

International Spring School Statistical Thermodynamics, Santiago de Chile  
Wednesday, November 29, 2017  
Lecture 21

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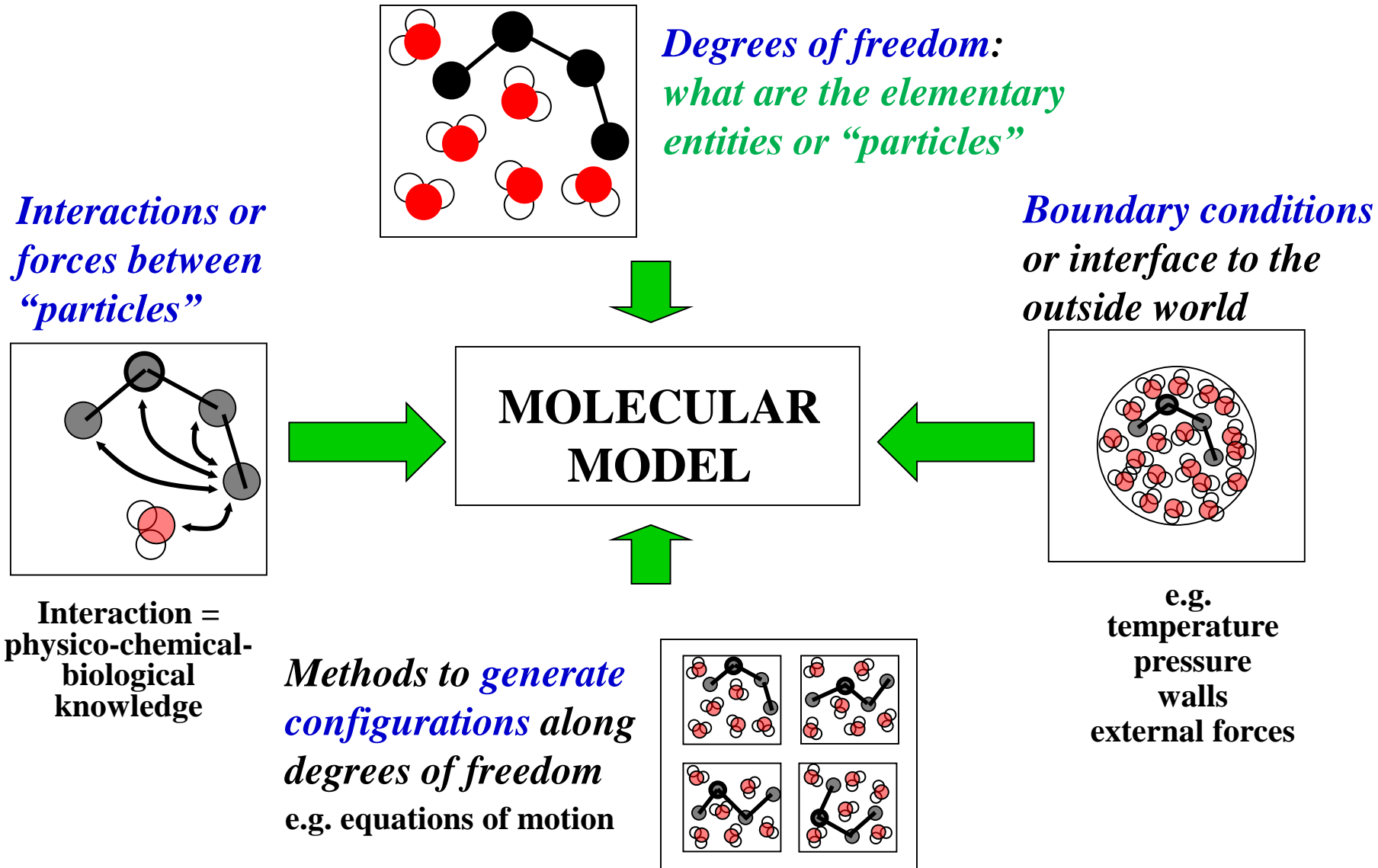
# Multi-resolution simulation: methodological issues and applications

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Prof. Dr. Wilfred F. van Gunsteren  
ETH Zürich, Switzerland

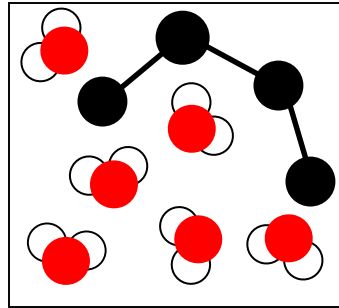
# Definition of a model for a computer simulation

For any system *four choices* have to be made

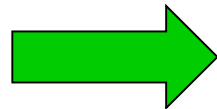
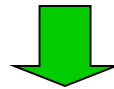


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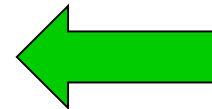
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*Degrees of freedom:  
what are the elementary  
entities or “particles”*



**MOLECULAR  
MODEL**

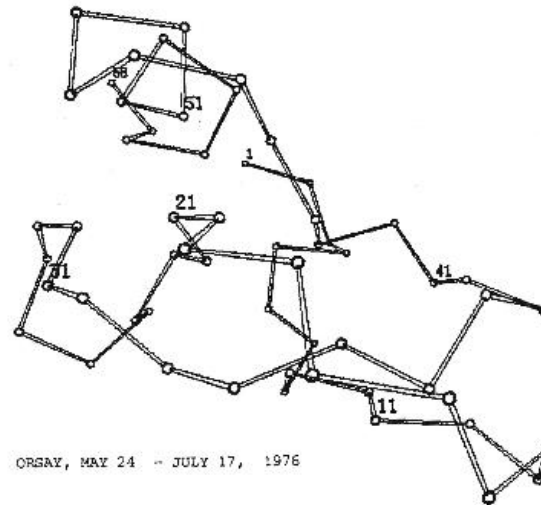


# Protein: Bovine Pancreatic Trypsin Inhibitor (BPTI) in vacuo: *58 particles* (residues) (1976)

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DE CALCUL ATOMIQUE ET MOLÉCULAIRE  
Bâtiment 504  
UNIVERSITÉ DE PARIS XI  
91405 ORSAY, FRANCE

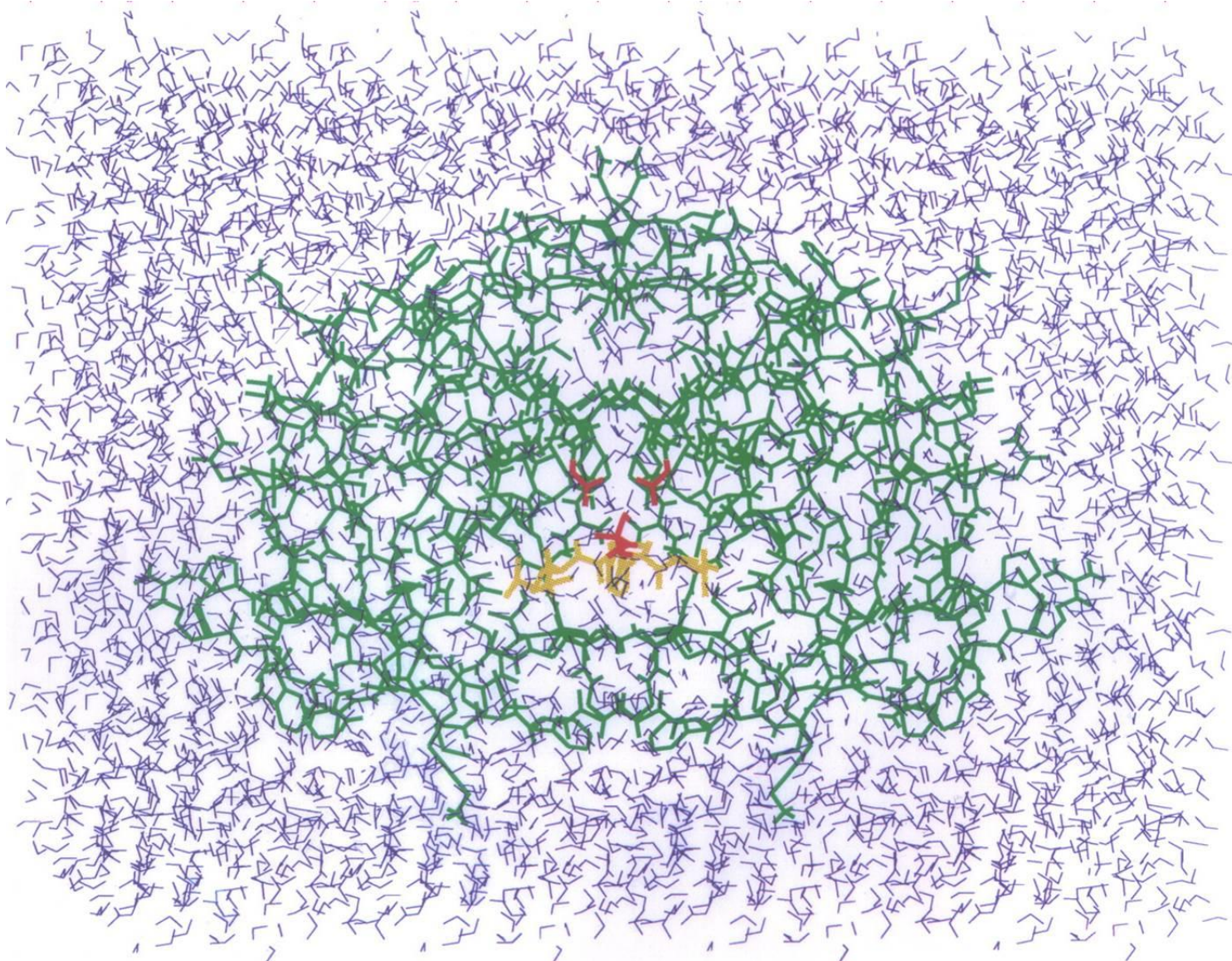
CECAM WORKSHOP

'MODELS FOR PROTEIN DYNAMICS'



*A rather simple, coarse-grained representation of a protein*

# Protein: HIV-protease plus inhibitor in water: 21000 atoms (1995)



# Different levels of resolution in modelling

*Coarse-graining from a finer-grained level to a coarser-grained level of resolution*

Quantum (statistical) mechanics  $\longrightarrow$  Classical (statistical) mechanics

Level of resolution	I	II	III	IV	V
Particles	Sub-nuclear particles: nucleons + electrons	Sub-atomic particles: nuclei + electrons	Atomic particles	Supra-atomic particles	Supra-molecular particles
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Riniker et al. *Phys. Chem. Chem. Phys.* 14 (2012) 12423-12430  
 Meier et al., *Angew. Chem. Intl. Ed.* 52 (2013) 2-17

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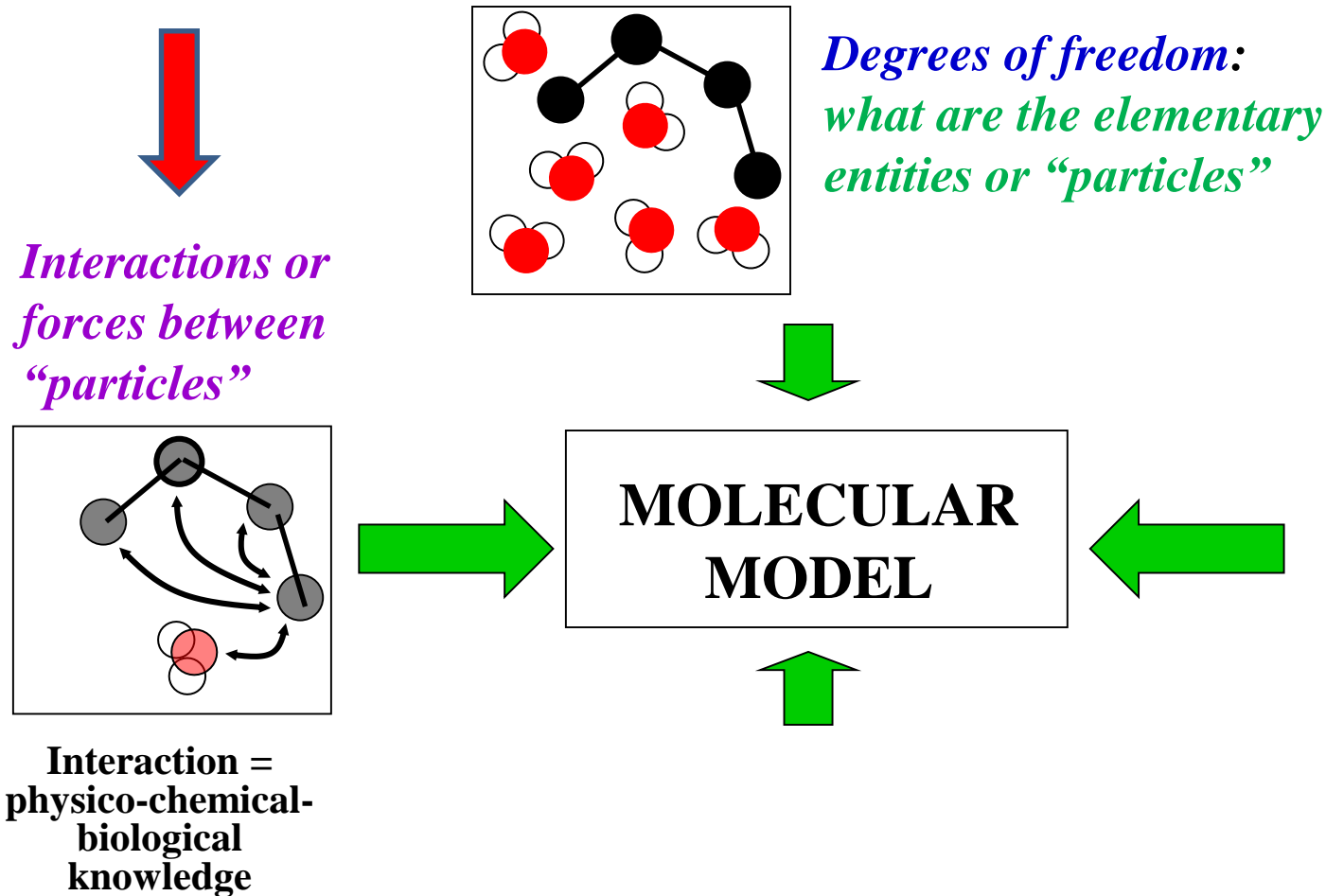
# Main differences between quantum and classical mechanics as applied to molecular systems

