

# COARSE-GRAINED SIMULATIONS OF INTERACTING PROTEINS WITH DISCRETE MOLECULAR DYNAMICS

*Agustí Emperador*

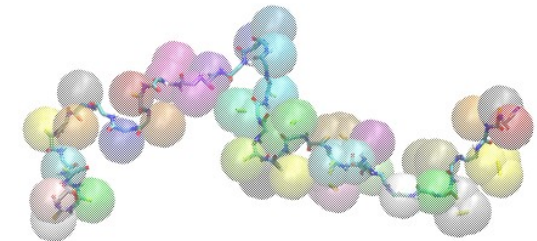
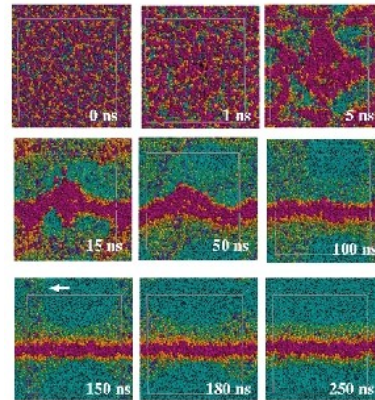
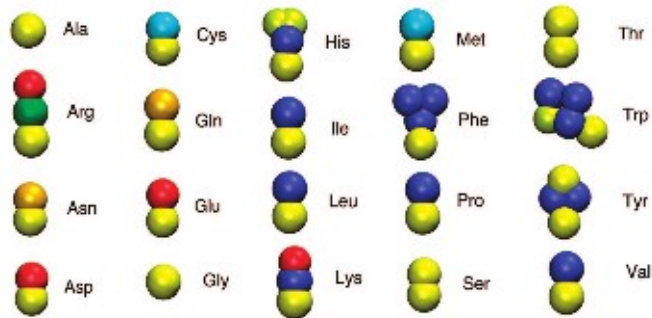
Institute for Research in Biomedicine, Barcelona

# COARSE-GRAINING THE STRUCTURE

Mapping used by Marrink + atomistic representation of backbone

Marrink's model gave excellent results for lipid-lipid and lipid-protein interactions (BUT it is an **explicit solvent model** and does not consider *hydrogen bonding*)

Coarse-grained beads (particles) for the sidechains



Monticelli et al, *JCTC* 4, 819 (2008)

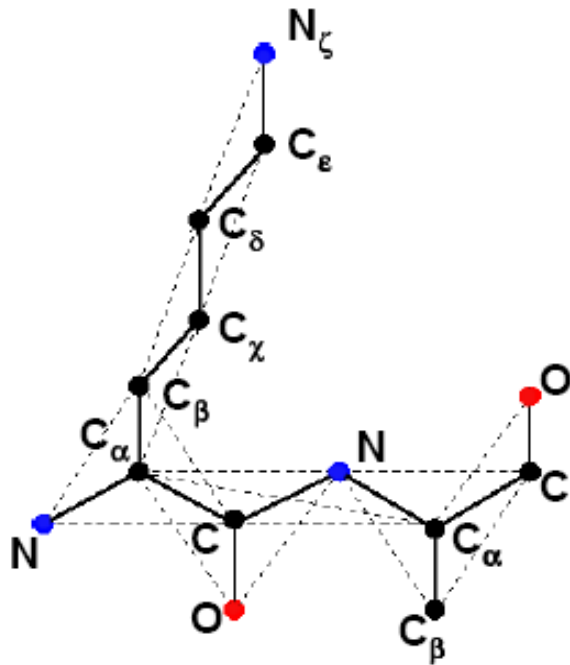
Our force field: **Van der Waals**, **electrostatic** and **implicit solvation** interaction between sidechain and  $C_{\alpha}$  beads

Hydrogen bonding *only* between backbone atoms (*backbone not coarse-grained*)

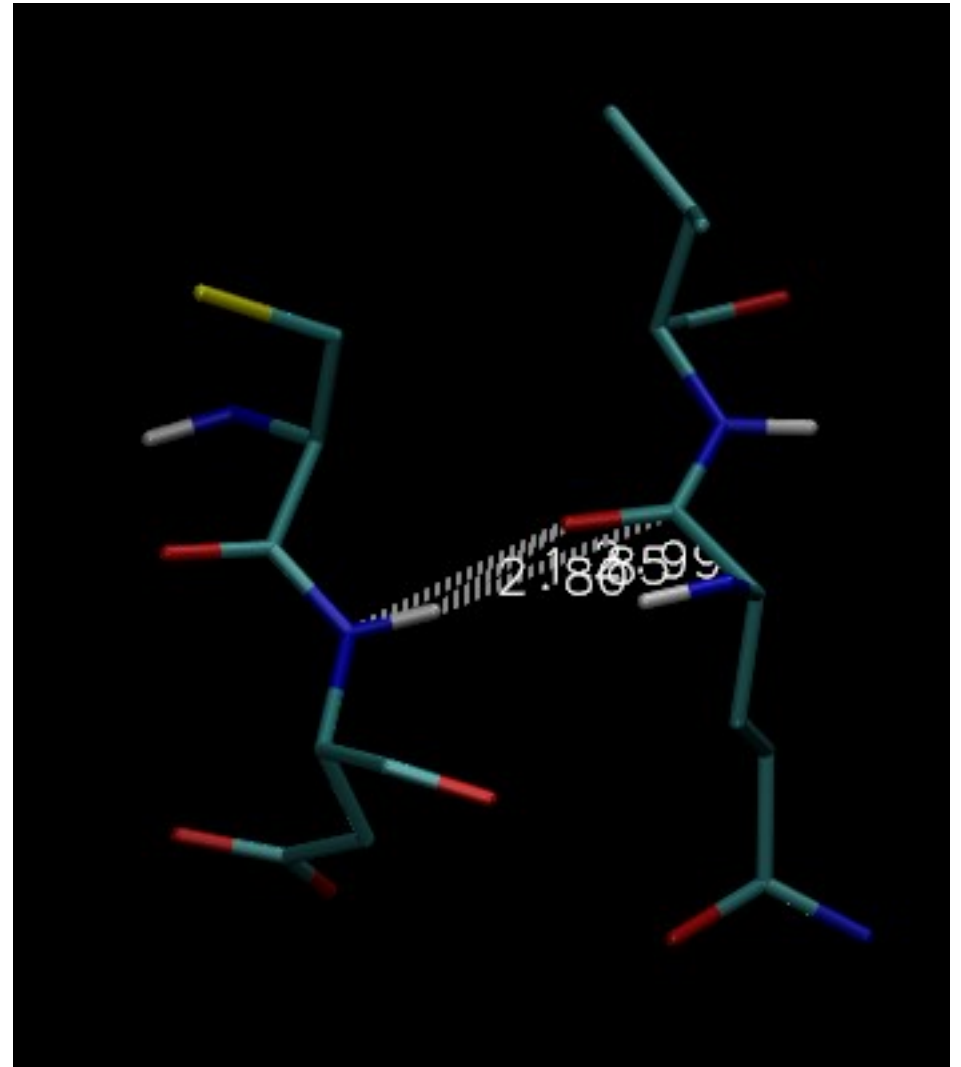
Backbone hydrogen bonding modeled like in atomistic Discrete Molecular Dynamics (DMD)

