## Multi-scale models in theoretical biophysics



## Methodology: time scale

## Molecular Dynamics: MD

$$
+\sum_{i, j} 4 \varepsilon_{i, j}\left[\left(\frac{\sigma_{i, j}}{r_{i, j}} \frac{)^{12}}{\dot{j}}-\left(\frac{\sigma_{i, j}}{r_{i, j}} \frac{)^{6}}{\dot{\dot{j}}}\right]+\sum_{i, j}\left(\frac{q_{i} q_{j}}{D r_{i j}} \frac{\underline{\dot{j}}}{\dot{\dot{j}}}\right.\right.\right.
$$

Molecular Dynamics (MD):
Numerical integration of Newtons equation of motion $\mathrm{F}=\mathrm{m}^{*}$ a with timestep: $\sim 1 \mathrm{fs}$
$\rightarrow$ trajectories
$\rightarrow$ 1ps dynamics: 1000 force evaluations

$$
F_{i}=-\frac{\partial V}{\partial R_{i}}
$$

## Bacteriorhodopsin



2 Problems:

- size: 1000-100.000 atoms
- time scales: > ns



## How to study reactions and (rare) dynamical events

- direct MD
- reaction path methods
- NEB (nudged elastic band, Jonsson)
- CPR (conjugate peak refinement, Fischer, Karplus)
- dimer method (Jonsson)
- accelerated MD
- hyperdynamics (Voter)
- chemical flooding (Grubmüller)
- metadynamics (Parinello)
- replica exchange
- free energy sampling techniques
- umbrella sampling
- free energy perturbation
- transition path sampling


## "Molecular Dynamics": MD

Numerical Integration of Newtons equation of motion

$$
\mathrm{F}=\mathrm{m}^{*} \mathrm{a}
$$

start:
Calculate E and forces on atoms

$$
F_{i}=-\frac{\partial E}{\partial R_{i}}
$$



step1:
atoms are
accelerated in direction of forces
$\mathrm{a}=\mathrm{F} / \mathrm{m}$
Velocity v




Step 2:
Calculate E and forces for new structure

$$
F_{i}=-\frac{\partial E}{\partial R_{i}}
$$



## Multi-scale models in theoretical biophysics



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## How to study reactions and (rare) dynamical events

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## Reaction path methods: e.g. CPR

- CPR: Conjugate peak refinement (Fischer \& Karplus)
- NEB: nudged elastic band
- dimer method


CPR: fig. from S. Fischer

## 'Problem' of potential energy (MEP)

Different energy profiles for different protein conformations

Acylation



Figure 1. Acylation reaction mechanism of acetylcholine catalyzed by AChE.
Zhang et al JPCB 107 (2003) 44459

## 'Problem' of potential energy (MEP)

Different energy profiles for different
 prot
A) One always has to average over the different conformations of the environment :
Total energy $\rightarrow$ inner energy $E \rightarrow U$
B) Entropy is often as important as accurate total energy :
$U \rightarrow F$

Figure 1. Acylation reaction mechanism of acetylcholine catalyzed by AChE

## Problems with the PES: complex energy landscape

- differences in protein conformations
(starting the reaction path calculation)
- problems along the reaction pathway
* flipping of water molecules
* size of movable MM region
different H -bonding pattern
$\rightarrow$ average over these effects:
potential of mean force/free energy


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Fig. from H. Grubmüller

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## Calculate potential of mean force

Sample the states $A$ and $B$ in MD:
Free energy is calculated from probabilities:

$$
F_{B}-F_{A}=-k T \ln \frac{P\left(q_{B}\right)}{P\left(q_{A}\right)}
$$



When the barrier is to high, force the system to cross it with additional potentials:

Subtract these afterwords:
'Umbrella sampling'


## How to study reactions and (rare) dynamical events

- direct MD
- reaction path methods
- NEB (nudged elastic band, Jonsson)
- CPR (conjugate peak refinement, Fischer, Karplus)
- dimer method (Jonsson)
- accelerated MD
- hyperdynamics (Voter)
- chemical flooding (Grubmüller)
- metadynamics (Parinello)
- replica exchange
- free energy sampling techniques
'no entropy'
'which mode to flood?'
need reaction coordinate!
- umbrella sampling
- free energy perturbation
- transition path sampling