Quantum statistical mechanics (QM)	Classical statistical mechanics (CM)
<ul style="list-style-type: none"> <li>time-dependent Schrödinger equation:  <math display="block">i\hbar \frac{\partial \Psi(\vec{r}^N, t)}{\partial t} = \widehat{H} \Psi(\vec{r}^N, t)</math>                     with wave function <math>\Psi</math> </li> </ul>	<ul style="list-style-type: none"> <li>Newton's equation:  <math display="block">\vec{f}_i = m_i \vec{a}_i \quad \vec{f}_i = - \frac{\partial V(\vec{r}^N)}{\partial \vec{r}_i}</math> </li> </ul>
<ul style="list-style-type: none"> <li>Born-Oppenheimer approximation: nuclei and electrons decoupled</li> </ul>	<ul style="list-style-type: none"> <li>interaction potential energy function <math>V(\vec{r}^N)</math> is generally pair additive, but polarisation can be included</li> </ul>
<ul style="list-style-type: none"> <li>probabilistic nature of wave function:  <math> \Psi(\vec{r}_i, t) ^2</math>, uncertainty principle, no trajectory</li> </ul>	<ul style="list-style-type: none"> <li>phase space trajectory <math>\vec{r}^N, \vec{p}^N</math></li> </ul>
<ul style="list-style-type: none"> <li>Bose-Einstein or Fermi-Dirac statistics (Pauli principle)</li> </ul>	<ul style="list-style-type: none"> <li>Boltzmann statistics</li> </ul>



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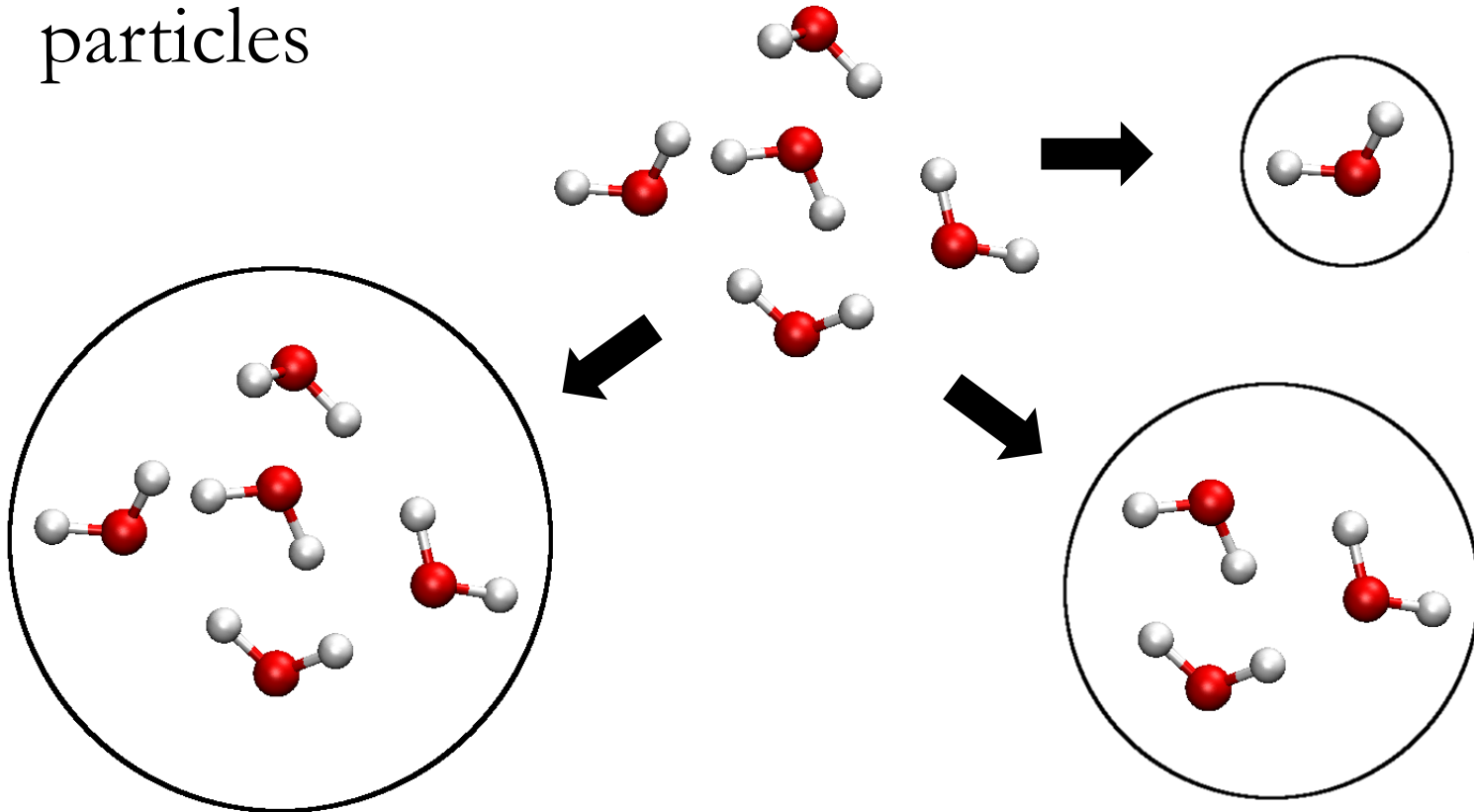
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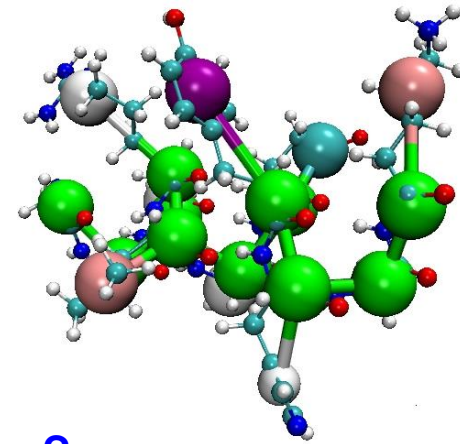
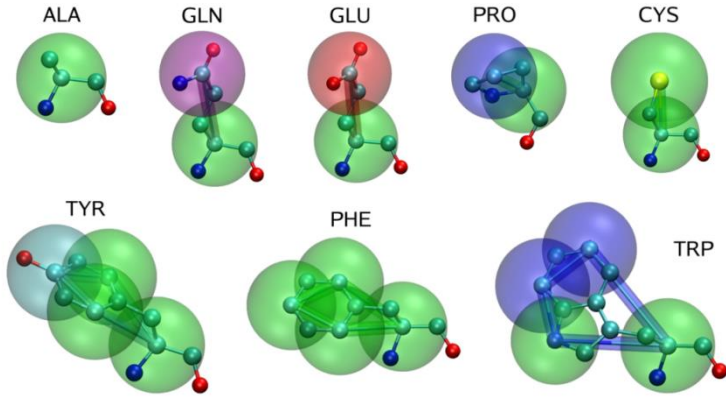
# Modelling involves, at any level of resolution, coarse-graining:

Elimination of non-essential *degrees of freedom* and *interactions* from a more fine-grained level of modelling

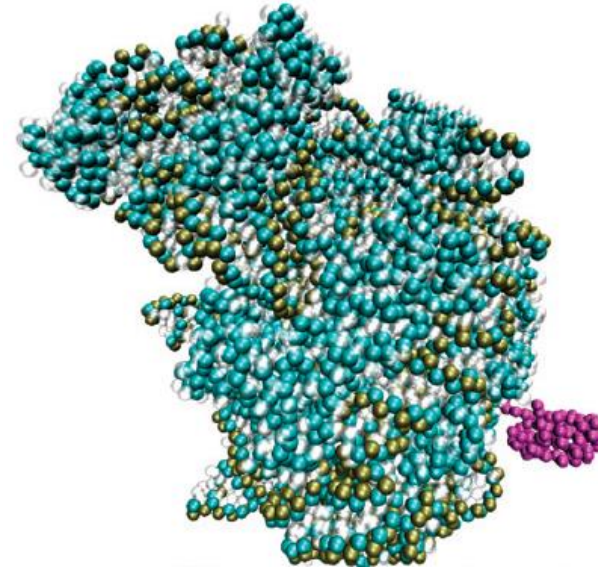
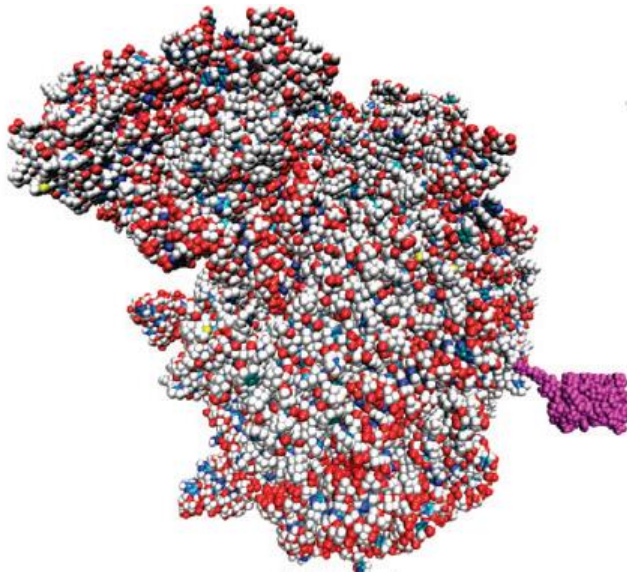
- Combine selected sets of particles into larger particles



# Fine-grained versus coarse-grained models



Loss of accuracy ?



Atomic (fine-grained) level

Supra-atomic (coarse-grained) level

# Why do coarse-graining?

- Fewer interaction sites → lower computational cost
- Smoother energy surface → longer time step

simulate larger systems for longer timescales

- **But watch out:**
  - only appropriate when details are unimportant
  - loss of entropy
  - modelling “style” depends on purpose:
    - which properties are (inevitably) lost and
    - which properties are to be kept

*Riniker et al., Phys. Chem. Chem. Phys. 14 (2012) 12423-12430*  
*Riniker & van Gunsteren, J. Chem. Phys. 134 (2011) 084110*  
*Allison et al., J. Chem. Phys. 136 (2012) 054505*

# Principles of coarse-graining I

**When can particular degrees of freedom be eliminated ?**

1. Eliminated degrees of freedom must be **non-essential** for the process or property of interest

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Examples: conditions satisfied

- CH, CH<sub>2</sub>, CH<sub>3</sub> united atoms
- bond-length constraints

conditions *not* satisfied

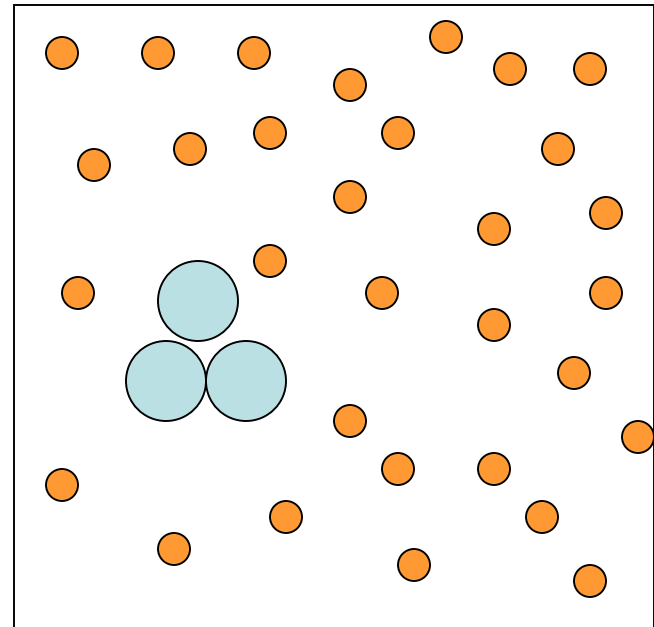
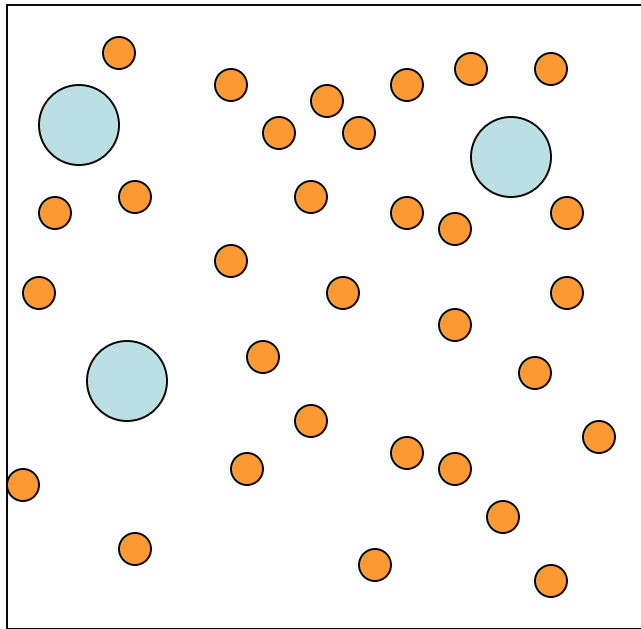
- supra-atomic proteins
- **implicit solvent model**

# The hydrophobic effect

What keeps proteins folded?

Why does oil separate from water?

Why do people who do not know anyone at parties, end up together ?