## MOLECULAR STRUCTURE IN DMD

In DMD all the potentials depend on *particle-particle distances* (two-body potentials)  
It is not possible to define forces depending on angles or dihedrals. **Pseudobonds** have to be used to fix bond angles and dihedrals

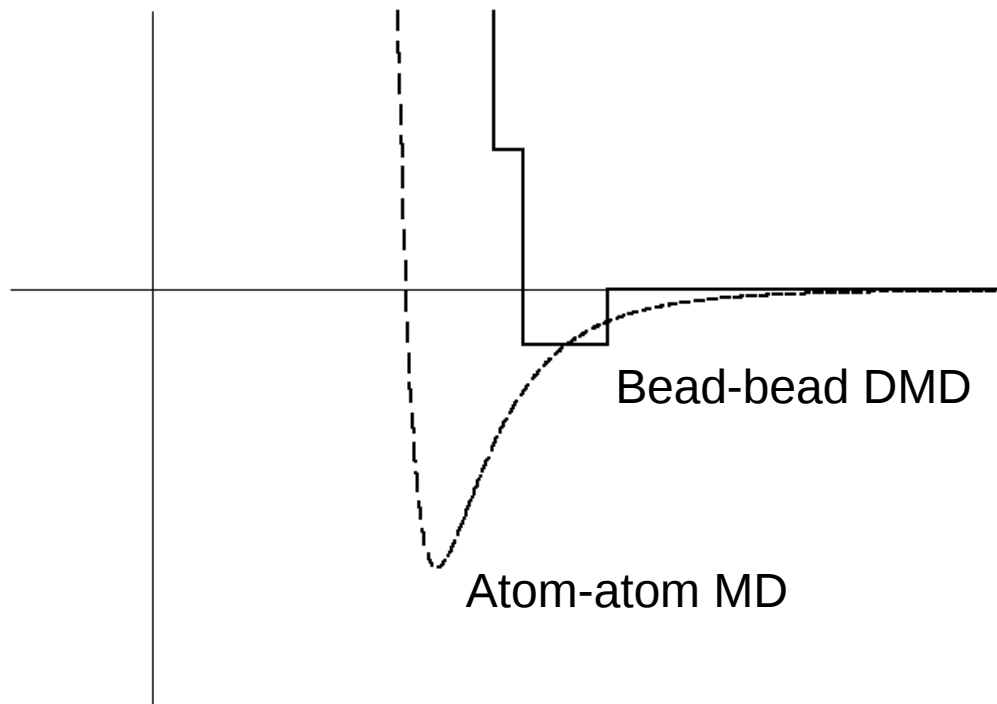


LYS-ALA



**Hydrogen bonds** are dipole-dipole interactions, therefore dependent on the angle. Pseudobonds are used to keep the correct angle.

# INTERACTION POTENTIALS IN DISCRETE MOLECULAR DYNAMICS



DISCRETE MOLECULAR DYNAMICS

Discretization of the continuous potential

How much accuracy is lost?

Much less than when using **implicit solvent** and **coarse-graining** the structure

*Less steps → faster*

The **well depth** is the value of the continuous potential at  $R_{AB} = R_A + R_B$

## Standard molecular dynamics (MD)

Integrate the equations of motion  
at each timestep ( $\Delta t = 2$  fs)

$$F = -\frac{dV}{dr} = ma$$

$$a = \frac{dv}{dt}$$

$$v = \frac{dr}{dt}$$

500.000.000 timesteps needed  
to generate 1  $\mu$ s of trajectory!