## How to study reactions and (rare) dynamical events

- direct MD
- reaction path methods
- NEB (nudged elastic band, Jonsson)
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- accelerated
- hyperd
- chemic
- metad

Very time consuming

- replica
- free energy sampling techniques
- umbrella sampling
- free energy perturbation
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## Gliederung

(1) Umbrella sampling

- Partition function
- Relation to the partition function

Physics, we have considered a discrete system, i.e. a quantum mechanical system with discrete energy levels. For that, we found:

$$
Z=\sum_{i} \exp \left(-\beta E_{i}\right)
$$

and the (discrete) distribution function

$$
p_{i}=\frac{1}{Z} \exp \left(-\beta E_{i}\right)
$$



On the other hand, we disussed the dynamics of molecules, where temperature allows to sample a certain part of the protein conformations.

$$
p(x, p)=\rho(x, p)=\frac{1}{Z} \exp [-E(x, p) / k T]
$$

To get the partition function $Z$, we no have to substitute the summation in the discrete case by the integral

$$
Z=\int \exp [-E(x, p) / k T] d x d p
$$



## Relation to the partition function

Consider the canonical distribution $\left(\beta^{-1}=k T\right)$ :

$$
p_{i}=\frac{1}{Z} \exp \left(-\beta E_{i}\right)
$$

The expectation value of the energy is:

$$
<E>=\frac{1}{Z} \sum_{i} E_{i} \exp \left(-\beta E_{i}\right)
$$

A nice mathematical trick is:

$$
-\frac{\partial}{\partial \beta} Z=-\sum_{i} \frac{\partial}{\partial \beta} \exp \left(-\beta E_{i}\right)=\sum_{i} E_{i} \exp \left(-\beta E_{i}\right)
$$

## Relation to the partition function

Therefore,

$$
\begin{equation*}
<E>=-\frac{1}{Z} \frac{\partial}{\partial \beta} Z=-\frac{\partial \ln Z}{\partial \beta} \tag{1}
\end{equation*}
$$

To relate the free energy to $Z$, the easiest way is to use the thermodynamic relation:

$$
F=U-T S
$$

Multiplying with $\beta$,

$$
\beta F=\beta U-S / k
$$

Taking the derivative

$$
\frac{\partial(\beta F)}{\partial \beta}=U=<E>
$$

and comparing with eq. 1 gives the expression for the free energy:

## Relation to the partition function

$$
\begin{equation*}
F=-k T \ln Z \tag{2}
\end{equation*}
$$

and for the entropy $S=-F / T-U / T$ :

$$
\begin{equation*}
S=k \ln Z+k \beta<E> \tag{3}
\end{equation*}
$$

## Relation to the partition function

This is a remarkable result, since the only thing we have to do in our simulations it to get the partition function $Z$, i.e. we have to get the phase space distribution $\rho$, i.e. the density of points in phase space from the simulation and then integrate it over phase space to get Z. Everything follows from there.

## Relation to the partition function

$$
\begin{gathered}
U=<E>=-\frac{\partial \ln Z}{\partial \beta} \\
H=U+p V \\
S=k \ln Z+k \beta U \\
F=-k T \ln Z \\
G=F+p V
\end{gathered}
$$

Therefore, the computational problem is to determine $\mathbf{Z}$.

## Umbrella sampling

Umbrella sampling is the method of choice, if we want to have the change of free energy along a certain reaction coordinate $q$ for the transition between state $A$ and $B$. The reaction coordinate can be the distance between to atoms, the position of a proton when moving between donor and acceptor or something more complicated.

## Umbrella sampling

Now, we make a coordinate transformation from $\vec{x}=\left(x_{1} \ldots x_{3 N}\right)$ to a set $\left(u_{1} \ldots u_{3 N-1}, q\right)$ : $q$ is the degree of freedom represented by the reaction coordinate, and $\vec{u}$ the remainder, that we can write:

$$
d \vec{x}=d \vec{u} d q
$$

## Umbrella sampling

When we look for the free energy for a certain value of $q$, we average over all remaining degrees of freedom, i.e. we perform and MD and sample all degrees of freedom except for $q$. An example would be the free energy for the formation of an ion pair in solution, as shown in Fig. 3. For every value of $q$, a MD is performed to calculate the free energy for that value of the reaction coordinate.


Abbildung: $\mathrm{Na}^{+}$and $\mathrm{Cl}^{-}$in water solution: the distance between the ions is the reaction coordinate q , all other degrees of freedom (water), which are represented by u are allowed to varv.