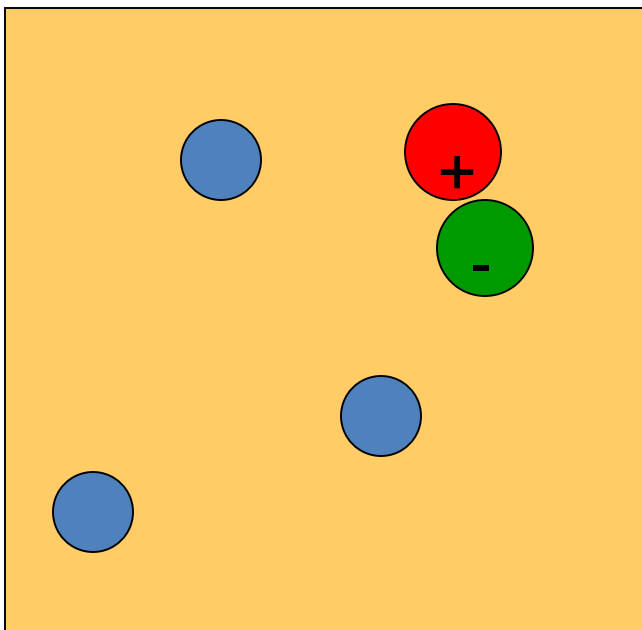
Particles (**blue ones**) are driven together by favourable interactions **within** the environment (**yellow ones**)

***This interaction driving the blue particles together cannot be coarse-grained***

# Modelling or simulating the hydrophobic effect

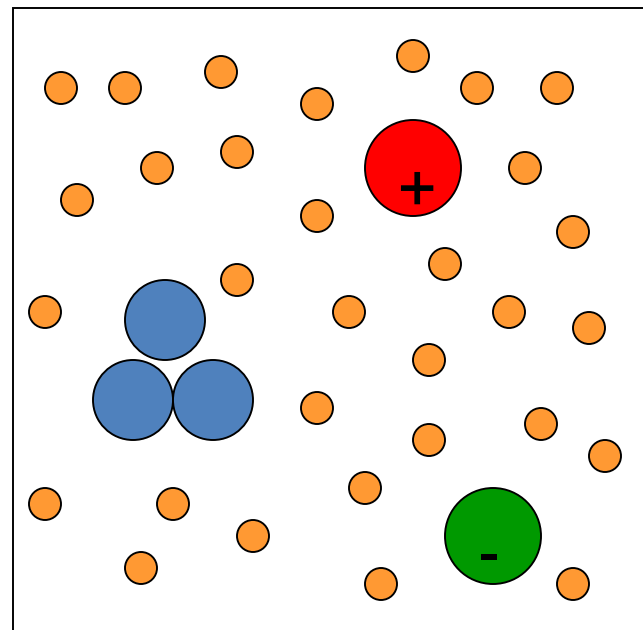
## Implicit solvent:

- no aggregation of "hydrophobic" solutes
- too strong electrostatic interaction:  
aggregation of unlike charges
- no entropy of solvent



## Explicit solvent:

- aggregation of "hydrophobic" solutes
- damped electrostatic interaction:  
solvation of charges
- entropy of solvent



It is *NOT* true that hydrophobic particles do not like water, rather the interaction of water with water is stronger.  
Ions with unlike charges like water more than themselves.

***Implicit solvation models are missing the fundamental biomolecular interactions, which are automatically included in explicit solvent simulations***

# Principles of coarse-graining II

**What properties or processes should be maintained (important) ?**

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3. Dielectric properties: **static permittivity  $\epsilon(0)$**  governs the screening of Coulomb interactions

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3. **Dielectric properties**: **static permittivity  $\epsilon(0)$**  governs the screening of Coulomb interactions
4. **Dynamic properties**: **diffusion, viscosity, relaxation times**, are **less important** because most biomolecular processes are thermodynamically driven



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**Coarse-graining only pays off for:**

- level II to level III (not for solvent)
- level III to level IV (only for  $\text{CH}_n$  united atoms)
- level III to level V (only for solvent)

# Development of a (FG or CG) model I

## 1. Choice of (FG or CG) degrees of freedom:

How many FG particles in one CG particle ? Solvent: 2 – 5

How many interaction sites per (FG or CG) particle ? Solvent: at least 2

## 2. Choice of functional form of the (FG or CG) interaction:

van der Waals interaction:  $r^{-6}$  attraction

Fermi-exclusion repulsion:  $r^{-12}$  or exponential repulsion

Coulomb interaction:  $r^{-1}$  plus reaction field

$$E_{pot} = \sum_{i=1} \sum_{j=1} \left( \frac{C_{12}}{r_{ij}^{12}} - \frac{C_6}{r_{ij}^6} \right) + \frac{q_i q_j}{4\pi\epsilon_0 \epsilon_{cs}} \left( \frac{1}{r_{ij}} - \frac{C_{RF} r_{ij}^2}{2R_{RF}^3} - \frac{1 - \frac{1}{2} C_{RF}}{R_{RF}} \right)$$

Dielectric permittivity in the cut-off sphere  $\epsilon_{cs}$  depends on grain level

$$\epsilon_{cs}(FG) < \epsilon_{cs}(CG)$$

van der Waals parameters  $C_{12}$  and  $C_6$  depend on grain level

in multi-resolution models additional parameters are present:

permittivity  $\epsilon_{cs}(FG-CG)$  and  $C_{12}(FG-CG)$  and  $C_6(FG-CG)$

# Development of a (FG or CG) model II

## 3. *Calibration* of model parameters: *only for small molecules*

1. Against experimental *thermodynamic data* for the compounds of interest (density, surface tension, heat of vaporisation, excess free energy)
2. Against *dielectric properties* of the compounds
3. Against structural data of the compounds

### I. For *single-resolution level models*:

- a. single compounds: water, methanol, DMSO, chloroform
- b. mixtures of compounds: water + methanol, + DMSO

### II. For *multi-resolution level models*:

- a. FG + CG system of single compounds: FG water in CG water
- b. FG + CG system of mixtures of compounds: FG protein in CG water

## 4. *Testing* of (FG or CG) models: *mainly for large molecules*

1. structural data e.g. protein structure
2. energetic data e.g. stability, relative energy of protein structure
3. dynamic data e.g. (un)folding time of a polypeptide

# Multi-resolution simulation in biochemistry

1. Development of a supra-molecular model for biomolecular or organic solvents:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH, DMSO,  $\text{CHCl}_3$
  - b. Mixtures of these compounds
2. Development of a multi-resolution model for biomolecular systems:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH
  - b. Testing for proteins in water: HEWL, CspA, protein G, chorismate mutase (CM)
    1. structure (hydrogen bonding)
    2. stability (energetics)
  - c. Testing for peptides in methanol: three beta-peptides
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# An example of a *sub-atomic* water model: The COS/D2 polarisable model

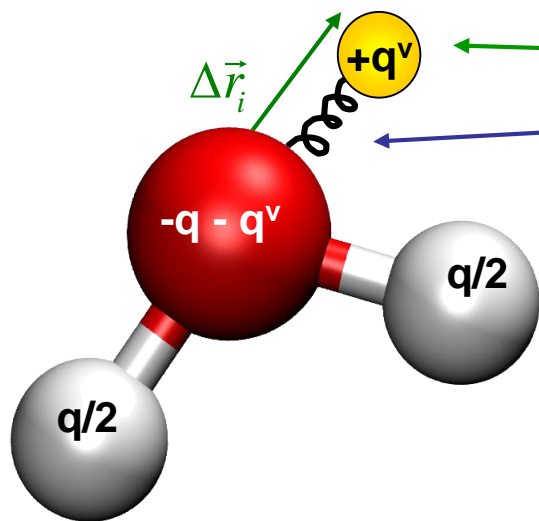
- Four-site (FG) model

The **simplest realisation of polarisation** is the **displacement** of a **charge**  $q^v$  at a **virtual (massless) site** which is **restrained by** a harmonic potential (a **spring**) to one of the real (atomic) sites or to a virtual site.

Inducible electric dipole

$$\vec{\mu}_i = q_i^v \Delta \vec{r}_i$$

$$\Delta \vec{r}_i = \vec{r}_i^v - \vec{r}_o$$



virtual site

spring force constant

$$\frac{(q_i^v)^2}{\alpha_i}$$

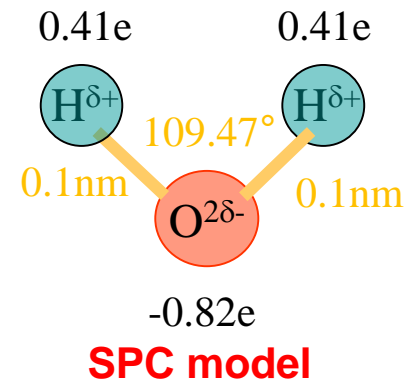
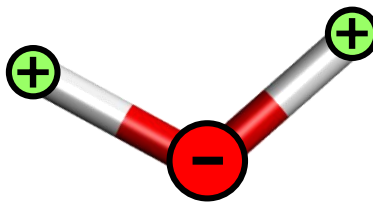
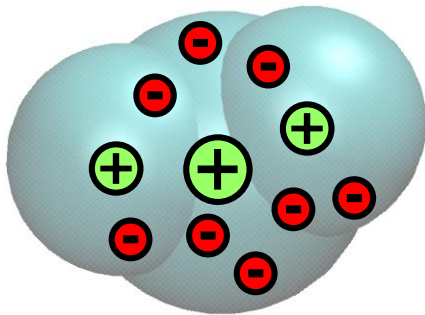


atom polarisability

energy: 
$$U(\Delta \vec{r}_i) = \frac{1}{2} k_i^{ho} (\Delta \vec{r}_i)^2$$

# An example of an *atomic* water model: The Simple Point Charge (SPC) model

- Three-site FG model:
  - encompasses 1  $\text{H}_2\text{O}$  molecule, 3 atoms
  - 1 hard-core L-J interaction site, 3 charged sites
  - explicit treatment of electrostatics
  - rigid geometry  $\rightarrow$  no intra-molecular polarisability



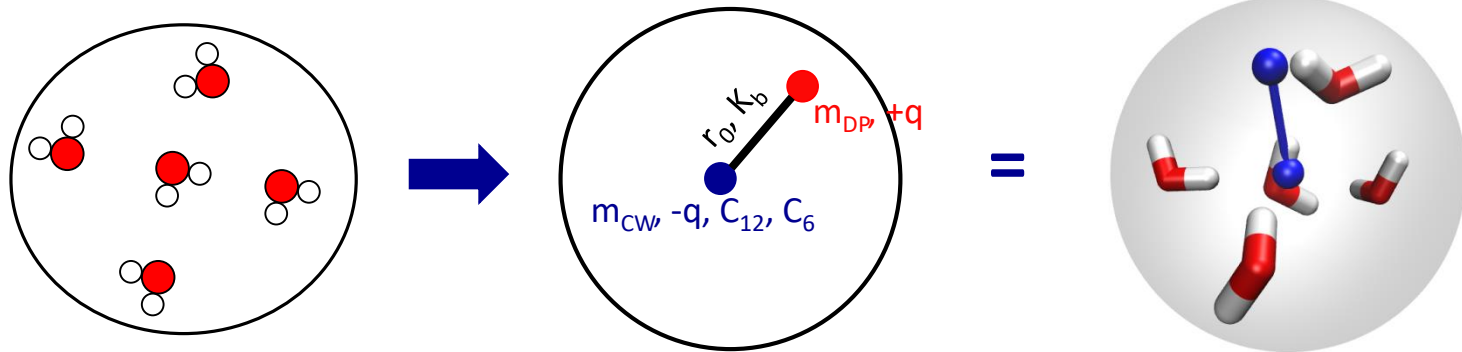
Berendsen *et al.*, in "Intermolecular Forces", B. Pullman ed., Reidel, Dordrecht (**1981**) 331-342



# An example of a *supra-molecular* (CG) water model

- Two-site CG model:

- encompasses 5  $\text{H}_2\text{O}$  molecules
- 1 hard-core L-J interaction site, 2 oppositely charged sites
- explicit treatment of electrostatics
- variation of length and orientation of “bond” connecting charged particles  $\rightarrow$  polarisability



Riniker & van Gunsteren, *J. Chem. Phys.* 134 (2011) 084110

# Properties of liquid water at different levels of resolution

Properties	Experiment	Sub-atomic level model (COS/D2, 1 H <sub>2</sub> O) 2014, 4 sites	Atomic level model (SPC, FG, 1 H <sub>2</sub> O) 1981, 3 sites	Supra-molecular level model (CG, 5 H <sub>2</sub> O) 2011, 2 sites
$\rho$ (kgm <sup>-3</sup> ) density	997	999	972	995
$\epsilon(0)$ dielectric permittivity	78.4	78.9	66.6	73.7
$\gamma$ (10 <sup>-3</sup> Nm <sup>-1</sup> ) surface tension	71.6	63.6	53.4	51.2
$C_p$ (Jmol <sup>-1</sup> K <sup>-1</sup> ) heat capacity	75.3	88.9	68.9	83.2
$\alpha_p$ (10 <sup>-4</sup> K <sup>-1</sup> ) thermal expansion	4.2	4.9	9.0	26.0
$\kappa_T$ (10 <sup>-5</sup> atm <sup>-1</sup> ) Compressibility	4.6	4.4	4.7	11.1
$D$ (10 <sup>-9</sup> m <sup>2</sup> s <sup>-1</sup> ) Diffusion	2.3	2.2	4.2	6.9

parametrised against

Overall “best” model

$\gamma, \alpha_p, D$   
are off

$\alpha_p, \kappa_T, D$   
too large

# Trade-off between levels of resolution

The process of coarse-graining may reduce the usefulness of the model in different ways:

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5. The **reduction of entropy and energy** in the system may lead to an **unphysical balance** between these two quantities in the coarse-grained model

# Energy-entropy compensation in liquids

Atomic-level, fine-grained (FG), (non-)polarisable models

Supra-molecular, coarse-grained (CG), polarisable models

		<i>Free energy</i>	<i>Energy</i>	<i>TΔS<sub>vap</sub></i> <i>Entropy</i>	<i>TΔS<sub>vap</sub></i> <i>ΔH<sub>vap</sub></i>	
	<i>Name of model</i>	<i>ΔF<sub>exc</sub></i> <i>kJ mol<sup>-1</sup></i>	<i>ΔH<sub>vap</sub></i> <i>kJ mol<sup>-1</sup></i>	<i>ΔH<sub>vap</sub> - ΔF<sub>exc</sub></i> <i>kJ mol<sup>-1</sup></i>		
Water						
	experiment	24.0	44.0	20.0	0.45	
	polarisable FG model	COS/G2	21.8	43.7	21.9	0.50
	non-polarisable FG model	SPC	23.6	43.9	20.3	0.46
	polarisable CG model	CGW	11.0	25.9	14.9	0.58
Methanol						
	experiment	17.8	38.1	20.3	0.53	
	polarisable FG model	COS/M	14.7	37.8	23.1	0.61
	non-polarisable FG model		16.7	37.9	21.2	0.56
	polarisable CG model	CGM	7.3	18.0	10.7	0.59

Energy – entropy compensation:  $T\Delta S_{vap} \approx \frac{1}{2} \Delta H_{vap}$

The CG water has a higher **entropy/enthalpy** ratio than the FG water and experiment