$$V = E_{\text{bonded}} + E_{\text{non-bonded}}$$

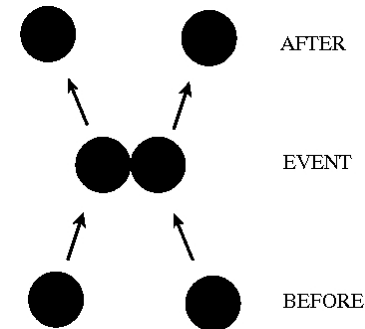
$$E_{\text{non-bonded}} = \sum_{a,b} \frac{Q_a Q_b}{r_{ab}} + \sum_{a,b} \left( \frac{C_{ab}}{r_{ab}} \right)^{12} - \left( \frac{D_{ab}}{r_{ab}} \right)^6$$

## Discrete molecular dynamics (DMD)

Particles move with constant velocity...

$$r_i(t + t_c) = r_i(t) + v_i(t)t_c$$

...until a collision occurs



Transfer of linear momentum  
upon a collision

$$m_i v_i = m_i v_i' + \Delta p$$

$$m_j v_j + \Delta p = m_j v_j'$$

The velocities of particles  $i, j$  change

# Discrete molecular dynamics



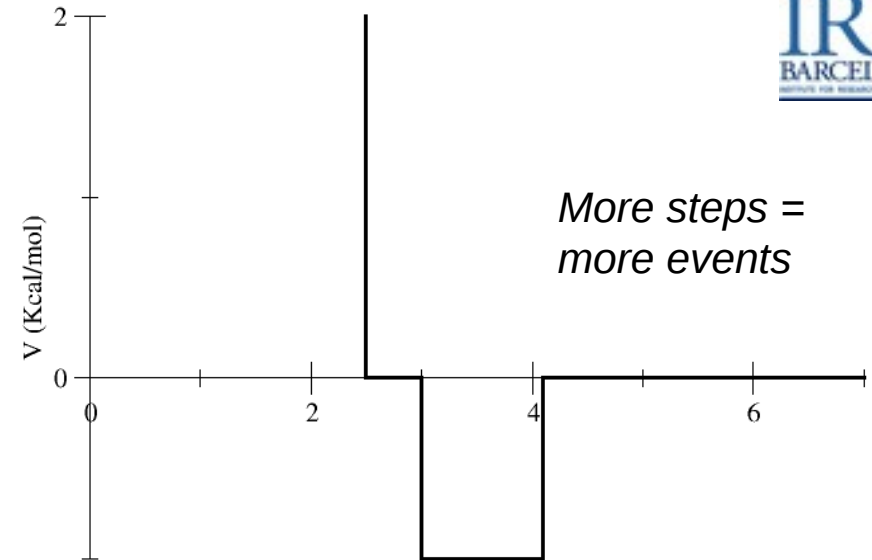
Conservation of **linear momentum**

Conservation of **energy** when entering a region with different potential energy

(Emperador et al, *Proteins* **78** 83 (2010))

$$m_i v_i + m_j v_j = m_i v_i' + m_j v_j'$$

$$\frac{1}{2} m_i v_i^2 + \frac{1}{2} m_j v_j^2 = \frac{1}{2} m_i v_i'^2 + \frac{1}{2} m_j v_j'^2 + \Delta V$$



Transferred linear momentum

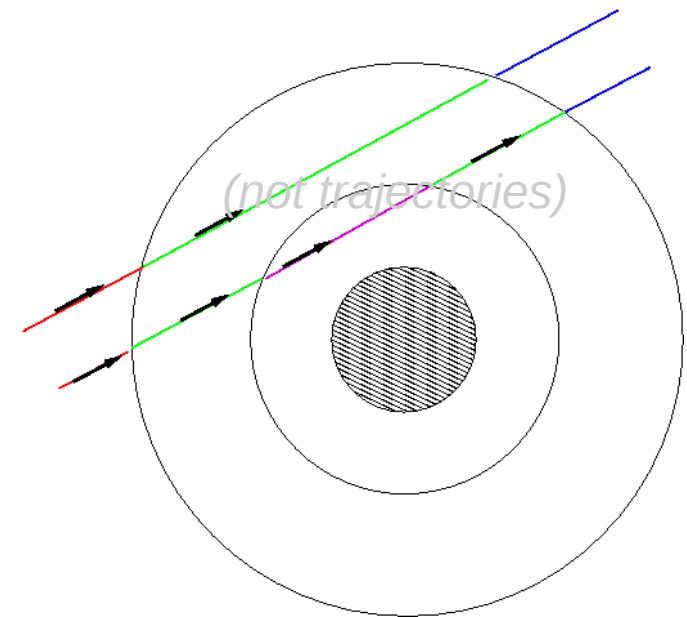
$$\Delta p = \frac{m_i m_j}{m_i + m_j} \left\{ \sqrt{(v_j - v_i)^2 - 2 \frac{m_i + m_j}{m_i m_j} \Delta V} - (v_j - v_i) \right\}$$

If  $\Delta V > 0$ , the particles can overcome the potential step as long as

$$\Delta V < \frac{m_1 m_2}{2(m_1 + m_2)} (v_j - v_i)^2$$

Otherwise, the particles keep inside the well and

$$\Delta p = \frac{2m_i m_j}{m_i + m_j} (v_i - v_j)$$



# CONSTRUCTION OF THE FORCE FIELD

The *depth* of the square well is the value of the interaction potential at  $R_{AB} = R_A + R_B$

Value of the interaction potential at  $R_{AB} = R_A + R_B$  ?  
Interaction potential between beads A and B:

$$V_{AB} = V_{12} + V_{14} + V_{23} + V_{34}$$

Approximation:  $r_{12} = r_{14} = r_{23} = r_{34} = R_{AB}$

Electrostatic potential

$$V_{AB} = \frac{q_1q_2 + q_1q_4 + q_2q_3 + q_3q_4}{4\pi\epsilon_0\epsilon_r R_{AB}} = \frac{(q_1 + q_3)(q_2 + q_4)}{4\pi\epsilon_0\epsilon_r R_{AB}} = \frac{Q_A Q_B}{4\pi\epsilon_0\epsilon_r R_{AB}}$$