## Umbrella sampling

The free energy is given by:

$$
F=-k T \ln \iint e^{-\beta E(\vec{x}, \vec{p})} d x d p
$$

If we want to have one coordinate fixed at a certain value, e.g. $q_{0}$, it is convenient to use the delta function:

$$
\delta\left(q-q_{0}\right)
$$

With that, we can write the free energy for the fixed reaction coordinate:

## Umbrella sampling

$$
\begin{gathered}
F\left(q_{0}\right)=-k T \ln \iint \delta\left(q-q_{0}\right) e^{-\beta E(\vec{x}, \vec{p})} d \vec{p} d \vec{u} d q \\
=-k T \ln \left(Z \iint \delta\left(q-q_{0} \frac{e^{-\beta E(\vec{x}, \vec{p})}}{Z} d \vec{p} d \vec{u} d q\right)\right. \\
=-k \ln \left(Z \iint \delta\left(q-q_{0}\right) \rho(\vec{x}, \vec{p}) d \vec{p} d \vec{u} d q\right) \\
=-k \ln \left(Z<\delta\left(q-q_{0}\right)>\right) \\
=-k T \ln Z-k T \ln <\delta\left(q-q_{0}\right)>
\end{gathered}
$$

## Umbrella sampling

How can we interprete this? $\rho(\vec{x}, \vec{p})$ is the probability, that the system is at the point $(\vec{x}, \vec{p})$. Then,

$$
P\left(q_{0}\right)=\iint \delta\left(q-q_{0}\right) \rho(\vec{x}, \vec{p}) d^{`}=<\delta\left(q-q_{0}\right)>
$$

is the probability $\mathrm{P}\left(q_{0}\right)$, that the system is at the value of the reaction coordinate $q_{0}$, since the integral 'sums' over the whole phase space and the delta function 'cancels out' all points, where the reaction coordinate is NOT at $q_{0}$ ! I.e., the integration collects all points in phase space, where the reaction coordinate has this specific value!

## Umbrella sampling

In the example of the ion pair: we perform an MD for the system, and then only count, how often the reaction coordinate is found at a specific value, i.e. calculate the probability $P\left(q_{0}\right)$ to find the system at $q_{0}$.

Therefore, the difference of free energy for two states $A$ and $B$ is:

## Umbrella sampling

$$
\begin{gathered}
\left.F_{B}-F_{A}=-k T \ln Z-k T \ln <\delta\left(q-q_{B}\right)>+k T \ln Z+k T \ln <\delta\left(q-q_{A}\right)\right)> \\
=-k T \ln \frac{<\delta\left(q-q_{B}\right)>}{<\delta\left(q-q_{A}\right)>} \\
=-k T \ln \frac{P\left(q_{B}\right)}{P\left(q_{A}\right)}
\end{gathered}
$$

## Umbrella sampling

So, the task is clear: perform a MD, specify a coordinate, and then just count, how often the system is at special values of the reaction coordinate: the difference of these numbers gives the free energy difference!


Abbildung: Schematic energy profile along a reaction coordinate and the probability distribution. The barrier region is sampled poorly.

## Umbrella sampling

This is nice, but we also know the problem: If we have to cross a high barrier along the reaction coordinate to come from $A$ to $B$, a pure MD will never do it. Therefore, we have to drive the system 'somehow': This can be done, by applying an additional potential V !

Lets try something:

## Umbrella sampling

$$
\begin{gathered}
F\left(q_{0}\right)=-k T \ln \left(\frac{\iint \delta\left(q-q_{0}\right) e^{-\beta E} d^{`}}{\iint e^{-\beta E} d^{`}}\right) \\
=-k \operatorname{Tln}\left(\frac{\iint \delta\left(q-q_{0}\right) e^{\beta V} e^{-\beta(E+V)} d^{\prime}}{\iint e^{-\beta(E+V)} d^{`}} \frac{\iint e^{-\beta(E+V)} d^{`}}{\iint e^{-\beta(E) d^{`}}}\right) \\
=-k \operatorname{Tln}\left(<\delta\left(q-q_{0}\right) e^{\beta V}>_{E+V} \frac{\iint e^{-\beta(E+V)} d^{`}}{\iint e^{\beta(V)} e^{-\beta(E+V) d^{`}}}\right) \\
=-k T \ln \left(<\delta\left(q-q_{0}\right) e^{\beta V}>_{E+V} \frac{1}{<e^{\beta V}>_{E+V}}\right) \\
=-k T \ln \left(e^{\beta V\left(q_{0}\right)}<\delta\left(q-q_{0}\right)>_{E+V} \frac{1}{<e^{\beta V}>_{E+V}}\right) \\
=-k T \ln <\delta\left(q-q_{0}\right)>_{E+V}-V\left(q_{0}\right)+k T \ln <e^{\beta V}>_{E+V} \\
=-k T \ln P^{*}\left(q_{0}\right)-V\left(q_{0}\right)+k T \ln <e^{\beta V}>_{E+V} \\
=-
\end{gathered}
$$