# Trade-off between levels of resolution

The process of coarse-graining may reduce the usefulness of the model in different ways:

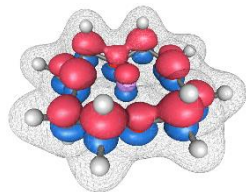
1. The **range of thermodynamic state points** at which the model may be applied is generally reduced
2. The **transferability of model parameters** between similar but not identical moieties or compounds is usually reduced
3. The **accuracy** of various properties may be reduced
4. The **physical basis** of a particular property or process may be **changed**, leading to an **unphysical mechanism** of the process in the coarse-grained model
5. The **reduction of entropy and energy** in the system may lead to an **unphysical balance** between these two quantities in the coarse-grained model

## Conclusion:

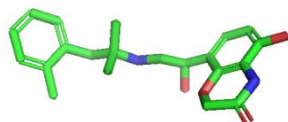
The combined loss of usefulness on these five counts must be made up for by a much increased computational efficiency of the coarse-grained model

**Challenge :** Development of more accurate energy functions (force fields) for biomolecular simulation, at any level of resolution

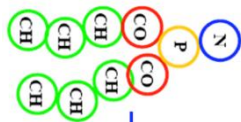
# Combining Different Levels of Resolution



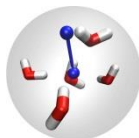
**QM description**  
Nuclei + electrons



**Atomistic description**  
Atoms = point charges



**Supra-atomic CG description**  
Multiple atoms = CG bead



**Supra-molecular CG description**  
Multiple molecules = CG bead

**QM/MM simulations**

**Hybrid  
atomistic/coarse-  
grained  
simulations**

**Goal:**

**Reduce computational effort while retaining details for region of interest**


# Supra-Atomic versus Supra-Molecular

## Technical issues

	Supra-atomic	Supra-molecular
<b>CG bead</b>	multiple <i>atoms</i>	multiple <i>molecules</i>
<b>Pressure correction</b>	no	yes
<b>Cut-off sphere <math>\epsilon_{CS}</math></b>	1	> 1
<b>Parametrisation method</b>	<ul style="list-style-type: none"><li>• Force matching</li><li>• Iterative Boltzmann</li><li>• Reverse Monte Carlo</li></ul>	<ul style="list-style-type: none"><li>• Fitting to thermodynamic properties (e.g. dielectric permittivity, density, surface tension)</li></ul>
<b>Validation</b>	<ul style="list-style-type: none"><li>• Molecular properties (e.g. RDF, free energies, diffusion)</li><li>• System properties</li></ul>	<ul style="list-style-type: none"><li>• Other system properties</li></ul>
<b>Examples</b>	<ul style="list-style-type: none"><li>• United atoms (<math>\text{CH}_x</math>)</li><li>• 1:1-water models</li><li>• Most CG protein, lipid and ligand models</li></ul>	<ul style="list-style-type: none"><li>• Solvent models with higher mappings</li><li>• Ultra coarse-graining (e.g. lipid patches, polymers)</li></ul>

# Multi-graining or multi-resolution simulation

## Combine different levels of resolution in one system:

1. Switching between levels of resolution for all particles of the system in time:  
**multi-graining in time**
  - a. Coarse-grained (CG) simulation => **map** particular configurations to the fine-grained (FG) level
  - b. A coupling parameter defines a **path between FG and CG** representations of particles: smooth switching (*J. Chem. Phys.* 124 (2006) 154106)
2. System contains a mixture of fine-grained and coarse-grained particles:  
**multi-graining in space**
  - a. Space is divided into **fixed FG and CG regions** with a buffer region in which particles change character between FG and CG  
The resolution of particles changes with their position
  -  b. Particles are either **FG or CG** and **can freely mix** (*J. Chem. Phys.* 137 (2012) 044120)  
The resolution of the particles is fixed

# Multi-resolution simulation in biochemistry

1. Development of a supra-molecular model for biomolecular or organic solvents:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH, DMSO,  $\text{CHCl}_3$
  - b. Mixtures of these compounds
2. Development of a multi-resolution model for biomolecular systems:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH
  - b. Testing for proteins in water: HEWL, CspA, protein G, chorismate mutase (CM)
    1. structure (hydrogen bonding)
    2. stability (energetics)
  - c. Testing for peptides in methanol: three beta-peptides
    3. folding (structure, energetics, dynamics)
3. Development of a supra-molecular model for lipids:
  - a. Lipid tails: n-alkanes

# Multi-resolution model for liquid H<sub>2</sub>O

Simulation of mixtures of atomic (FG) and supra-molecular (CG) water particles

Configuration of a 1:1 FG:CG mixture: 6400 FG molecules and 1280 CG beads

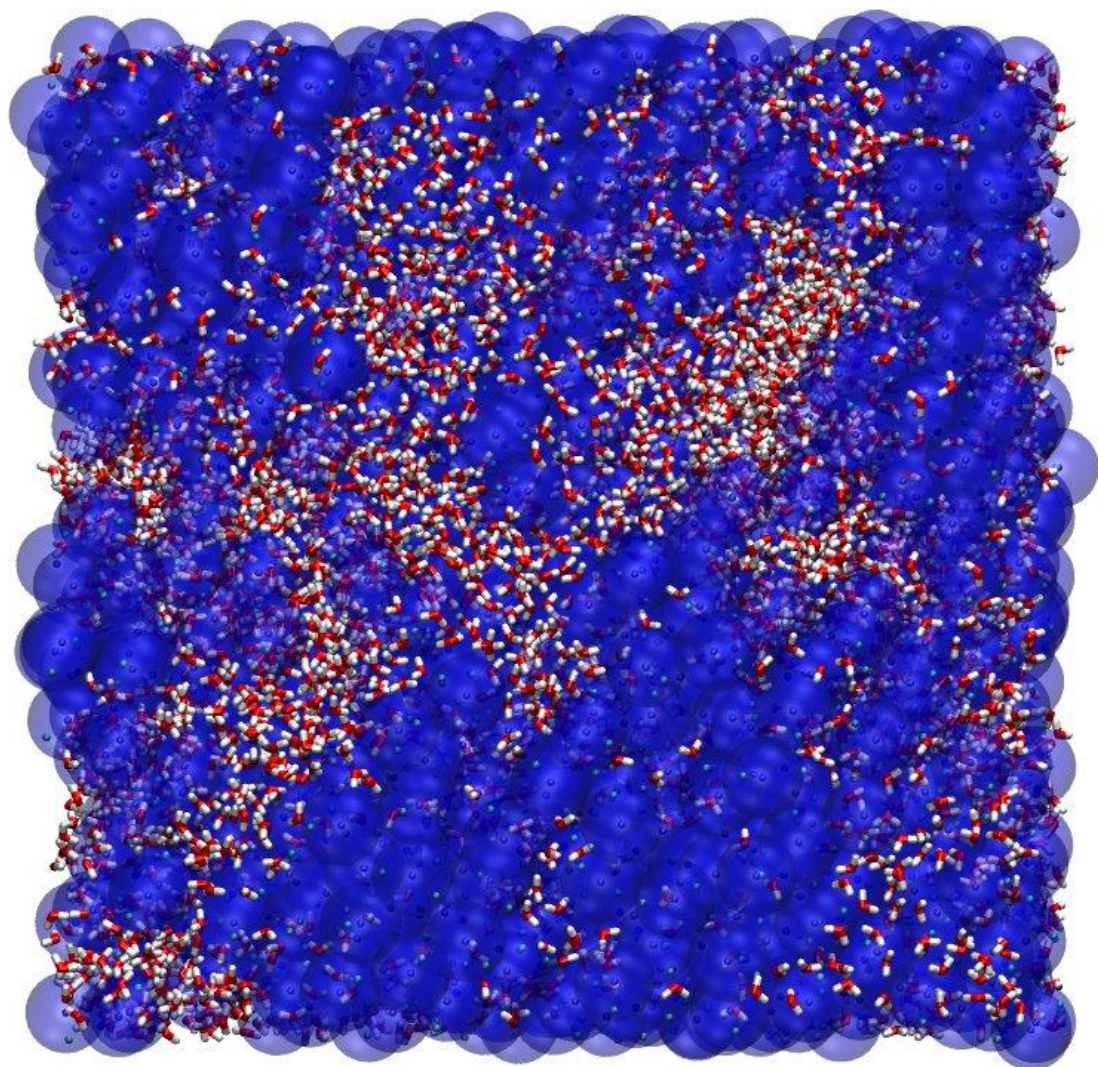
One bead  
corresponds to  
5 H<sub>2</sub>O molecules

Relative dielectric  
permittivity in the  
cut-off sphere:

$$\epsilon_{cs}(\text{FG-FG}) = 1.0$$

$$\epsilon_{cs}(\text{FG-CG}) = 2.3$$

$$\epsilon_{cs}(\text{CG-CG}) = 2.5$$



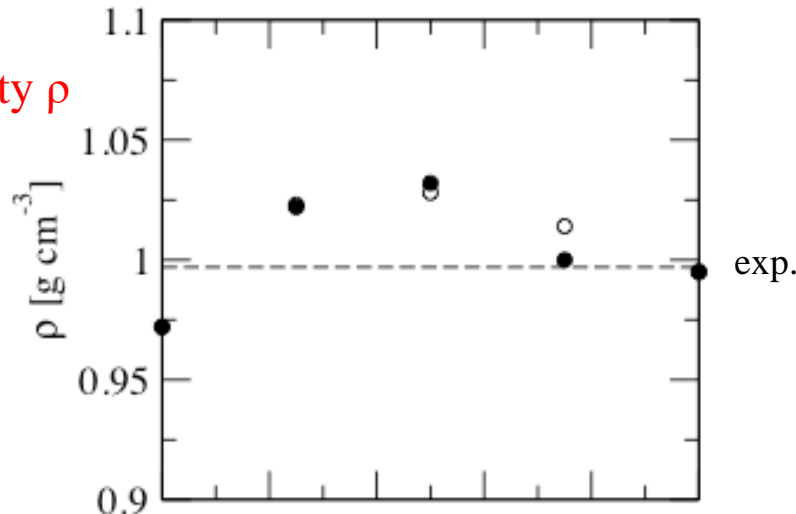
Riniker & van Gunsteren,  
*J. Chem. Phys.* 137 (2012) 044120

# Multi-resolution model for liquid H<sub>2</sub>O

Simulation of mixtures of atomic (FG) and supra-molecular (CG) water particles

Properties as function of *mole fraction*  $x_{CG}$  of CG particles (298 K, 1 atm)

Density  $\rho$



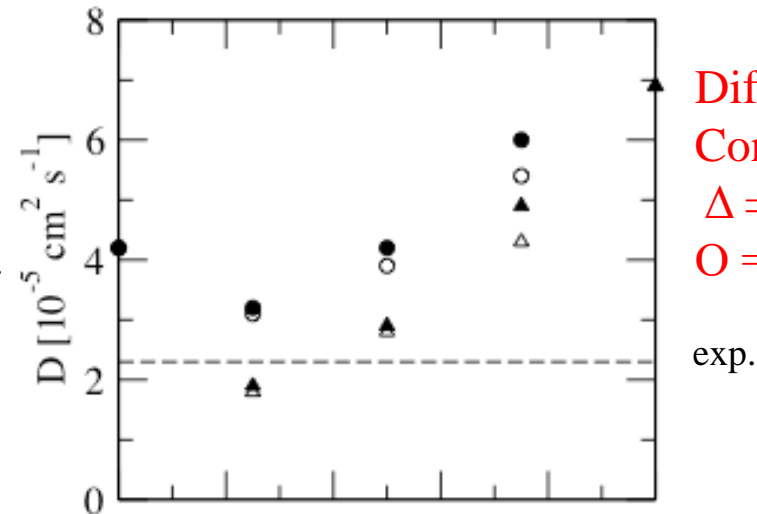
exp.

Diffusion

Constant  $D$

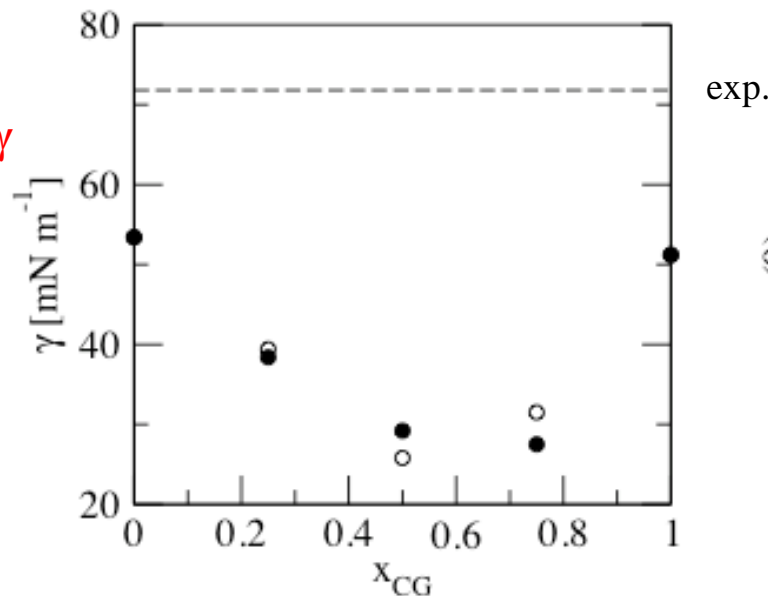
$\Delta$  = CG

O = FG



exp.

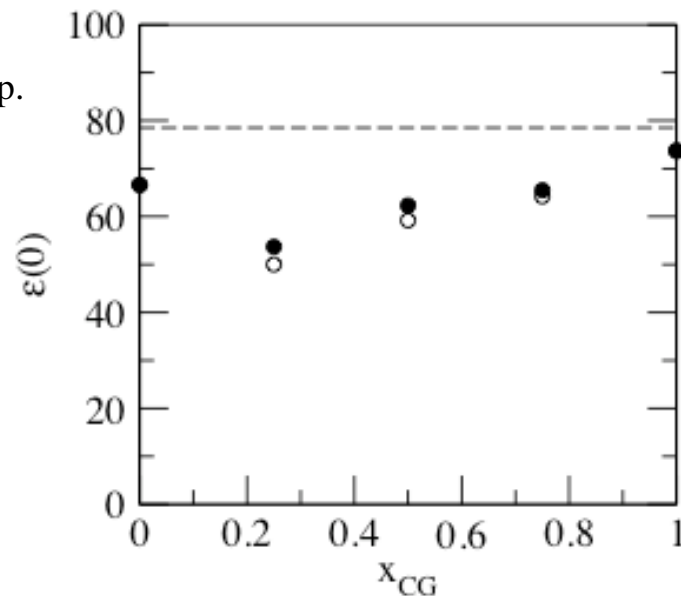
Surface tension  $\gamma$



exp.

exp.