Van der Waals potential

$$V_{AB} = (\epsilon_{12} + \epsilon_{14} + \epsilon_{23} + \epsilon_{34}) \left[ \left( \frac{2}{N_A^{1/3} + N_B^{1/3}} \right)^{12} - 2 \left( \frac{2}{N_A^{1/3} + N_B^{1/3}} \right)^6 \right]$$

$$V_{AB}^{VDW} = \sqrt{\epsilon_A \epsilon_B} \left[ \left( \frac{2}{N_A^{1/3} + N_B^{1/3}} \right)^{12} - 2 \left( \frac{2}{N_A^{1/3} + N_B^{1/3}} \right)^6 \right]$$

where  $\epsilon_A = \epsilon_1 + \epsilon_3$ ,  $\epsilon_B = \epsilon_2 + \epsilon_4$ .

Solvation potential

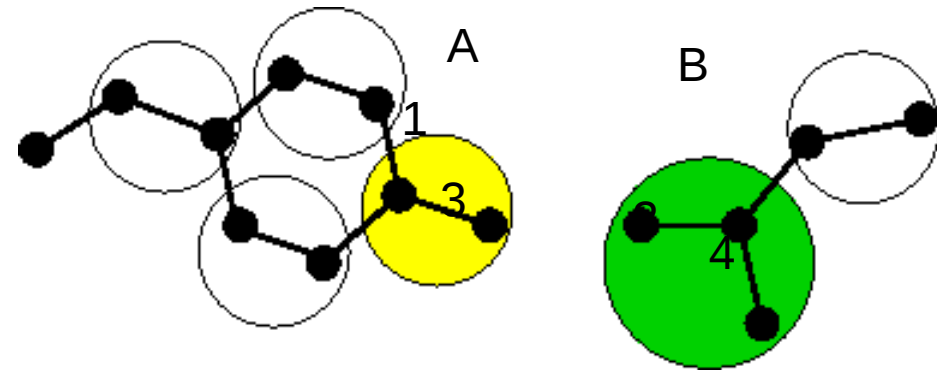
EEF1 implicit solvation (Lazaridis & Karplus, *Proteins* **35** 133 (1999))  
depending on the volume  $v_i$  and the solvation energy density  $f_i \propto \Delta G_i$

$$V_{12} = - \int_{v_1} f_2 d\vec{r} - \int_{v_2} f_1 d\vec{r} \approx -f_1(r)v_2 - f_2(r)v_1$$

$$V_{AB}^{solv} \approx -C(\Delta G_1 v_2 + \Delta G_1 v_4 + \Delta G_3 v_2 + \Delta G_3 v_4 + \Delta G_2 v_1 + \Delta G_4 v_1 + \Delta G_2 v_3 + \Delta G_4 v_3)$$

$$V_{AB}^{solv} \approx -C[(\Delta G_1 + \Delta G_3)(v_2 + v_4) + (\Delta G_2 + \Delta G_4)(v_1 + v_3)]$$

$$V_{AB}^{solv} \approx -C(\Delta G_A v_B + \Delta G_B v_A)$$



Pairwise **additive** atomic interactions  
Collapse all atoms in the center of the bead

TABLE I. Solvation Parameters<sup>a</sup>

Atom types <sup>a</sup>	Vdume <sup>b</sup>	$\Delta G_i^{efb}$	$\Delta G_i^{free}$	$\Delta H_i^{efb}$	$\Delta C p_i^{ef d}$
C	14.7	0.000	0.00	0.000	0.00
CR	8.3	-0.890	-1.40	2.220	6.90
CH1E	23.7	-0.187	-0.25	0.876	0.00
CH2E	22.4	0.372	0.52	-0.610	18.60
CH3E	30.0	1.089	1.50	-1.779	35.60
CR1E	18.4	0.057	0.08	-0.973	6.90
NH1	4.4	-5.950	-8.90	-9.059	-8.80
NR	4.4	-3.820	-4.00	-4.654	-8.80
NH2	11.2	-5.450	-7.80	-9.028	-7.00
NH3	11.2	-20.000	-20.00	-25.000	-18.00
NC2	11.2	-10.000	-10.00	-12.000	-7.00
N	0.0	-1.000	-1.55	-1.250	8.80
OH1	10.8	-5.920	-6.70	-9.264	-11.20
O	10.8	-5.330	-5.85	-5.787	-8.80
OC	10.8	-10.000	-10.00	-12.000	-9.40
S	14.7	-3.240	-4.10	-4.475	-39.90
SH1E	21.4	-2.050	-2.70	-4.475	-39.90

## PARAMETRIZATION OF THE COARSE-GRAINED FORCE FIELD

The total **interaction potential** between nonbonded coarse-grained beads should be *adjusted* to give the correct behavior of the peptide solution

$$V = W_{\text{solv}} V_{\text{solv}} + W_{\text{VdW}} V_{\text{VdW}}$$

(plus electrostatic and hydrogen bond terms (fixed))

“GOLDEN RULE” FOR SIMULATING A SOLUTION OF PROTEINS:  
**equilibrium between associations and dissociations**