## Umbrella sampling

The last equation has the form:

$$
\begin{equation*}
F(q)=-k T \ln P^{*}(q)-V(q)+K \tag{4}
\end{equation*}
$$

This result is very interesting: we have added an arbitrary potential V to our system: Now we have to calculate the averages using the ensembles with the energy $\mathrm{E}+\mathrm{V}$, that is indicated by $<>_{E+V}$. Now, we get the probability $P^{*}\left(\overrightarrow{q_{0}}\right)$ to find the system at the value of the reaction coordinate for the ensemble $\mathrm{E}+\mathrm{V}$, which can be very different from that of the ensemble $E, P\left(\overrightarrow{q_{0}}\right)$ !
But we still get the right free energy $F\left(\overrightarrow{q_{0}}\right)$, if we use the probability $P^{*}\left(\overrightarrow{q_{0}}\right)$ and subtract the potential $V\left(\overrightarrow{q_{0}}\right)$ at the value of the reaction coordinate and the red term K .

## Umbrella sampling

We can use this scheme efficiently, when we move harmonic potentials along the reaction coordinate as shown in Fig. 5.


Abbildung: Additional harmonic potentials to keep the system in the region of the desired value of the reaction coordinate

## Umbrella sampling



Abbildung: Offset in free energy between two simulations $k$ and $(k+1)$. The offset is given by $\mathrm{K}_{k}-\mathrm{K}_{k+1}$

## Umbrella sampling



Abbildung: Matching of histograms from different simulations

## 'Multi-scale’ methods



- periodic boundary conditions
- Ewald summation


## 'Multi-scale’ methods



- periodic boundary conditions
- Ewald summation

Problems:

- large proteins
- setup (membrane) tedious
- solvent relaxation time


## Multi-scale models in theoretical biophysics



## Coarse Graining (CG)



## Coarse Graining (CG)



## Coarse Graining (CG)



## Coarse Graining (CG)



Figure 1. Coarse-grained representation of all amino acids. Different colors represent different particle types.

Martini force field, Monticelli et al. JCTC 4 (2008) 819

## Multi-scale models in theoretical biophysics



## Continuum electrostatics

Describe the solvent around a molecule by an effective dielectric

- quantum chemistry: continuum solvation models solvent changes molecules properties
- biophysics: get electrostatic properies of proteins/DNA


## Continuum electrostatics



The solvation energy contains three terms:

$$
\Delta G_{\text {solv }}=\Delta G_{c a v}+\Delta G_{V d W}+\Delta G_{e l e}
$$

This contribution changes all properties, like energies, forces (i.e. geometry), vib. frequencies ...

## Continuum electrostatics

$$
\Delta G_{\text {solv }}=\Delta G_{\text {cav }}+\Delta G_{V d W}+\Delta G_{\text {ele }}
$$


formation of cavity and VdW interactions of solute with solvent
$\Delta G_{c a v}+\Delta G_{V d W}=\sum_{i} c_{i} S_{i}$
modeled as sum over surface areas $\mathrm{S}_{\mathrm{i}}$ of atoms

## Continuum electrostatics



$$
\begin{aligned}
& \Delta G_{\text {solv }}=\Delta G_{\text {cav }}+\Delta G_{V d W}+\Delta G_{\text {ele }} \\
& E_{\text {ele }}=q \phi(\vec{r})
\end{aligned}
$$

Interaction of molecular charges with electrostatic potential $\Phi(r)$
$\Delta E_{\text {ele }}=q \phi_{\text {solv }}(\vec{r})-q \phi_{\text {vac }}(\vec{r})$

$$
\phi_{r f}(\vec{r})=\phi_{\text {solv }}(\vec{r})-\phi_{v a c}(\vec{r})
$$

$\Delta E_{\text {ele }}=q \phi_{r f}(\vec{r})$

## Continuum electrostatics



$$
\Delta G_{\text {solv }}=\Delta G_{\text {cav }}+\Delta G_{V d W}+\Delta G_{\text {ele }}
$$

Energy of charge q:

$$
\Delta E_{\text {ele }}=q \phi_{r f}(\vec{r})
$$

Move to free energy surface by 'sampling' over possible solvent contributions (entropy) and by including the pV term.