Static dielectric permittivity  $\epsilon(0)$

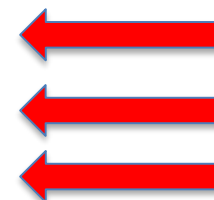


In an ideal modelling world the properties should not change as function of mole fraction  $x_{CG}$

# Multi-resolution model for hydrophobic hydration

*Free enthalpy of solvation*  $\Delta G_{solv}$  of an **atomic level (FG) alkane solute** in *atomic level (FG) H<sub>2</sub>O* or in *supra-molecular (CG) H<sub>2</sub>O*

Solute	$\Delta G_{solv}$ Exp. <sup>[1,2]</sup> [kJ/mol]	$\Delta G_{solv}$ in FG <sup>[3]</sup> [kJ/mol]	$\Delta G_{solv}$ in CG [kJ/mol]
<b>Methane</b>	8.2	6.2	2.8
<b>Ethane</b>	7.5	7.4	5.3
<b>Propane</b>	8.2	8.6	6.7
<b>Butane</b>	8.8	8.7	8.6
<b>Pentane</b>	9.8	10.2	10.1
<b>Hexane</b>	10.5	11.5	12.2



[1] D. Juchli, *Diploma Thesis at the Laboratory of Physical Chemistry*, ETH Zurich (2000).

[2] S. Cabani, P. Gianni, V. Mollica, L. Lepori, *J. Solut. Chem.*, **10**, 563 (1981).

[3] L. Schuler, X. Daura, W. F. van Gunsteren, *J. Comput. Chem.*, **22**, 1205 (2001).

Multi-graining simulation: the FG-CG interaction is to be calibrated:

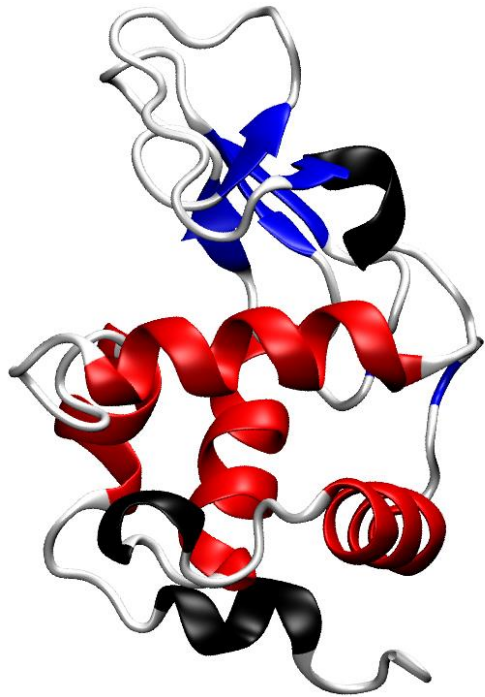
- 1. adaption of the van der Waals parameters  $C_{12}(\text{FG-CG})$  and  $C_6(\text{FG-CG})$
- 2. adaptation of the dielectric permittivity  $\epsilon_{cs}(\text{FG-CG})$  in the cut-off sphere



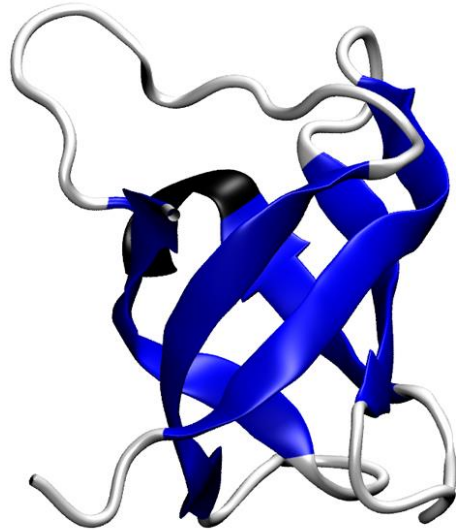
# Multi-resolution simulation in biochemistry

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3. Development of a supra-molecular model for lipids:
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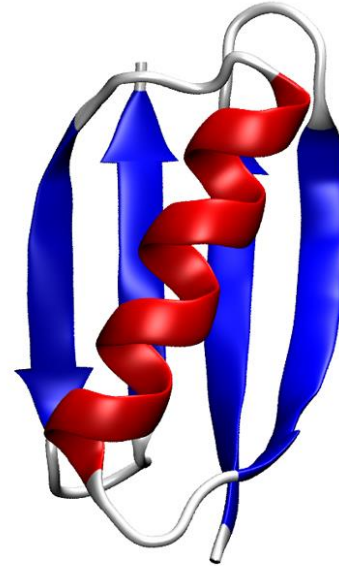
# Multi-resolution simulation of four atomic-level (FG) proteins in supra-molecular (CG) water



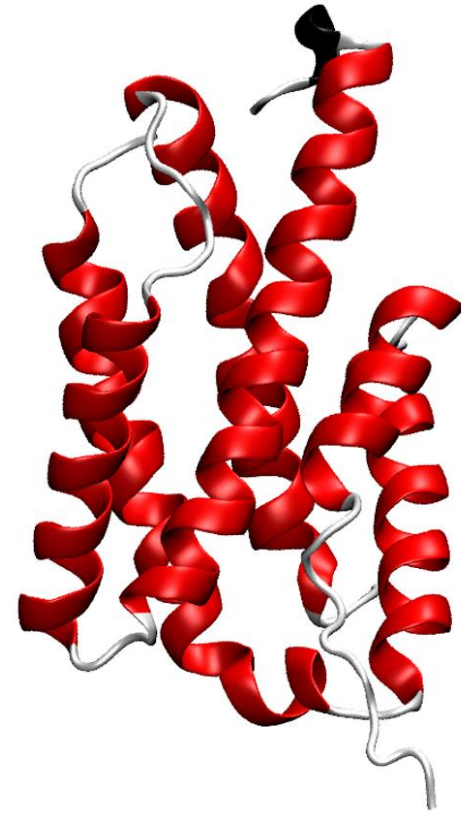
**Hen Egg White Lysozyme  
(HEWL)**



**Major cold shock protein  
(CspA)**



**Protein G  
(PG)**



**Chorismate mutase  
(CM)**

# Multi-resolution simulation of four atomic-level (FG) proteins in supra-molecular (CG) water

## Hydrogen bonding:

*Left scale (bars):*  
total number of  
hydrogen bonds

bb - bb

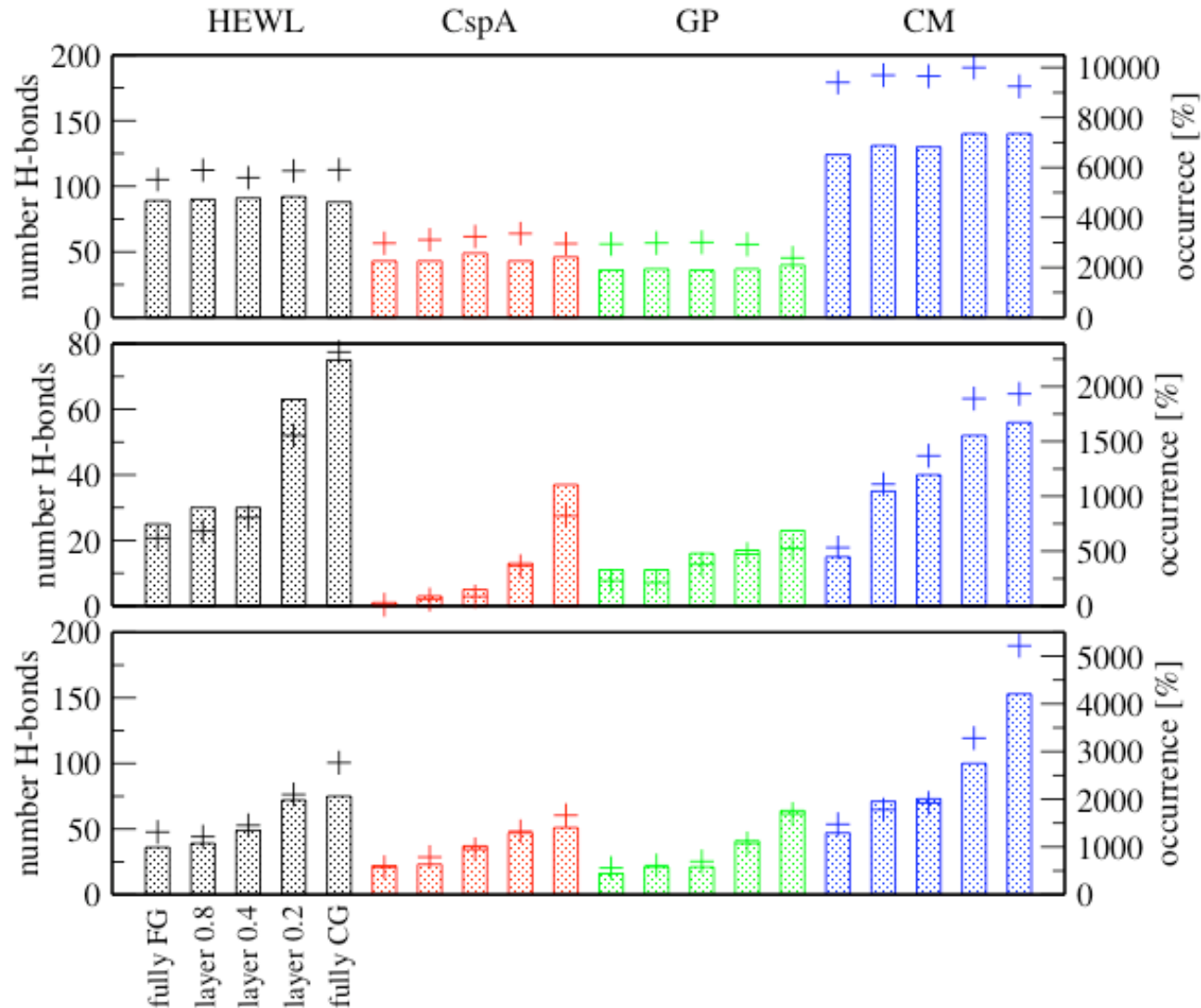
*Right scale (+):*  
occurrence (%) of  
hydrogen bonds

bb - sc

## Five solvent models:

1. Fully atomic (FG)
2. Atomic layer 0.8 nm
3. Atomic layer 0.4 nm
4. Atomic layer 0.2 nm
5. Fully supra-molecular (CG)

sc - sc



An 0.8 nm atomic (FG) solvent layer around the protein in supra-molecular (FG) water suffices to reproduce the intra-protein hydrogen bonding in a fully (FG) atomic water

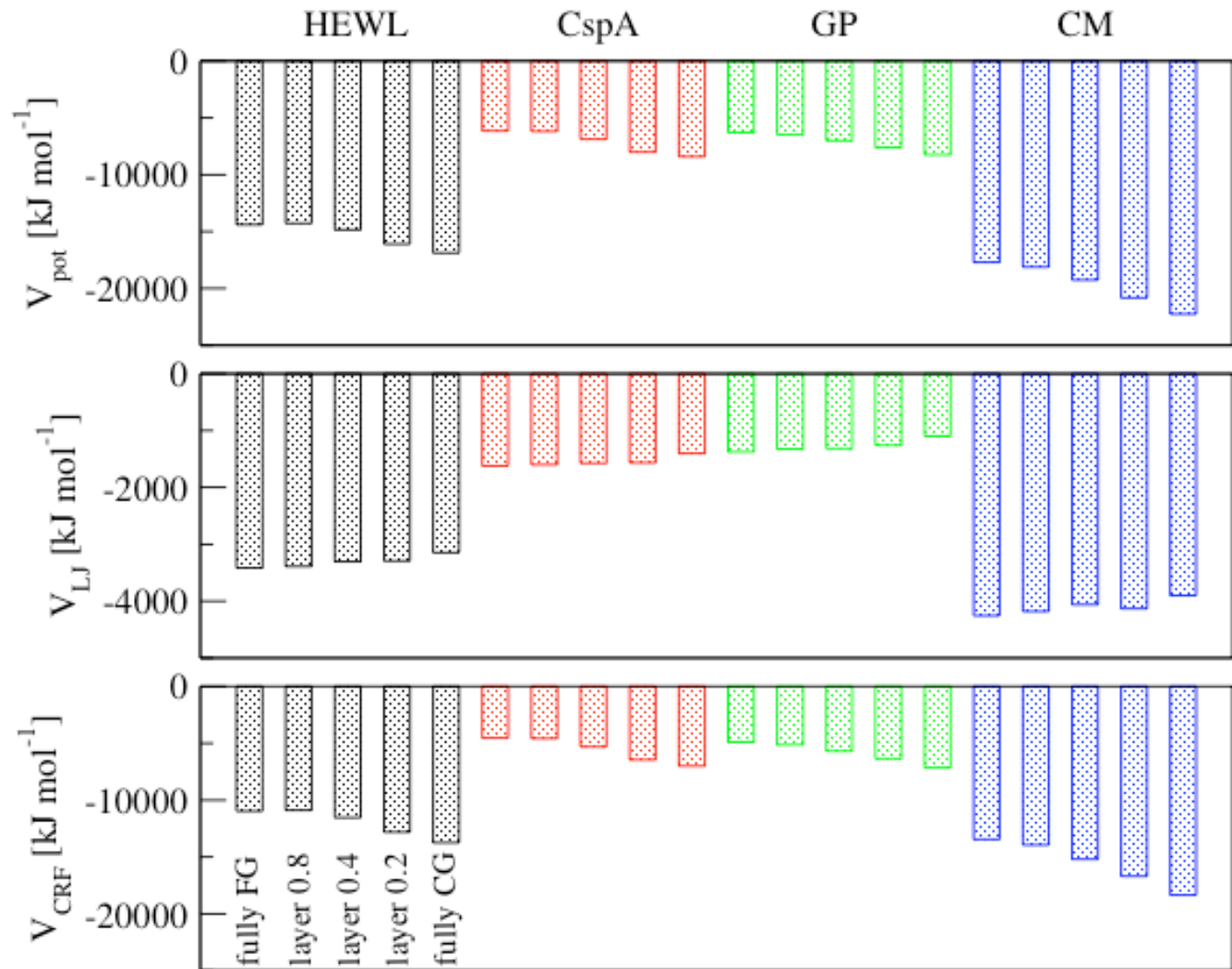
# Multi-resolution simulation of four atomic-level (FG) proteins in supra-molecular (CG) water