Frequency of *association* depends on **concentration**

Frequency of *dissociation* depends on **bead-bead interaction**

If association > dissociation, **hydrophobic collapse**. The solute precipitates





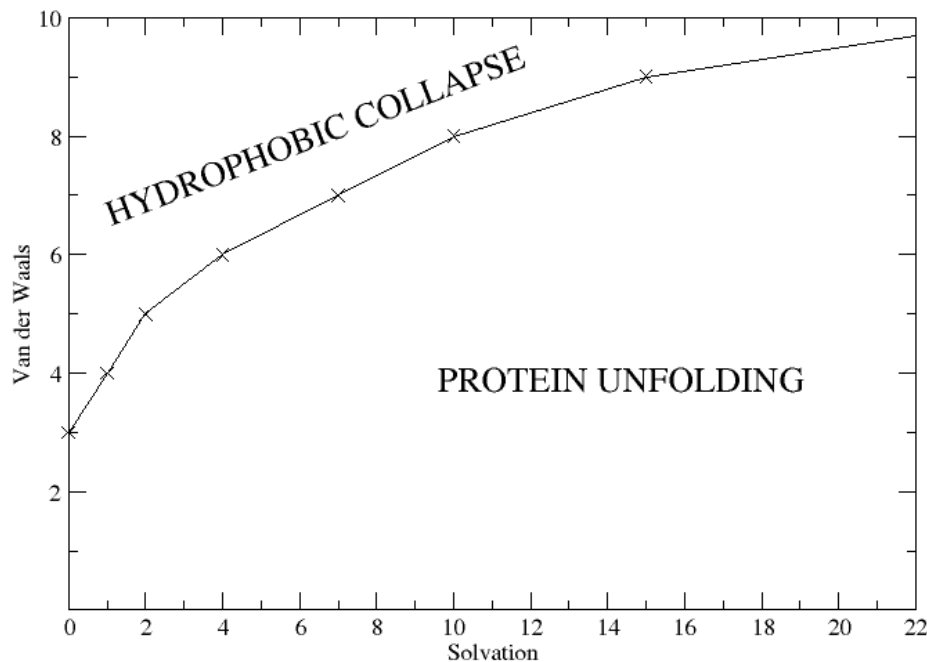
Interaction potential (between sidechain beads)  $V = W_{\text{solv}} V_{\text{solv}} + W_{\text{vdW}} V_{\text{vdW}} + V_{\text{el}}$

Van der Waals term *attractive*, solvation term mostly *repulsive*

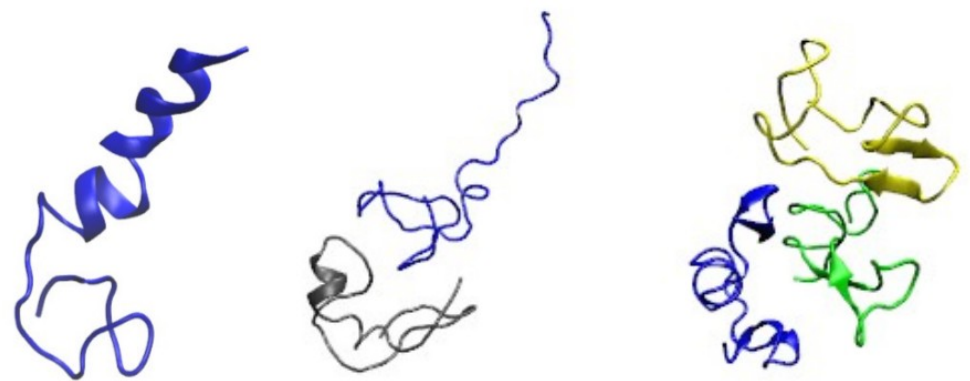
No a priori knowledge of the values of  $W_{\text{solv}}$ ,  $W_{\text{vdW}}$

An exploration in the two-dimensional space  $W_{\text{solv}}$ ,  $W_{\text{vdW}}$  should be made.

## PHASE DIAGRAM OF A PROTEIN SOLUTION



Grid density: 1x1 (10x20 points)  
Four independent simulations of a box with four amyloid beta peptides, A $\beta$ 40 at concentration 30  $\mu$ M

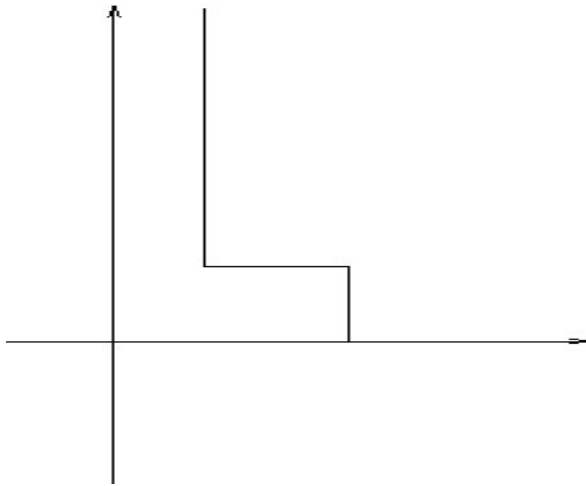


Any point in the phase transition line gives equilibrium associations/dissociations

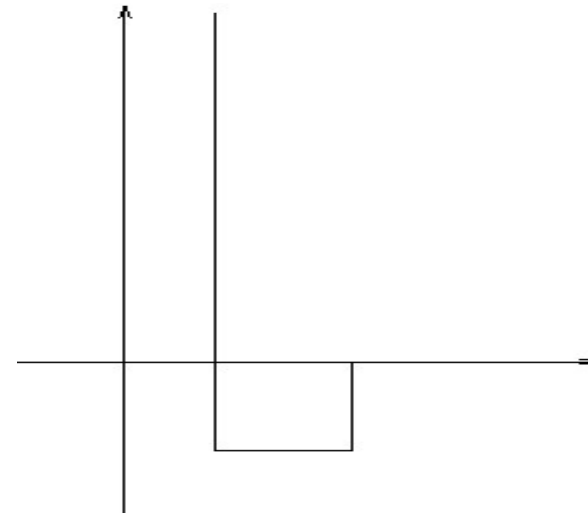
## EXAMINING THE SOLVATION POTENTIAL

Implicit solvation potential mimics the effect of **water** on the solute particles. On average, the solvation term is *repulsive*

