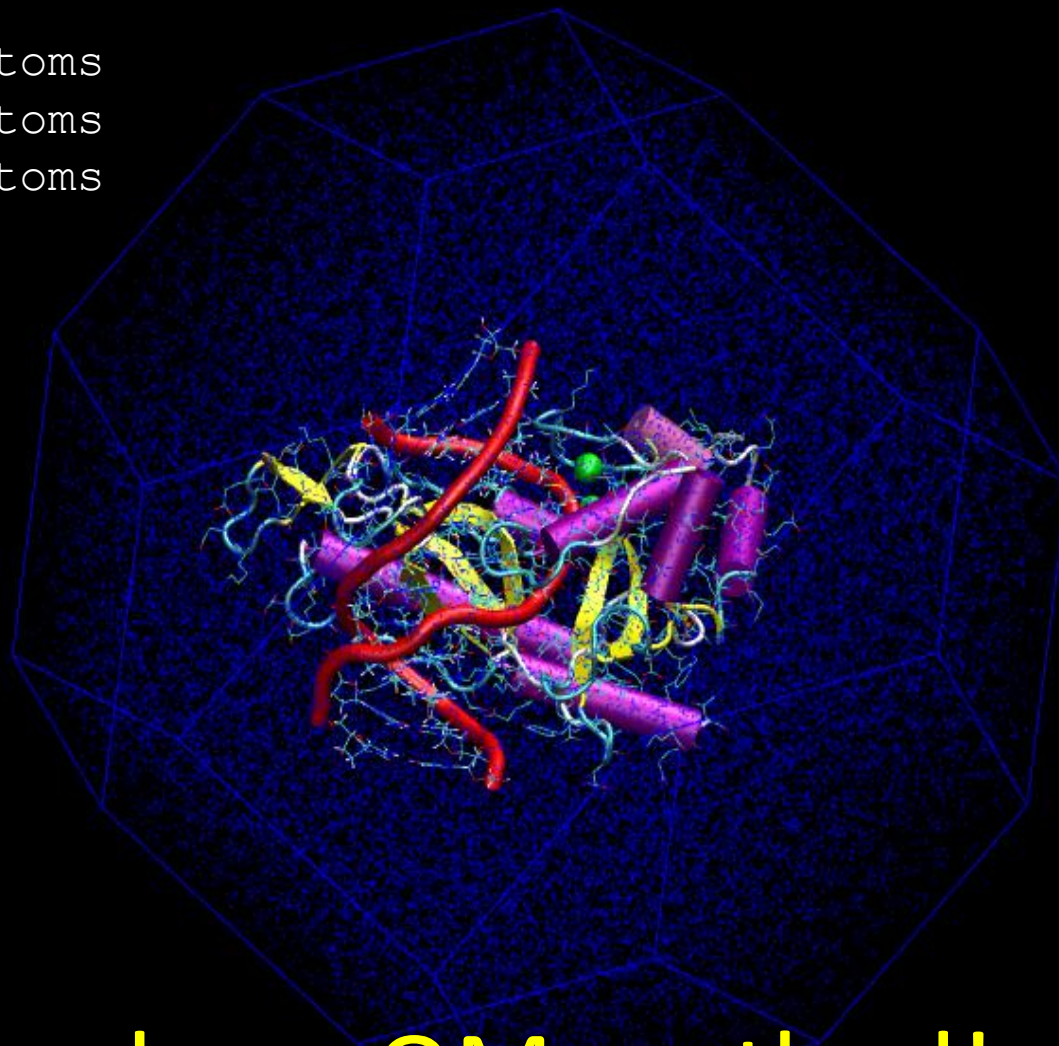
# Enzymatic Reactions

Enzyme: ~4,300 atoms

Water: ~42,000 atoms

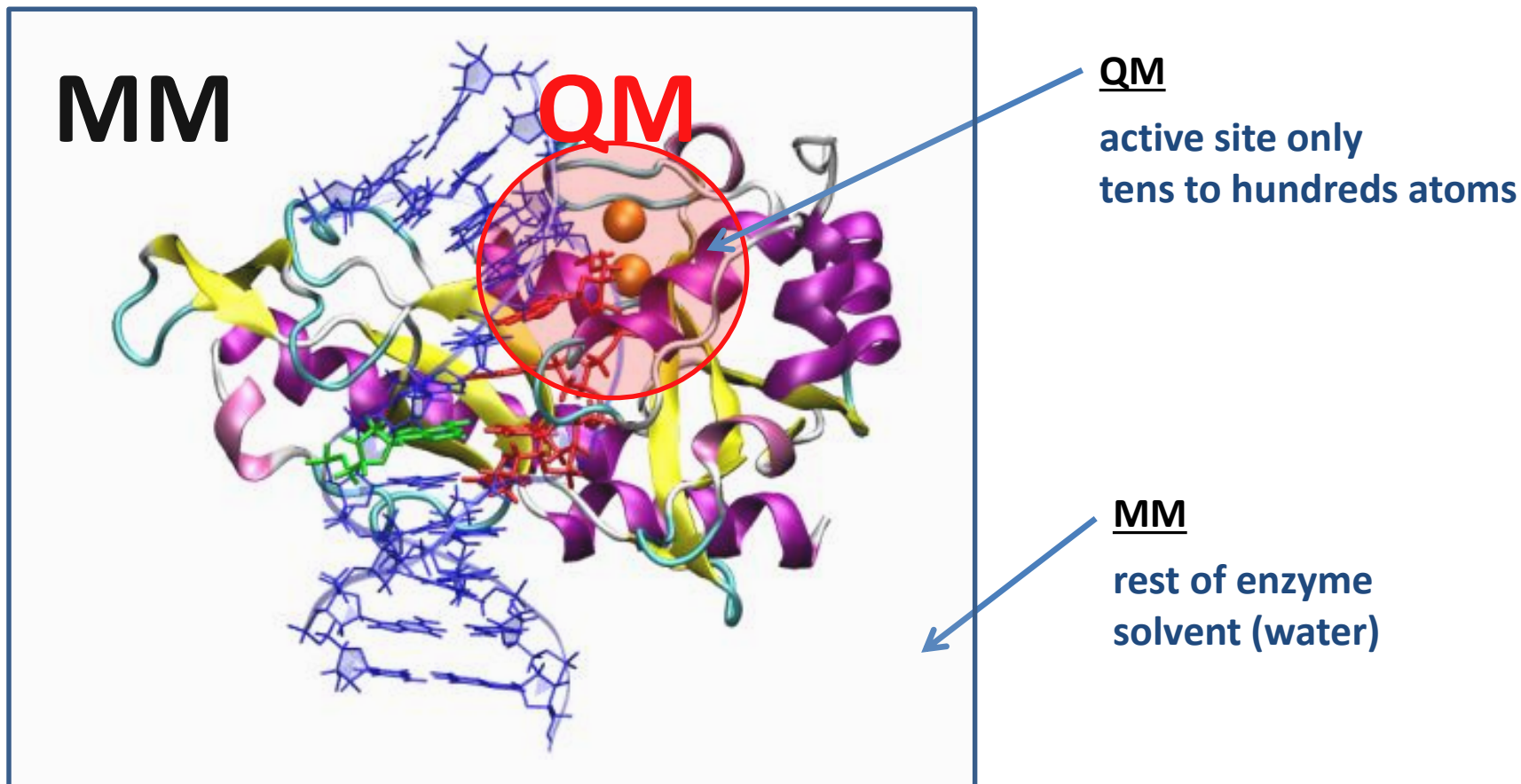
Total: ~46,500 atoms

**MutH**



**Beyond any QM method!**

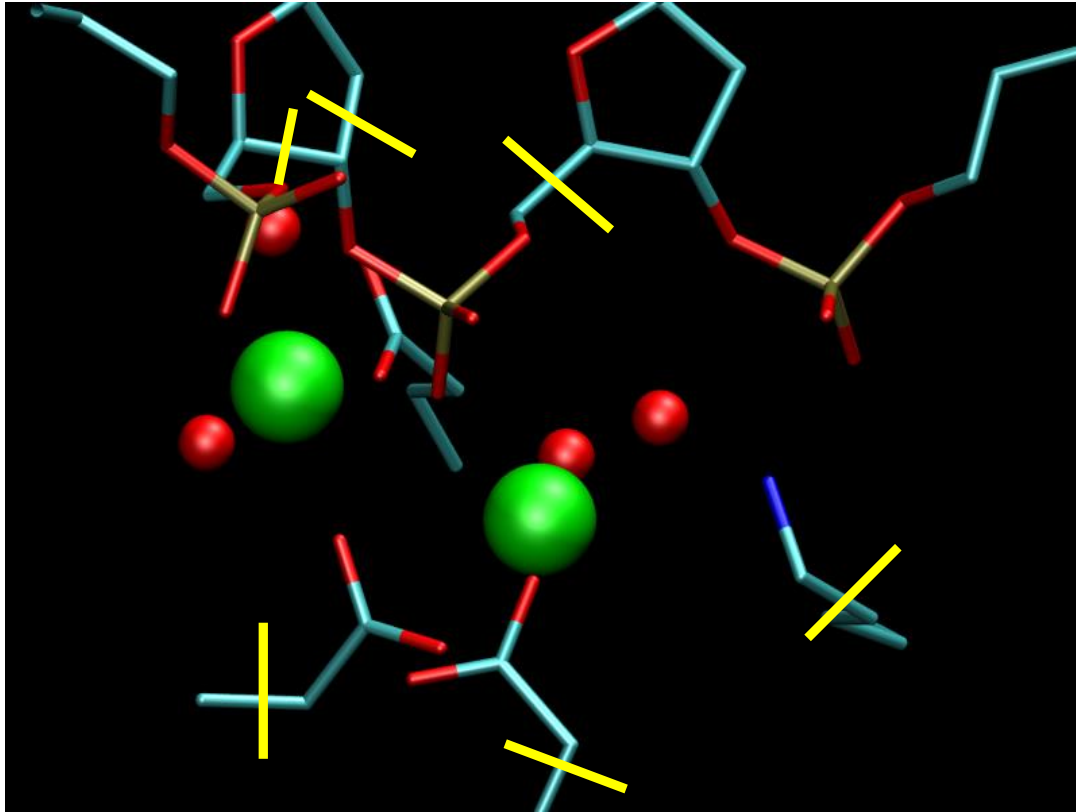
# Enzymatic Reactions



Catalyzed reaction – hydrolysis of phosphodiester bond