## Intra-protein energy:

Total potential energy  
 $V_{pot}$  (upper panel)

Van der Waals energy  
 $V_{LJ}$  (middle panel)

Electrostatic energy  
 $V_{CRF}$  (lower panel)



## Five solvent models:

1. Fully atomic (FG)
2. Atomic layer 0.8 nm
3. Atomic layer 0.4 nm
4. Atomic layer 0.2 nm
5. Fully supra-molecular (CG)

An 0.8 nm atomic (FG) solvent layer around the protein in supra-molecular (CG) water suffices to reproduce the intra-protein van der Waals and electrostatic energies in fully (FG) atomic water

# Conclusions

## Simulation of an atomic-level (FG) protein in supra-molecular (CG) water:

- Secondary structure is stable
- Intra-protein energetics:
  - protein slightly more stable than in fully atomic (FG) water
  - slightly more electrostatic and less van der Waals stabilisation
- Hydrogen bonding:
  - backbone-backbone H-bonding as in fully atomic (FG) water
  - **much increased backbone – side-chain and side-chain – side-chain hydrogen bonding**
- Simulation is **factor 30 faster** than in fully atomic (FG) water

## Simulation of an atomic-level (FG) protein in supra-molecular (CG) water *with a 0.8 nm layer of atomic-level (FG) water around the protein:*

- Secondary structure is stable
- Intra-protein energetics as in fully atomic (FG) water
- Hydrogen bonding as in fully atomic (FG) water
- Simulation is **factor 10 faster** than in fully atomic (FG) water

# Ala deca-peptide in water: Differential stability of helices

Influence of solute **force field** and **solvent** model:

SPC = atomic model, CG = supra-molecular coarse-grained model

<b>GROMOS force field</b>	<b>Solvent</b>	$\Delta G_{\pi\alpha} = G_{\pi} - G_{\alpha}$	$\Delta G_{310\alpha} = G_{310} - G_{\alpha}$ (kJ/mol)
45A3	SPC	5.0±0.5	46.7±1.3
53A6 <sub>OXY+N</sub>	SPC	0.8±1.1	38.5±1.0
54A7	SPC	14.3±1.1	36.7±1.2
53A6	<b>SPC</b>	5.0±0.8	47.1±2.5
53A6	<b>CG</b>	7.6±0.7	37.4±1.5
53A6	<b>SPC+CG</b>	4.8±0.7	44.4±1.8

1. Both **solute** and **solvent** model do determine the relative helical stability
2. Force fields 45A3 and 53A6 yield same values although having quite different force-field parameters
3. Force field 53A6<sub>OXY+N</sub> yields too stable  $\pi$ -helix
4. **Supra-molecular (CG) water stabilizes helices having more hydrogen bonds**
5. **Atomic solvent layer (0.8 nm) around solute redresses this effect**

# Multi-resolution simulation in biochemistry

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# Multi-resolution simulation in biochemistry

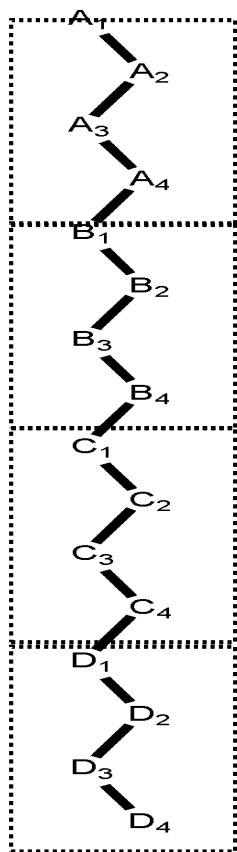
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# Development of thermodynamically calibrated fine-grained (FG) and coarse-grained (CG) models for alkane chains

**FG**

*Atomic level model*  
(no hydrogens)  
16 (CH<sub>2</sub> or CH<sub>3</sub>) atoms



Map 2, 3 or 4 FG  
united atoms on to  
one CG particle

Centre of mass

$$A_1 - A_4$$

Centre of mass

$$B_1 - B_4$$

Centre of mass

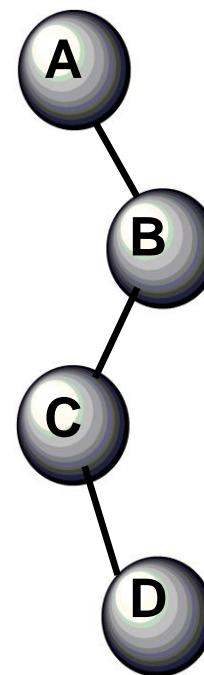
$$C_1 - C_4$$

Centre of mass

$$D_1 - D_4$$

**CG**

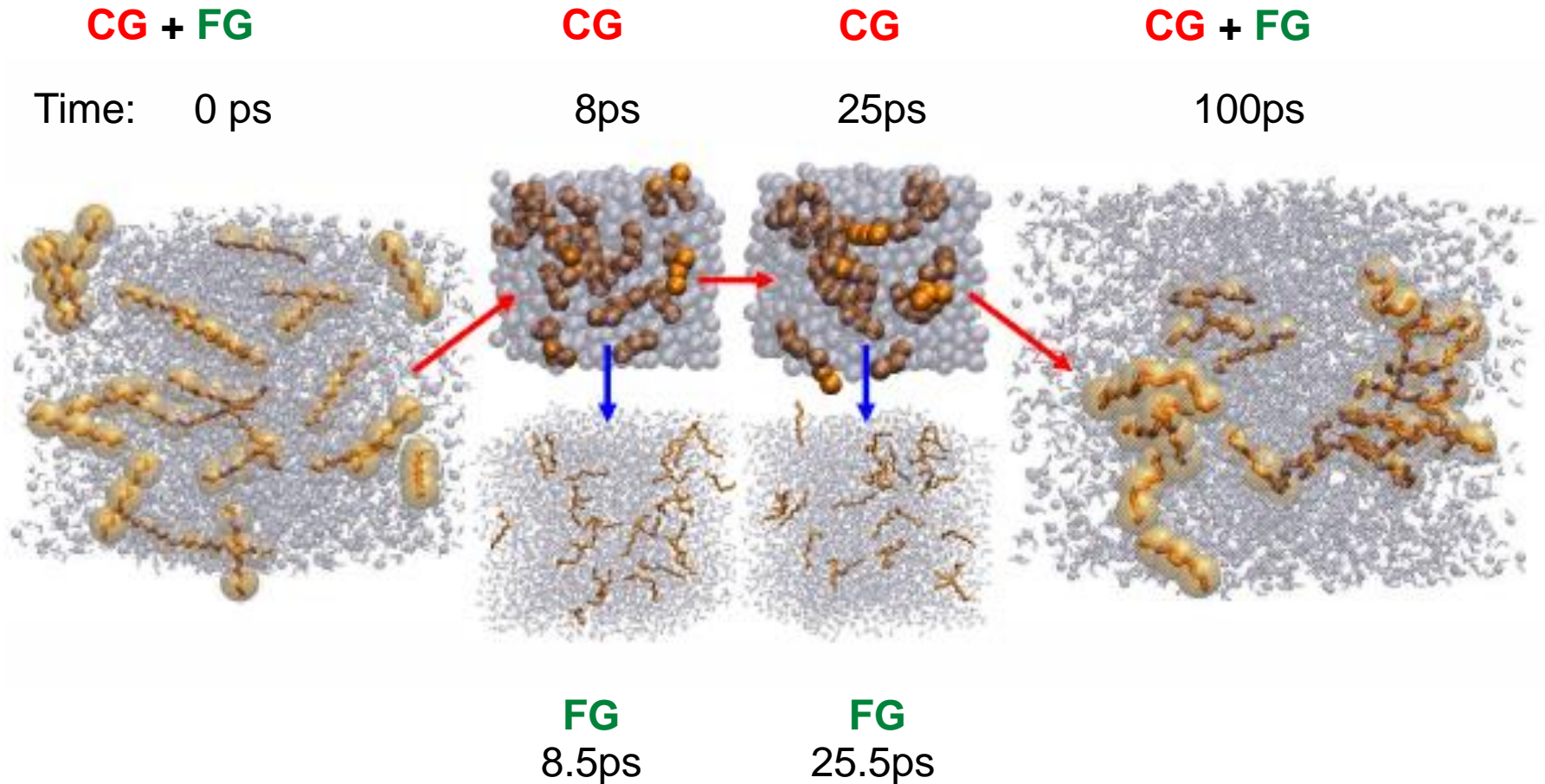
*Supra-atomic level model*  
e.g. 1 to 4 mapping  
4 particles



1. Derive CG bonded interaction parameters from structural characteristics of the mapped FG configurational ensemble
2. Calibrate CG non-bonded interaction parameters against experimental thermodynamic data for liquid alkanes

# Multi-grained simulation of 25 hexadecanes in water

*M. Christen & W.F. van Gunsteren, J. Chem. Phys., 124 (2006) 154106*



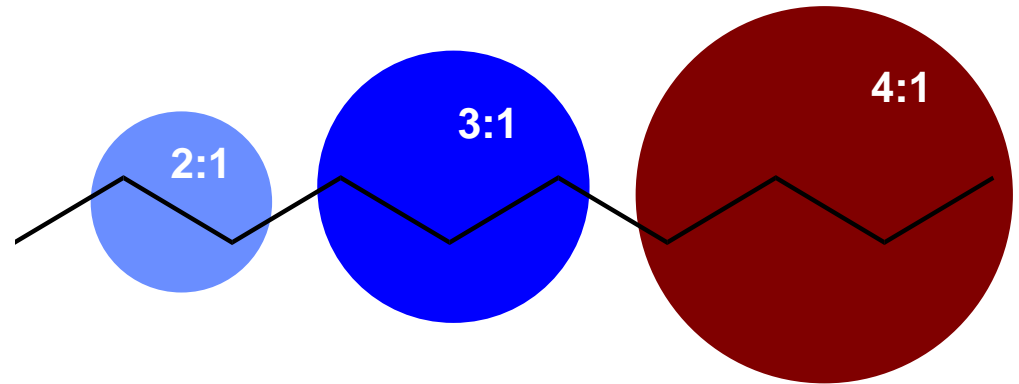
**CG level simulation with occasional switching to FG level enhances exploration of FG conformational space**

***Interactions at CG and FG levels should be thermodynamically consistent***

# Supra-Atomic CG Alkane Model

Why do alkanes matter ?

Lipid tails



**Model:**

- Number of CH<sub>2</sub> groups per bead: 2, 3, or 4
- Parameters derived from mapped atomistic simulations
- Fitting to thermodynamic properties
- Different bead types for terminal beads and beads in the middle
- No electrostatic interactions
- LJ parameters averaged over different chain lengths (C<sub>4</sub> – C<sub>16</sub>)
- Unconstrained bonds
- Torsional angle potential energy term present

# Derivation of **CG** bonded interaction parameters from distributions of mapped **FG** simulated configurations

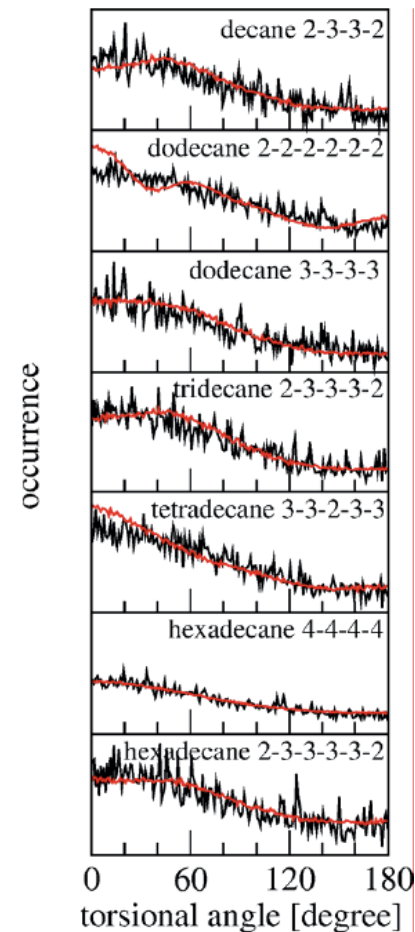
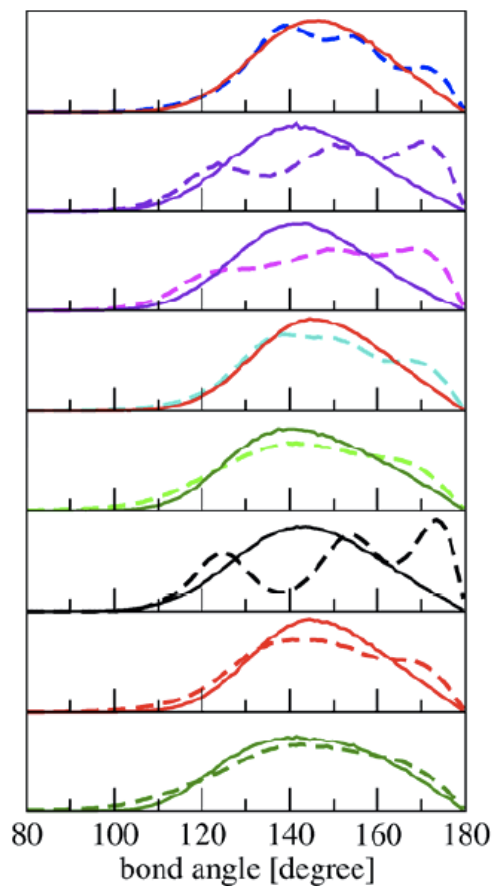
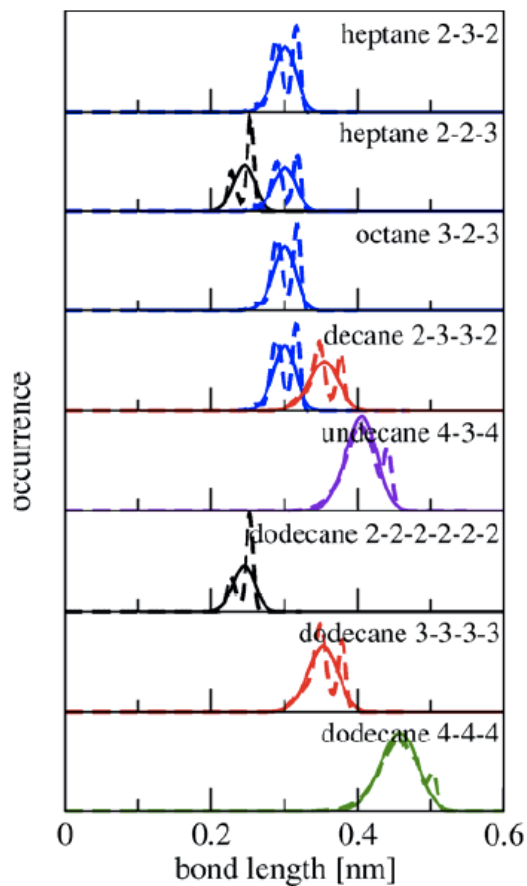
**FG: dashed lines CG: solid lines**