**Hydrophilic** particles are strongly solvated, surrounded by water molecules. They are kept apart → *repulsive* term



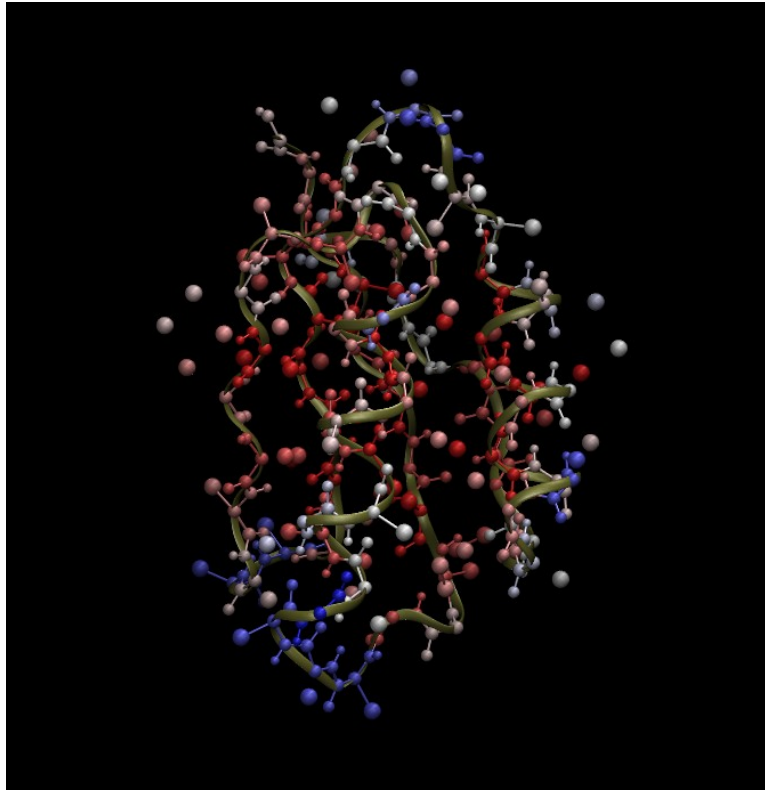
**Hydrophobic** particles are excluded by water, tend to join and form hydrophobic cores → *attractive* term



The implicit solvation model we use is *strictly valid* as long as all the particles of the protein are **completely exposed** to the solvent

The **implicit solvation** term has been modulated by a factor  $f$  that depends on the *level of exposition* of each particle to the solvent.

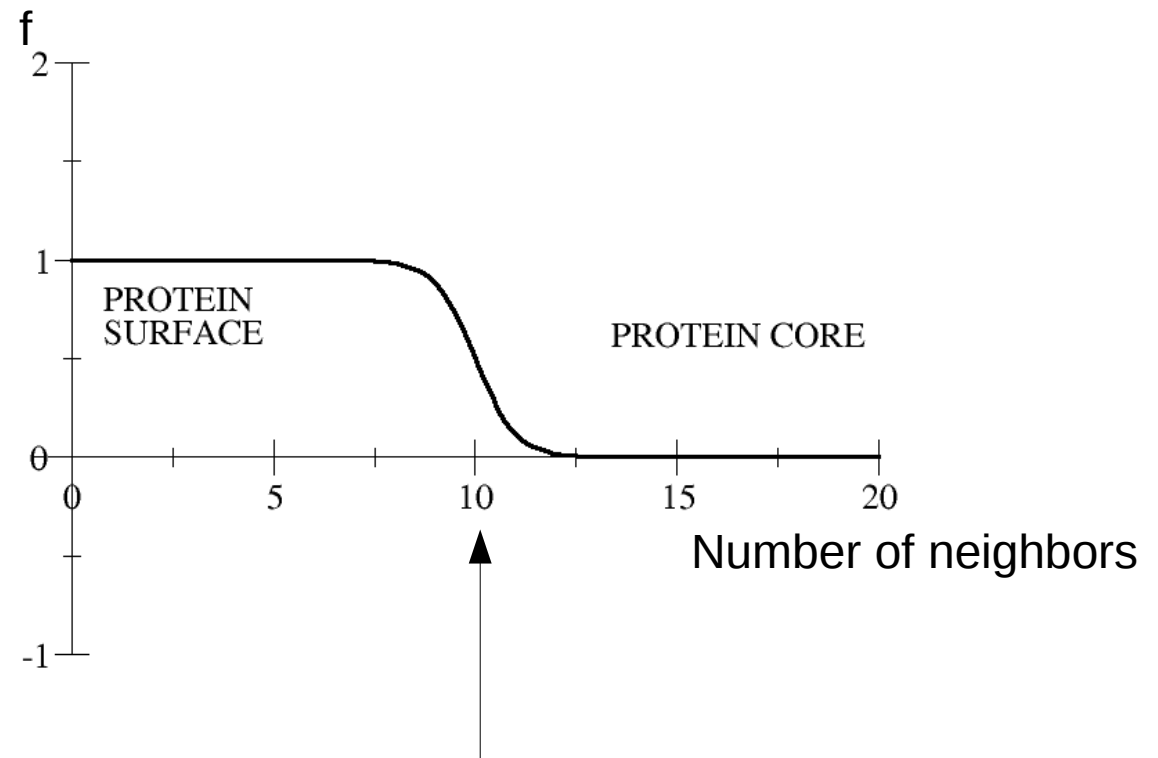
This factor becomes 0 for *no exposition* to the solvent (buried atoms) and is 1 at the *surface* of the protein (exposed to the solvent)