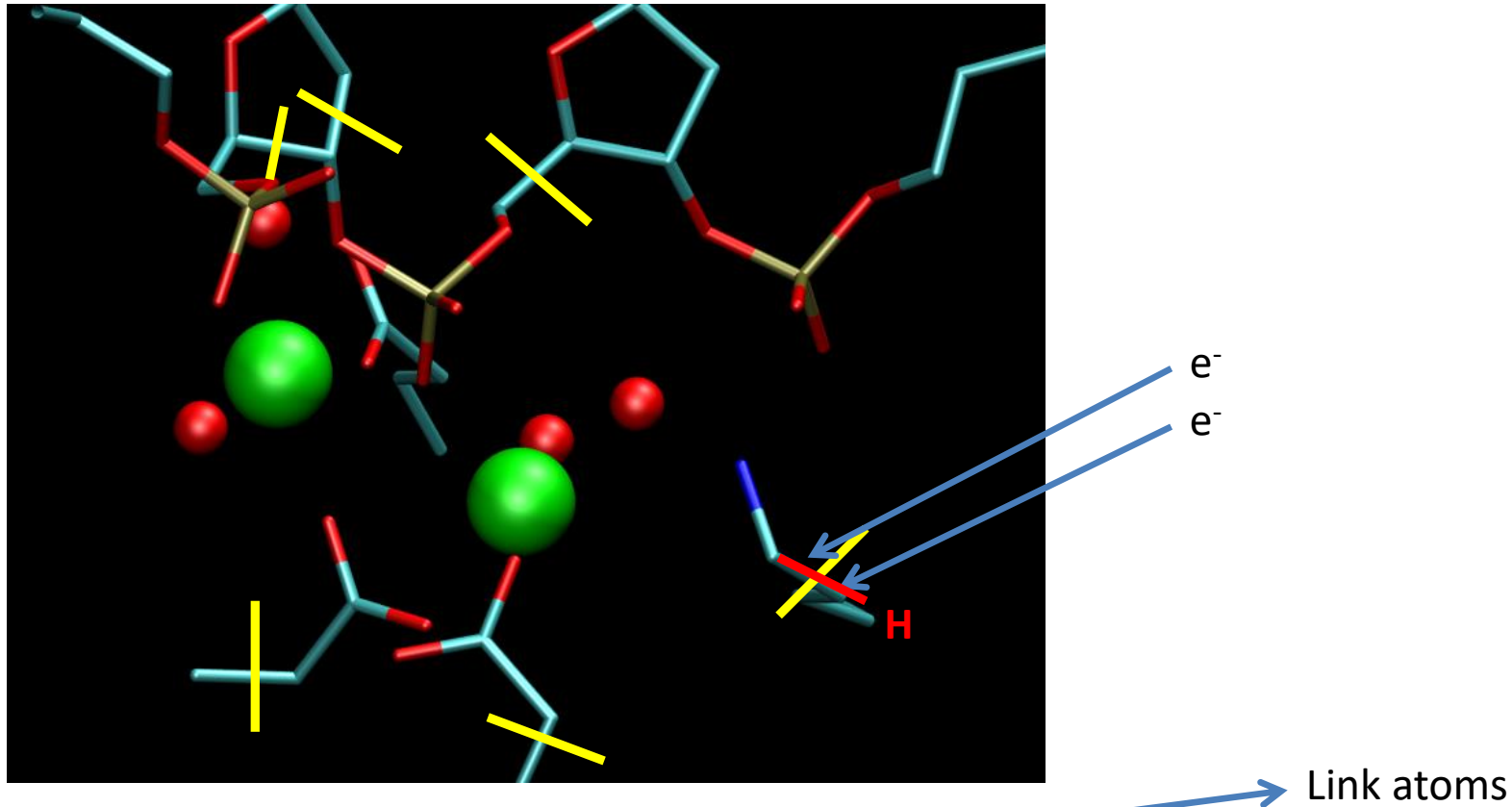
# Hybrid QM/MM – boundary problem



Link atoms

- **how to cut covalent bonds?**
- tension at boundary due to incompatible precision of QM and MM potentials
- MM atoms cannot be polarized by QM zone but QM atoms can be (over)polarized by MM atoms

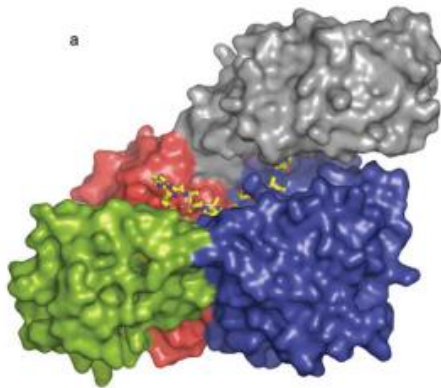