**FG: red lines CG: black lines**

**Bond length**

**Bond angle**

**Torsional angle**



# Comparison of *FG* simulated and *experimental* thermodynamic data for 18 liquid alkanes: density and heat of vaporisation

Table 1: Number of molecules and atoms in the FG simulations of *n*-alkanes. Density  $\rho$  and heat of vaporisation  $\Delta H_{vap}$  for liquid alkanes at 298 K and 1 bar, unless indicated otherwise. Experimental values were taken from [43].

alkane	number of		$\rho / \text{kg m}^{-3}$		$\Delta H_{vap} / \text{kJ mol}^{-1}$	
	molecules	atoms	exp.	calc.	exp.	calc.
propane	3334	10002	493.0 <sup>a</sup>	495.1	14.79	15.98
butane	2500	10000	573.0 <sup>a</sup>	577.8	21.62	21.20
pentane	2000	10000	626.2 <sup>b</sup>	621.1	26.43	26.35
hexane	1667	10002	660.6	654.7	31.55	31.71
heptane	1429	10003	679.5	678.7	36.55	36.67
octane	1250	10000	698.6	698.0	41.49	41.38
nonane	1112	10008	719.2 <sup>b</sup>	712.6	46.44	46.53
decane	1000	10000	726.6	724.5	51.37	51.56
undecane	910	10010	740.2 <sup>b</sup>	734.6	56.33	56.29
dodecane	834	10008	749.5 <sup>b</sup>	743.2	61.29	61.53
tridecane	770	10010	756.4 <sup>b</sup>	750.4	66.23	66.15
tetradecane	715	10010	759.6 <sup>b</sup>	756.4	71.17	71.60
pentadecane	667	10005	768.5 <sup>b</sup>	762.0	76.15	76.20
hexadecane	626	10016	770.1	766.8	81.09	81.16
heptadecane	589	10013	778.0 <sup>b</sup>	771.4	86.19	86.03
octadecane	556	10008	776.8	774.9	90.79	91.42
nonadecane	527	10013	785.5 <sup>b</sup>	778.6	95.81	95.68
eicosane	500	10000	788.6 <sup>b</sup>	781.8	100.83	100.87

<sup>a</sup> experimental density measured at a pressure > 1 bar

<sup>b</sup> experimental density measured at a temperature of 293 K

**Deviations: density < 1%    heat of vaporisation < 1.2 kJ/mol**

# Comparison of **CG** simulated and *experimental* thermodynamic data for 14 liquid alkanes: **density and heat of vaporisation**

<i>alkane</i>	<i>bead sizes</i>	$\rho$ [ $\text{kg m}^{-3}$ ]		$\Delta H_{\text{vap}}$ [ $\text{kJ mol}^{-1}$ ]	
		<i>exp.</i>	<i>calc.</i>	<i>exp.</i>	<i>calc.</i>
butane	2-2	573.0 <sup>a</sup>	572.2	21.62	21.64
pentane	2-3	626.2 <sup>b</sup>	623.0	26.43	26.49
hexane	2-2-2	660.6	655.5	31.55	31.87
	3-3		660.0		31.50
heptane	2-3-2	679.5	676.2	36.55	36.87
	2-2-3		683.2		36.72
octane	2-2-2-2	698.6	701.1	41.49	41.40
	4-4		698.0		41.38
	3-2-3		703.0		41.60
nonane	3-3-3	719.2 <sup>b</sup>	719.0	46.44	46.45
decane	2-2-2-2-2	726.6	730.0	51.37	51.76
	2-3-3-2		725.5		51.80
	4-3-4	740.2 <sup>b</sup>	736.3	56.33	56.26
dodecane	2-2-2-2-2-2	749.5 <sup>b</sup>	749.6	61.29	61.08
	3-3-3-3		750.1		61.49
	4-4-4		747.9		61.32
tridecane	2-3-3-3-2	756.4 <sup>b</sup>	752.7	66.23	66.67
tetradecane	2-2-2-2-2-2-2	759.6 <sup>b</sup>	763.5	71.17	70.85
	3-3-2-3-3		762.1		70.90
	3-3-3-3-3	768.5 <sup>b</sup>	768.0	76.15	75.82
hexadecane	2-2-2-2-2-2-2-2	770.1	773.3	81.09	80.22
	4-4-4-4		772.5		80.80
	2-3-3-3-3-2		768.5		80.79
heptadecane	3-3-3-2-3-3	778.0 <sup>b</sup>	774.5	86.19	84.94

<sup>a</sup> experimental density measured at a pressure > 1 atm

<sup>b</sup> experimental density measured at a temperature of 293 K

**Deviations: density < 1%    heat of vaporisation < 1 kJ/mol**

# Comparison of **CG** simulated and *experimental* thermodynamic data for 14 liquid alkanes: hydration free enthalpy and excess free energy

<i>alkane</i>	<i>bead sizes</i>	$\Delta G_{hyd} (kJ mol^{-1})$		$\Delta F_{exc} (kJ mol^{-1})$	
		<i>exp.</i>	<i>calc.</i>	<i>exp.</i>	<i>calc.</i>
butane	2-2	8.98	9.09	-	10.09
pentane	2-3	9.74	9.56	14.23	13.27
hexane	2-2-2	10.49	10.80	16.96	16.01
	3-3		10.39		16.48
heptane	2-3-2	11.25	10.53	19.64	19.01
	2-2-3		11.45		19.21
octane	2-2-2-2	12.01	13.47	22.29	22.14
	4-4		11.49		23.27
	3-2-3		12.66		22.31
nonane	3-3-3	12.76	12.58	25.02	25.62
decane	2-2-2-2-2	13.52	15.70	27.74	28.26
	2-3-3-2		13.33		28.32
	4-3-4	14.27	14.58	30.54	32.40
dodecane	2-2-2-2-2-2	15.03	18.55	33.32	34.36
	3-3-3-3		14.79		34.87
	4-4-4		15.31		35.77
tridecane	2-3-3-3-2	15.79	15.60	36.30	37.54
tetradecane	2-2-2-2-2-2-2	16.54	21.37	39.23	40.34
	3-3-2-3-3		17.94		40.72
pentadecane	3-3-3-3-3	17.30	17.83	42.27	44.00
hexadecane	2-2-2-2-2-2-2-2	18.05	24.10	45.51	46.36
	4-4-4-4		18.95		48.15
	2-3-3-3-3-2		18.64		46.54
heptadecane	3-3-3-2-3-3	18.81	19.57	-	49.59

Deviations (excluding *pure* bead sizes 2 and 4):  $\Delta G_{hydr} < 1$  kJ/mol  $\Delta F_{exc} < 1$  kJ/mol

# Comparison of **CG** simulated and *experimental* thermodynamic and dynamic data for 14 liquid alkanes: surface tension $\gamma$ , viscosity $\eta$ and diffusion $D$

alkane	bead sizes	$\gamma$ ( $\text{mN m}^{-1}$ )		$\eta$ (cp)		$D$ ( $10^{-5} \text{ cm}^2 \text{ s}^{-1}$ )	
		exp.	calc.	exp.	calc.	exp.	calc.
butane	2-2	12.4 <sup>a</sup>	14.4	0.20 <sup>b</sup>	0.14	-	7.93
pentane	2-3	15.5	18.3	0.22	0.19	5.16 <sup>a</sup>	5.34
hexane	2-2-2	17.9	21.7	0.30	0.23	4.21	4.73
	3-3		25.5		0.25		3.76
heptane	2-3-2	19.7	25.2	0.39	0.26	3.12	3.89
	2-2-3		25.5		0.31		3.49
octane	2-2-2-2	21.1	24.3	0.51	0.25	2.00	3.43
	4-4		31.6		0.43		1.95
	3-2-3		24.9		0.33		2.55
nonane	3-3-3	22.4	24.3	0.66	0.41	1.70	1.99
decane	2-2-2-2-2	23.4	26.2	0.84	0.42	1.31	2.49
	2-3-3-2		29.0		0.34		2.17
undecane	4-3-4	24.2	25.8	1.10	0.50	0.98	1.08
dodecane	2-2-2-2-2-2	25.3 <sup>a</sup>	25.8	1.38	0.35	0.81	1.97
	3-3-3-3		32.6		0.48		1.32
	4-4-4		30.4		0.80		0.85
tridecane	2-3-3-3-2	25.6	26.2	1.72	0.43	0.61	1.42
tetradecane	2-2-2-2-2-2-2	26.1	28.8	2.13	0.38	0.52	1.60
	3-3-2-3-3		29.4		0.48		1.08
pentadecane	3-3-3-3-3	27.1 <sup>a</sup>	30.8	2.53	0.59	0.40	0.88
hexadecane	2-2-2-2-2-2-2-2	27.0	25.2	3.03	0.37	0.38	1.44
	4-4-4-4		33.0		0.82		0.45
	2-3-3-3-3-2		25.8		0.47		1.04
heptadecane	3-3-3-2-3-3	27.9 <sup>a</sup>	32.4	3.29 <sup>c</sup>	0.51	0.36	0.83

$\gamma$  generally bit too large     $\eta$  too low and  $D$  too large



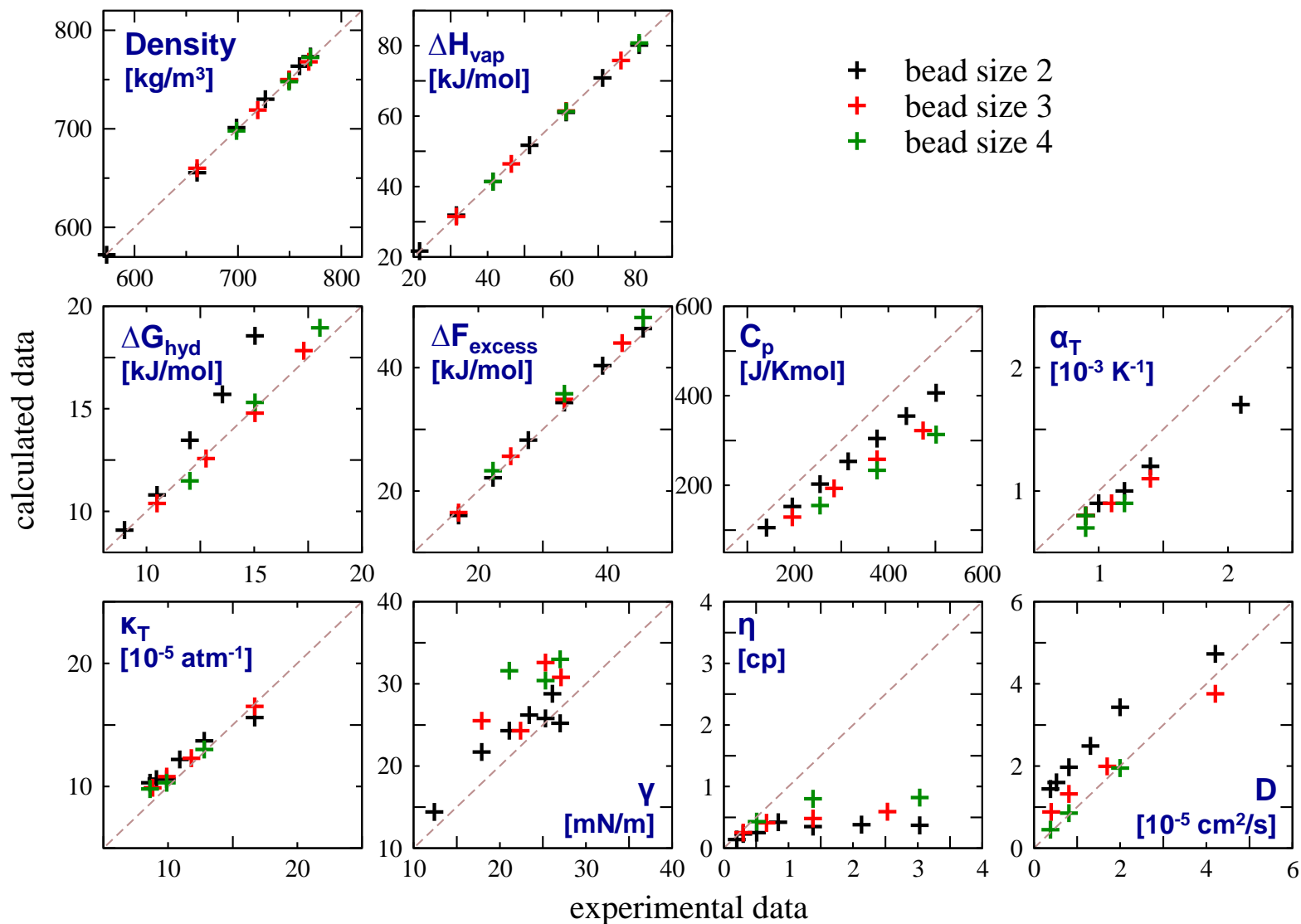
# Comparison of **CG** simulated and *experimental* secondary thermodynamic data for 14 liquid alkanes: heat capacity $C_p$ , thermal expansion $\alpha_T$ and compressibility $\kappa_T$