*Number of neighbors of each atom*

Few neighbors

Many neighbors



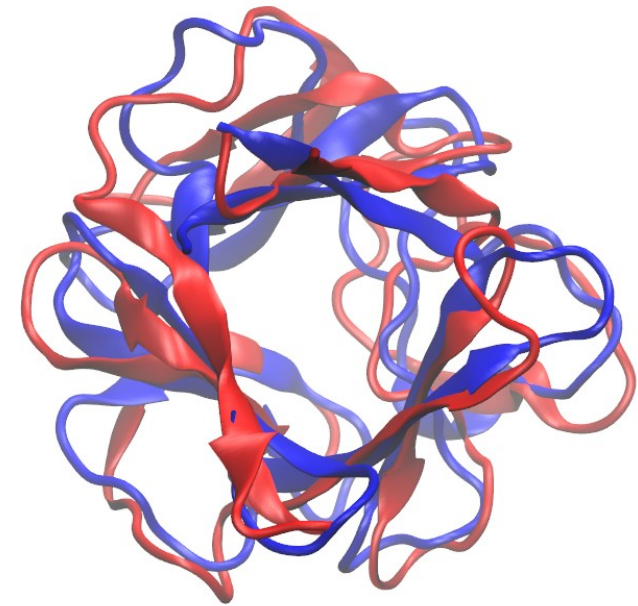
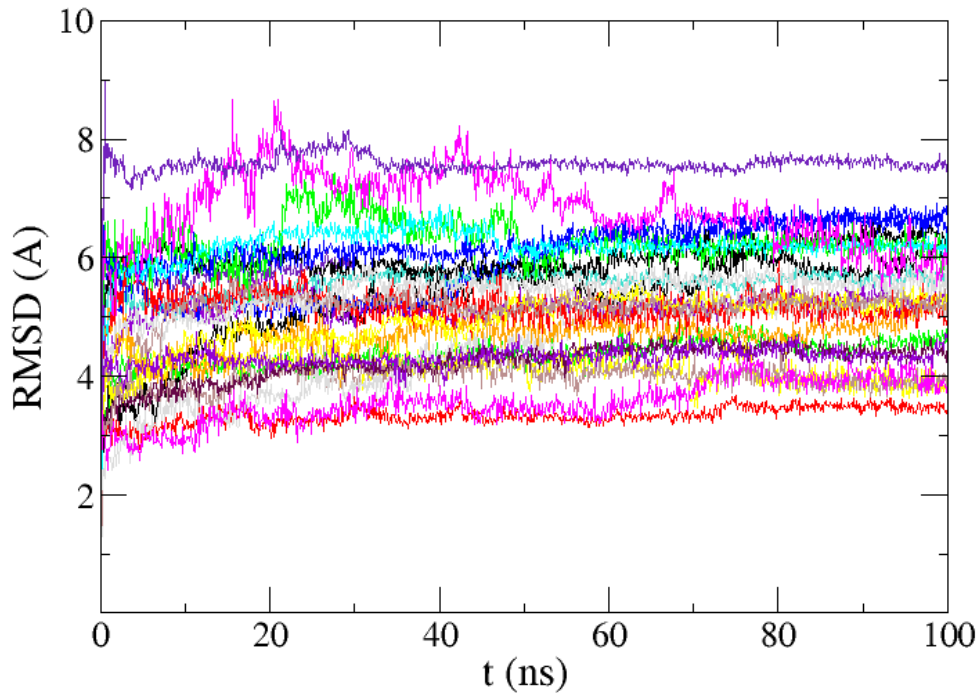
exposed/buried  
limit value

The coarse-grained model and force field was adjusted for a solution of A $\beta$ 40

*Does it work correctly for folded proteins?*

Performance of standard CG models for folded proteins: RMSD around 4 Å

Simulation of a test set of proteins:



Average RMSD: 5 Å

Included electrostatic interaction with **dielectric constant**  $\epsilon_r=20$

## PARAMETERS OF THE PROGRAM TO BE ADJUSTED IN THE OPTIMIZATION OF THE FORCE FIELD

FVDW <---->  $W_{\text{vdW}}$

FSOLV <---->  $W_{\text{solv}}$

ASOLV <----> position of the step in the modulation of solvation term

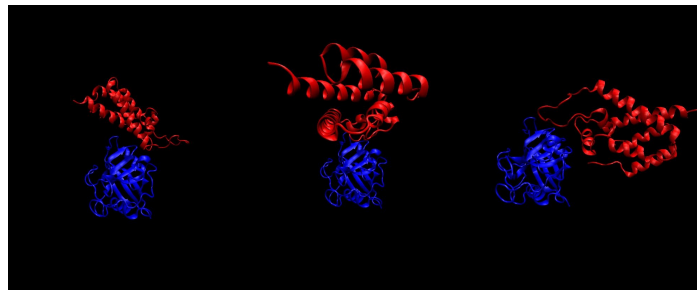
EPS <---->  $332 / \epsilon_r$  (kcal A)/(mol e<sup>2</sup>)