# Hybrid QM/MM – boundary problem



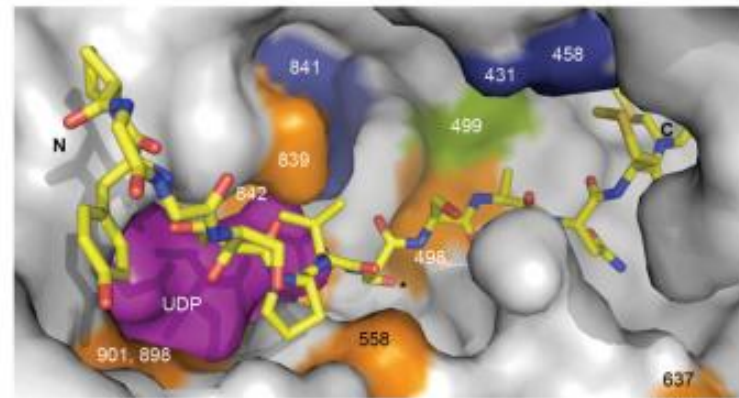
- **how to cut covalent bonds?**
- tension at boundary due to incompatible precision of QM and MM potentials
- MM atoms cannot be polarized by QM zone but QM atoms can be (over)polarized by MM atoms

# Introduction - OGT glycosyltransferase

- ❖ Uridine diphospho-*N*-acetylglucosamine: polypeptide  $\beta$ -*N*-acetylaminyltransferase; PDB ID: 3PE4
- ❖ Enzymatic transfer of *N*-acetylglucosamine molecule on Ser/Thr residue of protein
- ❖ Inverting glycosyltransferase of the GT-B family
- ❖ Post-translational modification: first reported in 1984



OGT Crystal Structure (Walker et al, 2011)