## Continuum electrostatics



$$
\Delta G_{\text {solv }}=\Delta G_{c a v}+\Delta G_{V d W}+\Delta G_{\text {ele }}
$$

Energy of charge q:

$$
\Delta E_{\text {ele }}=q \phi_{r f}(\vec{r})
$$

Move to free energy surface by 'sampling' over possible solvent contributions (entropy) and by including the pV term.

This can be effectively done during parametrization of the model

Free enthalpy:

$$
\Delta G_{e l e}=q \phi_{r f}(\vec{r})
$$

Calculate reaction field

## Continuum electrostatics



Free enthalpy:

$$
\Delta G_{e l e}=q \phi_{r f}(\vec{r})
$$

Calculate reaction field

## Continuum electrostatics: Generalized Born



Born model (1920)

$$
\Delta G_{\text {ele }}=-\frac{q^{2}}{2 a}\left(1-\frac{1}{\epsilon}\right)
$$

## Continuum electrostatics: Generalized Born



Born model (1920)

$$
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$$



Feig, Brooks, Current Opinion in Structural Biology 2004, 14:217-224

## Continuum electrostatics: Generalized Born



Born model (1920)

$$
\Delta G_{e l e}=-\frac{q^{2}}{2 a}\left(1-\frac{1}{\epsilon}\right)
$$

## Generalized Born:

find empirical formular, which determines the Born radius of atom i inside the protein


## Continuum electrostatics: Generalized Born



Born model (1920)

$$
\Delta G_{e l e}=-\frac{q^{2}}{2 a}\left(1-\frac{1}{\epsilon}\right)
$$

## Generalized Born:

find empirical formular, which determines the Born radius of atom i inside the protein

$$
\Delta G_{e l e}^{1}=-\left(1-\frac{1}{\epsilon}\right) \sum_{i} \frac{q_{i}^{2}}{2 a_{i}}
$$



Feig, Brooks, Current Opinion in Structural Biology 2004, 14:217-224

## Continuum electrostatics: Generalized Born



Born model (1920)

$$
\Delta G_{e l e}=-\frac{q^{2}}{2 a}\left(1-\frac{1}{\epsilon}\right)
$$

## Generalized Born:

find empirical formular, which determines the Born radius of atom i inside the protein

$$
\Delta G_{e l e}^{1}=-\left(1-\frac{1}{\epsilon}\right) \sum_{i} \frac{q_{i}^{2}}{2 a_{i}}+\text { interaction } \mathrm{q}_{\mathrm{i}} \mathrm{j}
$$



Feig, Brooks, Current Opinion in Structural Biology 2004, 14:217-224

## Continuum electrostatics: Poisson-Boltzmann

Poisson Boltzmann: solve Poisson eq. e.g. on a grid ...

$$
\nabla \epsilon \nabla \phi=-4 \pi \rho
$$


... with and without continuum around the molecule: get reaction field

$$
\phi_{r f}(\vec{r})=\phi_{\text {solv }}(\vec{r})-\phi_{v a c}(\vec{r})
$$

Then put ions with (bulk) concentration $n_{i}{ }^{0}$ and charge $q_{i}$ according to Boltzmann distribution:

$$
n_{i}(r)=n_{i}^{0} e^{-q_{i} \phi(r) / k T}
$$

Note: the PMF $\mathbf{W}(\mathbf{r})$ has been approximated by $q_{i} \phi(r)$

## Continuum electrostatics: Poisson-Boltzmann

For a 1:1 electrolyte, this leads to:

$$
\nabla \epsilon \nabla \phi=-4 \pi \rho+\sum_{i} q_{i} n_{i}^{0} \sinh \left[q_{i} \phi(r) / k T\right],
$$