### APPLICATIONS:

Aggregation of peptides



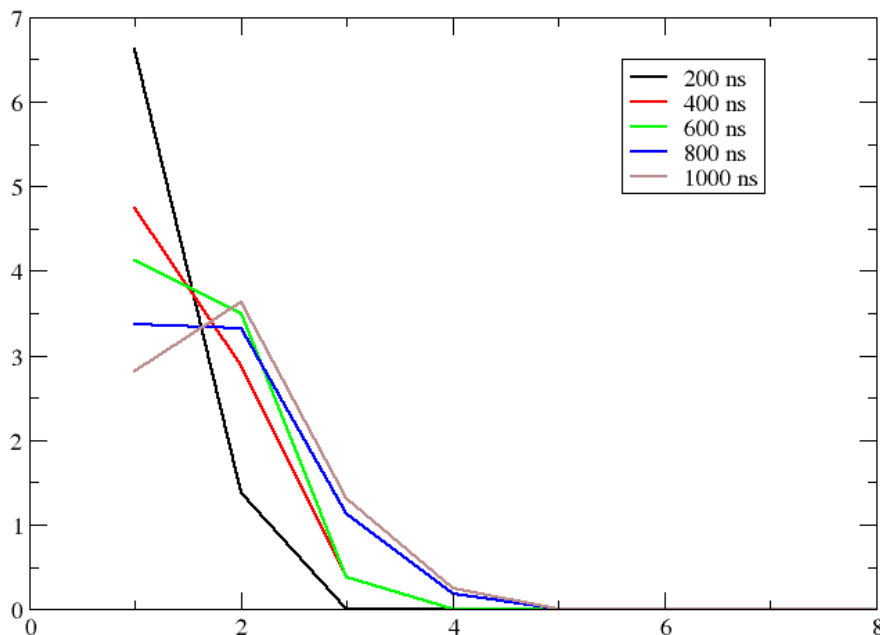
Protein-protein docking: which is the correct receptor-ligand configuration?



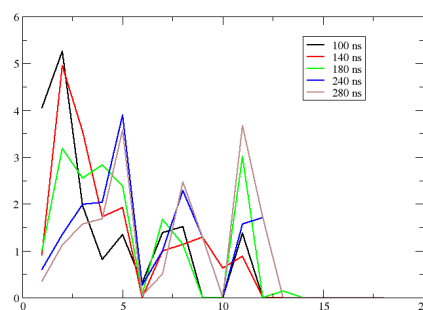
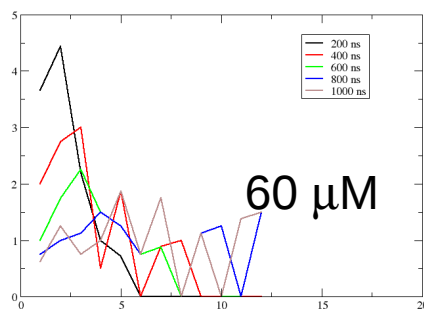
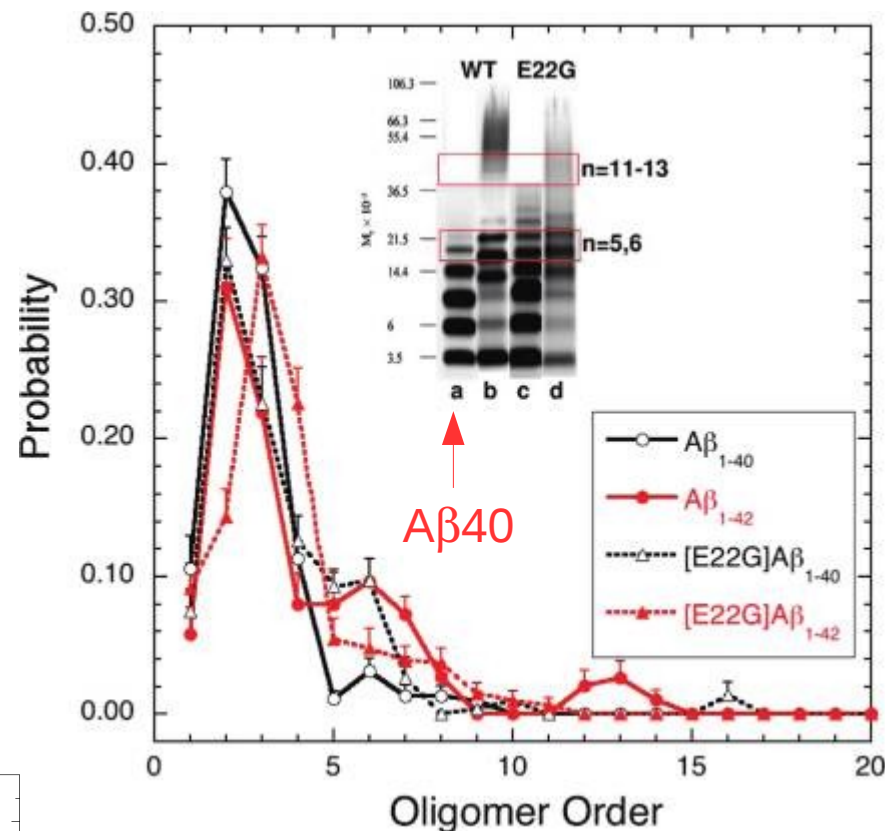
# EXAMPLE: OLIGOMERIZATION OF THE A $\beta$ 40 PEPTIDE

Comparison with experimental measurements for a 30  $\mu$ M A $\beta$ 40 solution  
 8 peptides in the simulation box (80 nm side). 16 independent simulations

## Oligomer size distribution



At higher concentrations, tendency to collapse



140  $\mu$ M