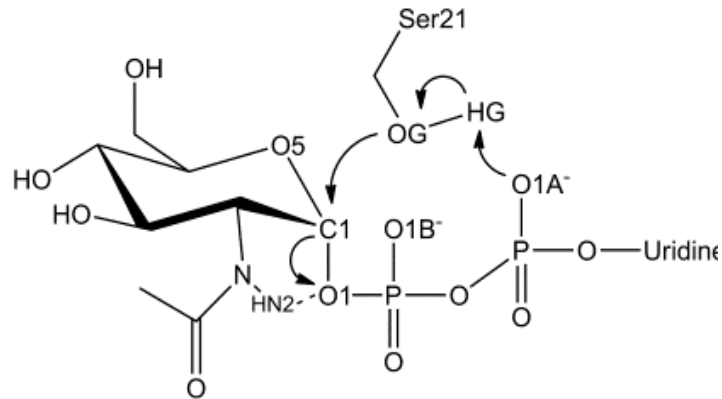


OGT Catalytic Site

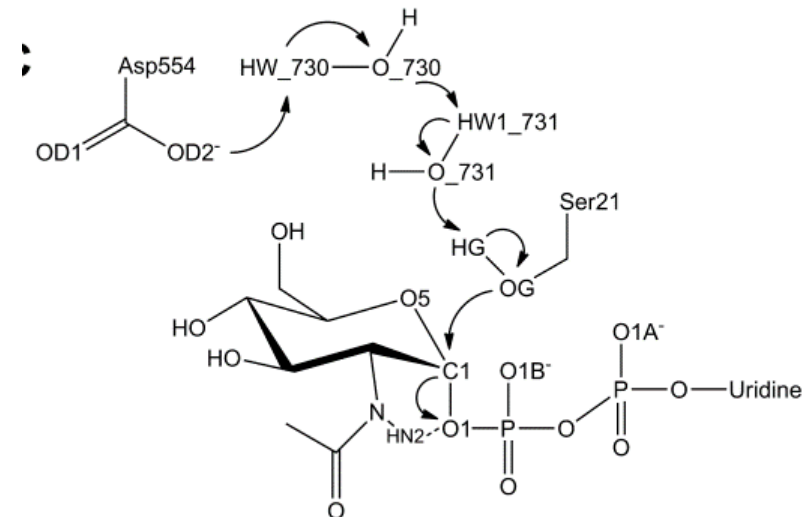
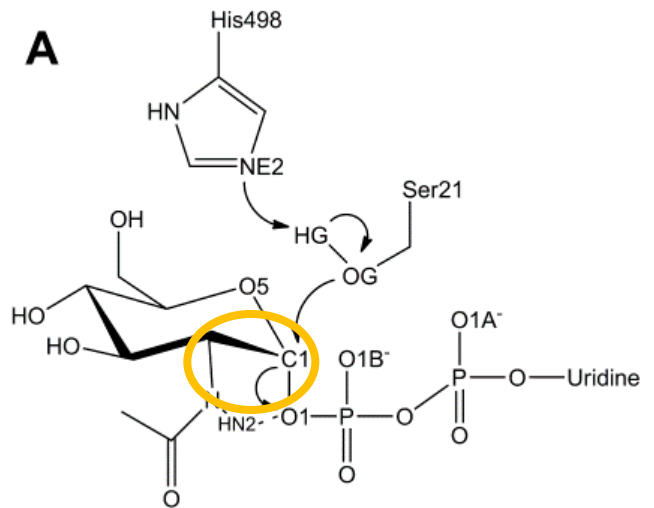
## Different Mechanisms Proposed for OGT