Can be linearized when $q_{i} \phi(r)$ small compared to kT
compute reaction field from linearized PB equation

$$
\nabla \cdot[\epsilon(\mathbf{r}) \nabla \phi(\mathbf{r})]-\bar{\kappa}^{2}(\mathbf{r}) \phi(\mathbf{r})=-4 \pi \rho(\mathbf{r})
$$

Solvation free energy for set of point charges $q_{i}$ :

$$
\Delta G_{e l e c}=\frac{1}{2} \sum_{i} q_{i} \phi_{r f}
$$

## Poisson Boltzmann (PB) vs. Generalized Born (GB)



GB very cheap

- could do folding in principle
- however less accurate
- PB used to calibrate GB


## First approximations:

- solvation $\rightarrow$ charge scaling
- freezing vs. stochastic boundary
- size of movable MM?
- size of QM?



## Charge scaling: T. Chem. Acc. 109 (2003) 118

$$
q_{i}^{\prime}=\frac{\bar{\Phi}_{\mathrm{s}}(i \rightarrow \mathrm{QM})}{\bar{\Phi}_{\mathrm{v}}(i \rightarrow \mathrm{QM})} q_{i}=\frac{q_{i}}{\alpha_{i}} .
$$

compute ESP of residue i at the QM region using PB with (s) and without (v) solvent


Fig. 3. Histogram of the scale factors for uracil-DNA glycosylase

## Charge scaling: T. Chem. Acc. 109 (2003) 118




Fig. 4. Reaction profile obtained with Mulliken charges representing the QM atoms. Total (bold solid line), step I (thin solid line), step IIa (long dashed line), and step III (short dashed line) energies. The total energies obtained for the extrema by using method IIb instead of IIa (Sect. II) are indicated by circles
energies are wrong, since compute with 'wrong charges correction of QM/MM energies:

II - First, the interaction with the full MM charges has to be restored:

$$
\delta W_{Q M / M M}\left(\alpha_{i} \rightarrow 1\right)=\sum_{i j}\left(1-\alpha_{i}\right) q_{j} \Phi_{v}(i \rightarrow Q M)
$$

III - Second, the solvation energy of the QM/MM system is computed from PB. Here, QM charges can be obtained from Mulliken population analysis or from ESP type charges.

## Charge scaling: T. Chem. Acc. 109 (2003) 118



Fig. 4. Reaction profile obtained with Mulliken charges representing the QM atoms. Total (bold solid line), step I (thin solid line), step Ha (lone doshed line) and sten U (short dached line) enerories The

## without CS: <br> profiles I+II: completely wrong

$$
\delta W_{Q M / M M}\left(\alpha_{i} \rightarrow 1\right)=\sum_{i j}\left(1-\alpha_{i}\right) q_{j} \Phi_{v}(i \rightarrow Q M)
$$

III - Second, the solvation energy of the QM/MM system is computed from PB. Here, QM charges can be obtained from Mulliken population analysis or from ESP type charges.

## Generalized solvent boundary potential (GSBP)



PB very expensive, even for MM: can not be done extensively along MD simulations
outer region: fixed
inner
region

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Generalized solvent boundary potential (GSBP by B. Roux)

- fix an outer region
- calculate reaction field and solvation free energy using a basis set for the inner region


## Generalized solvent boundary potential (GSBP)



PB very expensive, even for MM: can not be done extensively along MD simulations
outer region: fixed
inner region

Generalized solvent boundary potential (GSBP by B. Roux)

- fix an outer region
- calculate reaction field and solvation free energy using a basis set for the inner region
$\rightarrow$ Very good for problems, where one can neglect the motion of the outer part, i.e. 'outer' atoms can be represented by average coordinates


## Generalized solvent boundary potential (GSBP)

outer region: fixed

```
(Xm, r__..rn)
    inner
    region
(rn+1...rN).
```

Beglov, Im, Roux (JCP 100, 9050, JCP 114, 2924)

Idea: 'Construct boundary potential, which relates the statistical properties of the infinite system to that of the finite (inner) system'

Potential of mean force (PMF) of inner system (frozen)
$W\left(X_{m}, r_{1} \ldots r_{n}\right)$ by integration over 'outer' degrees of freedom ( $\left.r_{n+1} \ldots r_{n}\right)$.

$$
e^{-\beta W\left(X_{m}, r_{1} \ldots r_{n}\right)}=C \int d r_{n+1} \ldots d r_{N} e^{-\beta U\left(X_{m}, r_{1} \ldots r_{n}, \ldots r_{N}\right)}
$$

## Generalized solvent boundary potential (GSBP)



Potential of mean force (PMF) of inner system (frozen)
$W\left(X_{m}, r_{1} \ldots r_{n}\right)$ by integration over 'outer' degrees of freedom.