<i>alkane</i>	<i>bead sizes</i>	$C_p$ ( $J K^{-1} mol^{-1}$ )		$\alpha_T$ ( $10^{-3} K^{-1}$ )		$\kappa_T$ ( $10^{-5} atm^{-1}$ )	
		<i>exp.</i>	<i>calc.</i>	<i>exp.</i>	<i>calc.</i>	<i>exp.</i>	<i>calc.</i>
butane	2-2	140.9	105.4	2.1 <sup>a</sup>	1.7	-	27.3
pentane	2-3	167.2	116.3	1.6	1.3	21.8	19.1
hexane	2-2-2	195.6	152.6	1.4	1.2	16.7	15.6
	3-3		128.8		1.1		16.5
heptane	2-3-2	224.7	166.8	1.3	1.1	14.4	14.2
	2-2-3		165.3		1.0		15.2
octane	2-2-2-2	254.6	202.6	1.2	1.0	12.8	13.7
	4-4		154.8		0.9		13.0
	3-2-3		178.6		0.9		14.0
nonane	3-3-3	284.4	193.3	1.1	0.9	11.8	12.3
decane	2-2-2-2-2	314.4	253.5	1.0	0.9	10.9	12.2
	2-3-3-2		230.9		0.9		11.5
undecane	4-3-4	344.9	219.7	1.0	0.8	10.3	10.4
dodecane	2-2-2-2-2-2	375.8	304.4	0.9	0.8	9.9	10.6
	3-3-3-3		258.0		0.8		10.8
	4-4-4		233.4		0.8		10.3
tridecane	2-3-3-3-2	406.7	295.2	0.9	0.8	9.5	10.0
tetradecane	2-2-2-2-2-2-2	438.5	354.7	0.9	0.8	9.1	10.6
	3-3-2-3-3		308.2		0.8		10.4
pentadecane	3-3-3-3-3	473.7	322.3	0.9	0.8	8.8	9.9
hexadecane	2-2-2-2-2-2-2-2	501.6	406.6	0.9	0.8	8.6	10.3
	4-4-4-4		313.3		0.7		9.8
	2-3-3-3-3-2		361.5		0.8		9.8
heptadecane	3-3-3-2-3-3	534.7	374.4	0.9	0.8	8.2	9.4

heat capacity  $C_p$  too low      thermal expansion  $\alpha_T$  and compressibility  $\kappa_T$  are fine

# Supra-Atomic CG Alkane Model

## Comparison with experimental data



# Supra-Atomic CG Alkane Model

## 2:1-mapping

### Well reproduced properties

- RDF
- Surface tension
- Heat capacity

### Less well reproduced properties:

- Free energy of hydration
- Diffusion coefficient

## 4:1-mapping

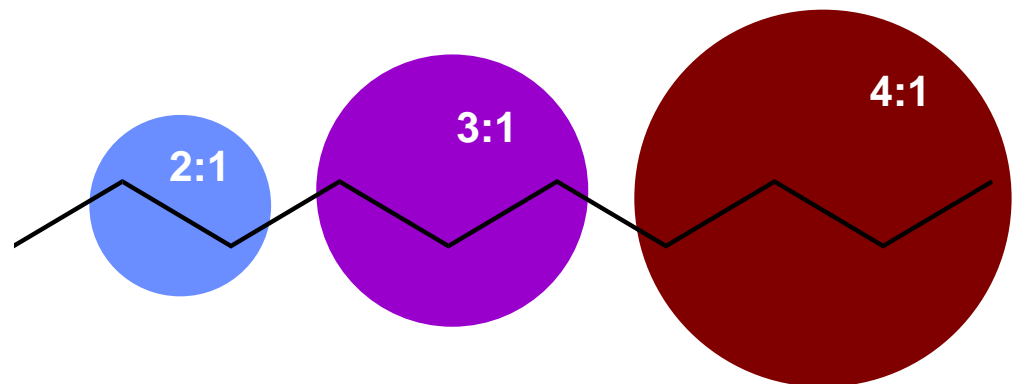
### Well reproduced properties

- Free energy of hydration
- Diffusion coefficient

### Less well reproduced properties:

- RDF → too structured!
- Surface tension
- Heat capacity

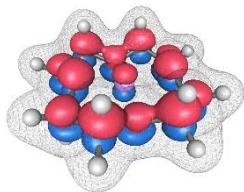
➔ **3:1-mapping is a good compromise**



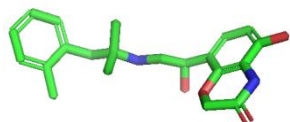
# Multi-resolution simulation in biochemistry

1. Development of a supra-molecular model for biomolecular or organic solvents:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH, DMSO,  $\text{CHCl}_3$
  - b. Mixtures of these compounds
2. Development of a multi-resolution model for biomolecular systems:
  - a. Pure compounds:  $\text{H}_2\text{O}$ , MeOH
  - b. Testing for proteins in water: HEWL, CspA, protein G, chorismate mutase (CM)
    1. structure (hydrogen bonding)
    2. stability (energetics)
  - c. Testing for peptides in methanol: three beta-peptides
    3. folding (structure, energetics, dynamics)
3. Development of a supra-molecular model for lipids:
  - a. Lipid tails: n-alkanes

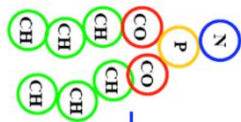
# Combining Different Levels of Resolution



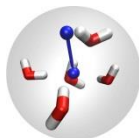
**QM description**  
Nuclei + electrons



**Atomistic description**  
Atoms = point charges



**Supra-atomic CG description**  
Multiple atoms = CG bead



**Supra-molecular CG description**  
Multiple molecules = CG bead

**QM/MM simulations**

**Hybrid  
atomistic/coarse-  
grained  
simulations**



**Goal:**

**Reduce computational effort while retaining details for region of interest**

# Coarse-graining

**Goal:** striking an *appropriate* balance between accuracy and computational cost  
while maintaining a *physically correct mechanism* of the process of interest

**Coarse-graining (CG) = reduction of degrees of freedom**

Sub-atomic (QM) → atomistic → supra-atomic → supra-molecular

## **Supra-atomic vs. supra-molecular CG models**

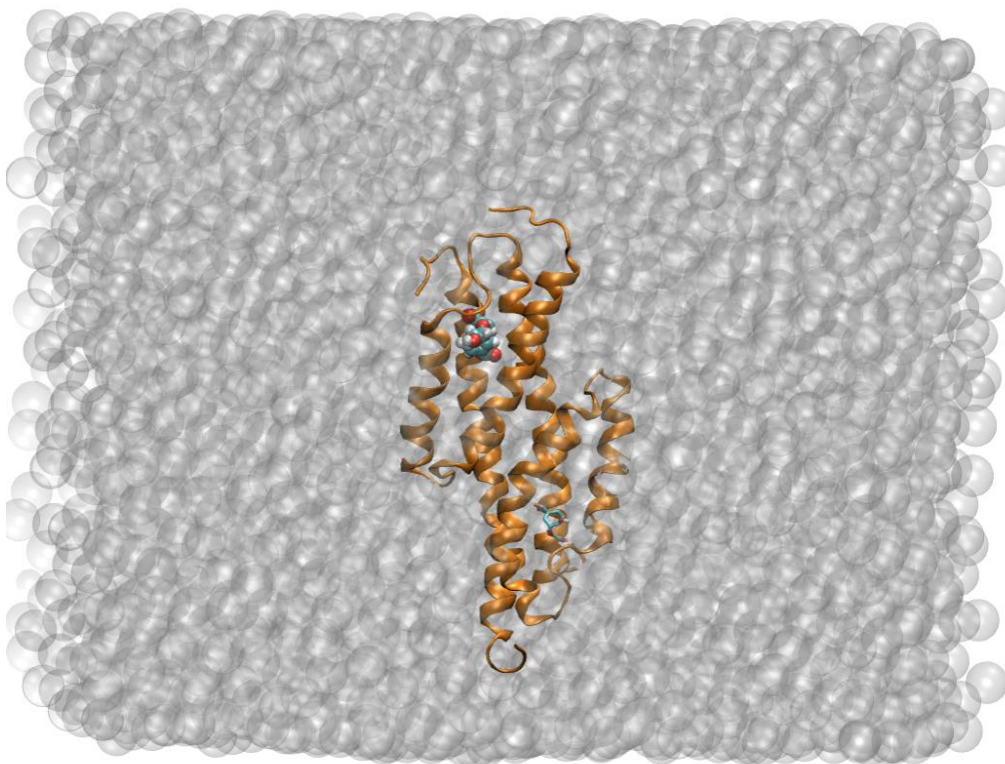
- Effect on parametrisation strategy
- Effect on properties that can be compared/reproduced (loss of information)
- Supra-molecular models:
  - Larger loss in entropy to compensated in enthalpy
  - Faster diffusion due to smoother energy surface
  - Pressure correction

## **Combining levels of resolution**

- Region of interest needs to include an atomistic solvent layer
- Fixed resolution: How to deal with boundary between atomistic and coarse-grained solvent?

# Three-resolution level system simulated (5 nsec)

- |                      |                         |                       |
|----------------------|-------------------------|-----------------------|
| a. First substrate:  | nuclei + electrons      | (QM, level II)        |
| b. Second substrate: | atomic and supra-atomic | (CM, levels III + IV) |
| c. Protein (dimer)   | atomic and supra-atomic | (CM, levels III + IV) |
| d. Solvent (water)   | supra-molecular         | (CM, level V)         |



Meier et al., *Angew. Chem. Intl. Ed.* 52 (2012) 2820-2834  
Choutko et al., *Protein Science* 22 (2013) 809-822

# Choosing a model for simulating a particular process

**I.** Determine the *important grain level(s)* with respect to the process of interest

**II.** For each important grain level:

1) Detect the *essential degrees of freedom* for the properties of interest by considering experimental data + confounding variables

2) Make corresponding *simplifications* and *approximations*:  
*simplifications*: keep essential interactions ( $\neq$  degrees of freedom)  
*approximations*: keep inaccuracies balanced (overall accuracy determined by worst approximation)

3) Decide which (experimental) data to use for *calibration*

4) Find other, independent experimental data for *testing*

not detectable

not known

accuracy too low

not available

not available

Quit  
modelling  
or  
produce  
pretty  
pictures  
without  
physical  
meaning

No test  
of model  
possible

**III.** Use multi-grained or multi-resolution simulation:

1) Switch between different grain levels in time or as function of a coupling parameter  $\lambda$

2) Combine different grain levels in space, e.g.

electronic  $\longleftrightarrow$  atomic

atomic  $\longleftrightarrow$  supra-molecular

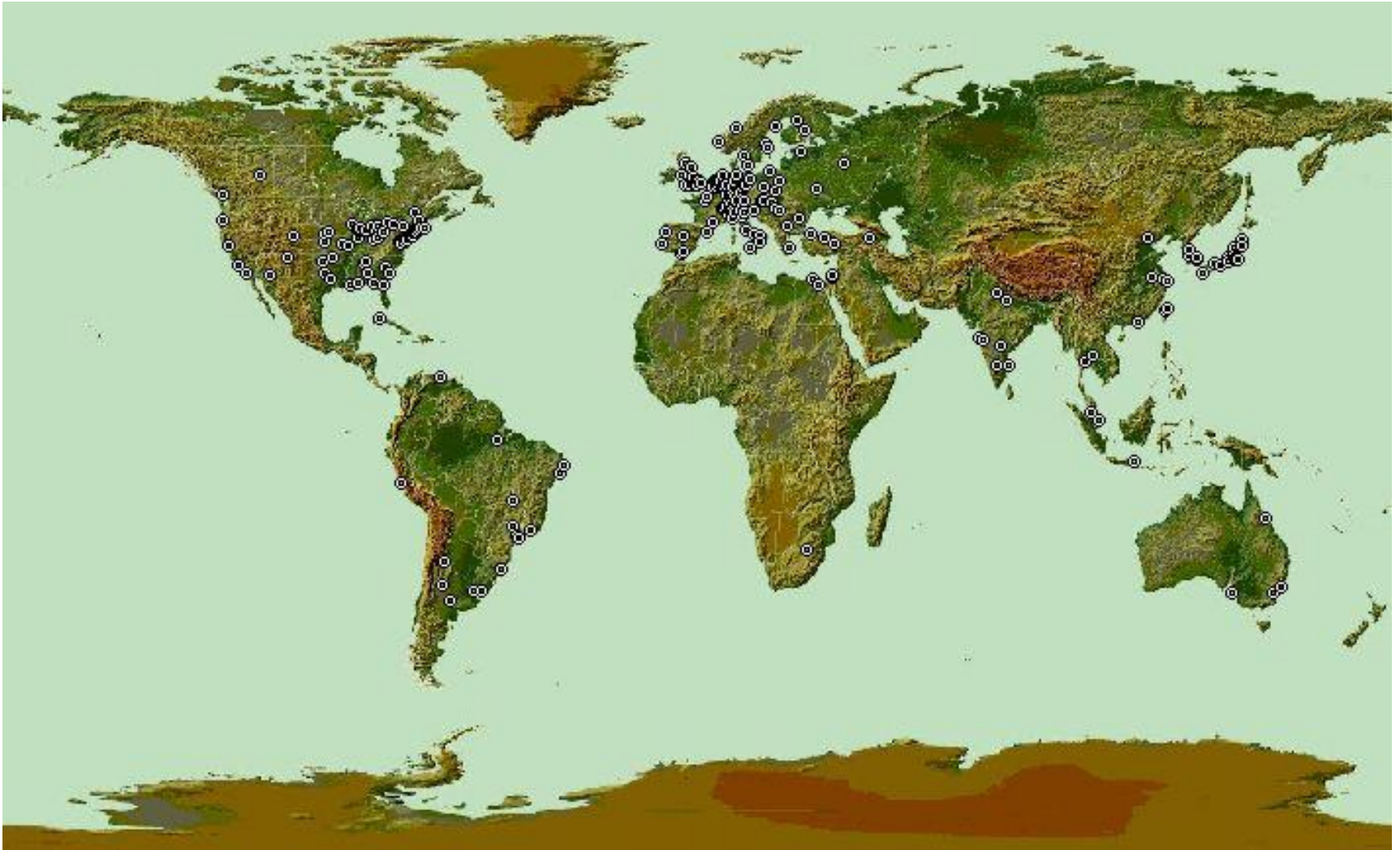
Riniker et al.  
*Phys. Chem. Chem. Phys.* 14  
(2012) 12423-12430

Meier et al.,  
*Angew. Chem. Intl. Ed.*  
52 (2013) 2-17

Different levels must be thermodynamically consistent



# Spatial distribution of licences GROMOS biomolecular simulation software



**GROMOS = Groningen Molecular Simulation + GROMOS Force Field**

Generally available: <http://www.gromos.net>