1. His498 as catalytic base (**M<sub>His</sub>**)  
(Lazarus et al. 2011  
Tvaroska et al. 2012)

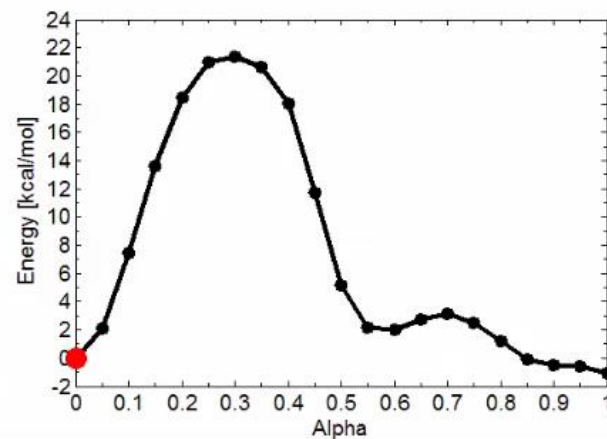
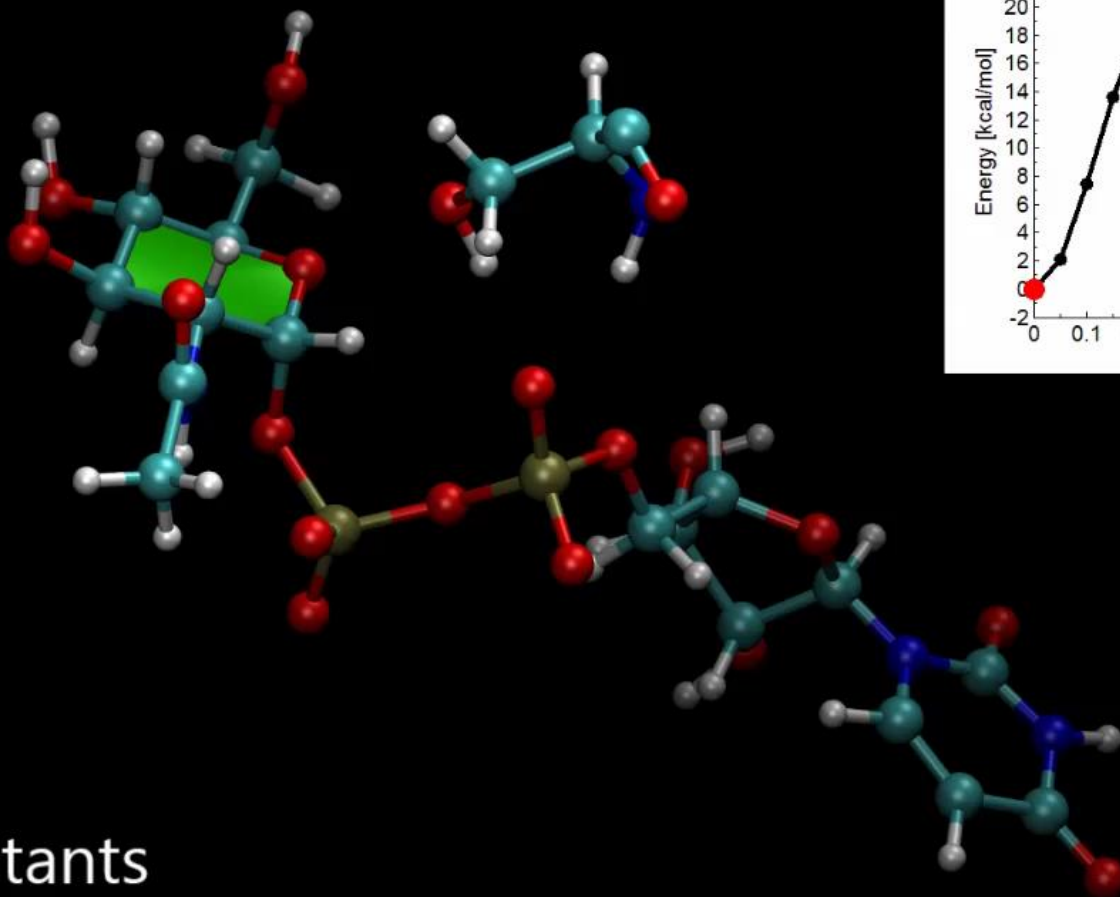
2.  $\alpha$ -phosphate as base (**M<sub>PO4</sub>**)  
(Schimpl et al. 2012)



3. Water molecule for shunting proton to ASP554 (**M<sub>Asp</sub>**)  
(Lazarus et al. 2012)



## Most Probable Reaction Path – $M_{PO4}$



# Nobel Laureates in Chemistry 2013



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[http://www.nobelprize.org/nobel\\_prizes/chemistry/laureates/2013/](http://www.nobelprize.org/nobel_prizes/chemistry/laureates/2013/)

# Take Home Message



**Figure 2.** Newton and Schrödinger's cat. Previously, classical physics and quantum chemistry belonged to rivalling worlds. The Nobel Laureates in Chemistry 2013 have opened a gate between those worlds and have brought about a flourishing collaboration.

- study of chemical reactions occurring in very large molecular assemblies is possible by QM/MM methods ("routine" calculations)
  - enzymatic reactions (drug development)
  - catalysis in solid state (zeolites, industry)
- many unresolved issues (QM accuracy, MM polarization, boundary problems , ...)

# Acknowledgement



# Thank you for your attention !

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