Uii potential energy of inner system
$\mathbf{W}$ - $\mathbf{U}_{\mathrm{ii}} \quad$ can be identified with solvation free energy of
solute +n solvent degrees of freedom, frozen at coordinates ( $X_{m}, r_{1} \ldots r_{n}$ )

$$
\begin{gathered}
\rho(x)=\rho^{(i)}(x)+\rho^{(o)}(x) \\
\Delta \mathrm{W}=\mathrm{W}-\mathrm{U}=\left(\mathrm{W}_{\mathrm{ii}}+\mathrm{W}_{\mathrm{io}}+\mathrm{W}_{\circ 0}\right)-\left(\mathrm{U}_{\mathrm{ii}}+\mathrm{U}_{\mathrm{io}}+\mathrm{U}_{\circ \circ}\right)
\end{gathered}
$$

## Generalized solvent boundary potential (GSBP)

outer region: fixed
inner region
$\Delta W$ is the free energy needed to assemble the inner system for a chosen conformation in the presence of the environment:

$$
\Delta \mathrm{W}=\Delta \mathrm{W} \mathrm{cr}+\Delta \mathrm{WvaW}+\Delta \mathrm{Welec}
$$

$\Delta \mathrm{Wcr}$ insert (e.g. fixed) sphere, configurational constriction
$\Delta W$ vaw contains VdW interactions between inner and outer region

$$
\Delta W_{\text {elec }}(\mathbf{X})=\Delta W_{\text {elec }}{ }^{(o o)}(\mathbf{X})+\Delta W_{\text {elec }}{ }^{(i o)}(\mathbf{X})+\Delta W_{\text {elec }}{ }^{(i i)}(\mathbf{X})
$$

## Solvation free energy for the macromolecule

$$
\Delta W_{\text {elec }}(\mathbf{X})=\Delta W_{\text {elec }}{ }^{(o o)}(\mathbf{X})+\Delta W_{\text {elec }}{ }^{(i o)}(\mathbf{X})+\Delta W_{\text {elec }}{ }^{(i i)}(\mathbf{X})
$$

## 25-50 A

Various components using a basis set expansion:

$$
\Delta W_{\text {elec }}^{(i o)}=\sum_{\alpha \in \text { inner }} q_{\alpha} \phi_{r f}^{(o)}\left(\mathbf{r}_{\alpha}\right)
$$

$$
\Delta W_{\text {elec }}{ }^{(i o)}(\mathbf{X})+U_{\text {elec }}^{(i o)}(\mathbf{X})=\sum_{\alpha \in \text { inner }} q_{\alpha} \phi_{s}^{(o)}\left(\mathbf{r}_{\alpha}\right)
$$

1) compute reaction field from linearized PB equation before MD

$$
\nabla \cdot[\epsilon(\mathbf{r}) \nabla \phi(\mathbf{r})]-\bar{\kappa}^{2}(\mathbf{r}) \phi(\mathbf{r})=-4 \pi \rho(\mathbf{r}) .
$$

save and use it to compute the (io) terms along MD of inner atoms

## Solvation free energy for the macromolecule



The (ii) is the complicated term, since it arises from the inner atoms and would have to be update every MD step

$$
\Delta W_{\text {elec }}^{(i i)}=\sum_{\alpha \in \text { inner }} q_{\alpha} \phi_{r f}^{(i)}\left(\mathbf{r}_{\alpha}\right)
$$

or, more general:

$$
\Delta W_{e l e c}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r
$$

introduce $b_{n}(\boldsymbol{r})$ : basis functions, depend on the system geometry

$$
\rho^{(i)}(x)=\sum_{m} c_{m} b_{m}\left(r_{\alpha}\right)
$$

## Solvation free energy for the macromolecule

$$
\Delta W_{e l e c}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r
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## Solvation free energy for the macromolecule

introduce $b_{n}(\boldsymbol{r})$ : basis functions,

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$$

depend on the system geometry

$$
\rho^{(i)}(r)=\sum_{m} Q_{m} b_{m}(r)
$$

## Solvation free energy for the macromolecule

introduce $b_{n}(\boldsymbol{r})$ : basis functions,

$$
\Delta W_{\text {elec }}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r
$$

on the other hand

$$
\rho^{(i)}(r)=\sum_{\alpha \epsilon i n n e r} q_{\alpha} \delta\left(r-r_{\alpha}\right)
$$

$$
\rho^{(i)}(r)=\sum_{m} Q_{m} b_{m}(r)
$$

## Solvation free energy for the macromolecule

$$
\Delta W_{\text {elec }}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r
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$$

introduce $b_{n}(\boldsymbol{r})$ : basis functions,
depend on the system geometry

$$
\rho^{(i)}(r)=\sum_{m} Q_{m} b_{m}(r)
$$

Generalized multipole moment:

$$
Q_{n}=\sum_{\alpha \in \text { inner }} q_{\alpha} b_{n}\left(\mathbf{r}_{\alpha}\right)
$$

## Solvation free energy for the macromolecule

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$$

## Solvation free energy for the macromolecule

introduce $b_{n}(\boldsymbol{r})$ : basis functions,
$\Delta W_{\text {elec }}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r$
on the other hand

$$
\rho^{(i)}(r)=\sum_{\alpha \epsilon \text { inner }} q_{\alpha} \delta\left(r-r_{\alpha}\right)
$$

$$
\phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right)=\sum_{m} Q_{m} \phi_{r f}^{(i)}\left(b_{m}, \epsilon_{i}, \epsilon_{o}\right)
$$

$\Delta W_{\text {elec }}{ }^{(i i)}(\mathbf{X})=\frac{1}{2} \sum_{m n} Q_{m} M_{m n} Q_{n}$

Rx field matrix (computed once):

$$
M_{n m}=\int d \mathbf{r} b_{n}(\mathbf{r}) \phi_{\mathrm{rf}}\left(\mathbf{r} ; b_{m}(\mathbf{r})\right)
$$

## Solvation free energy for the macromolecule

1) 

$$
\Delta W_{\text {elec }}{ }^{(i o)}(\mathbf{X})+U_{\text {elec }}^{(i o)}(\mathbf{X})=\sum_{\alpha \in \text { inner }} q_{\alpha} \phi_{s}^{(o)}\left(\mathbf{r}_{\alpha}\right)
$$

2) 

$$
\begin{aligned}
& \Delta W_{\text {elec }}^{(i i)}=\frac{1}{2} \int \rho^{i} \phi_{r f}^{(i)}\left(\rho^{i}, \epsilon_{i}, \epsilon_{o}\right) d^{3} r \\
& \Delta W_{\text {elec }}{ }^{(i i)}(\mathbf{X})=\frac{1}{2} \sum_{m n} Q_{m} M_{m n} Q_{n}
\end{aligned}
$$

Rx field matrix (computed once):

$$
M_{n m}=\int d \mathbf{r} b_{n}(\mathbf{r}) \phi_{\mathrm{rf}}\left(\mathbf{r} ; b_{m}(\mathbf{r})\right)
$$

this is the costly part: compute for all basis functions the matrix elements in advance:

## Membrane systems


P. Konig, N. Ghosh, M. Hoffman, M. Elstner, E. Tajhorshid, Th. Frauenheim, QC, J.Phys. Chem.A Trhular Issue, 110, 548-563 (2006)

## QM/MM implementation

## SCC-DFTB energy contribution:



Extension to other QM methods is straightforward

## Effective QM/MM simulations for complex systems



Generalized Boundary Condition, Electrostatics in QM/MM: P. Schaefer, D. Riccardi, QC, J. Chem. Phys. 123, 014905 (2005); J. Phys. Chem. B. 109, 17715 (2005)
Membrane-proteins: P. König, N. Ghosh, QC, J. Phys. Chem. A (Truhlar Issue) 110, 548 (2006) [ccO, aqua porin, Hv channel] van der Waals in QM/MM: D. Riccardi, G. Li, QC J. Phys. Chem. B 108, 6467 (2004)
QM/MM free energy perturbation: Li, G. QC, J. Phys. Chem. B 107, 8643 (2003); 107, 14521 (2003)
Approximate DFT methods (Proton affinity, H-bonding, Phosphate, metals, ET): Y. Yang, H. Yu, J. Yu, M. Elstner, QC, J. Phys. Chem. B Feature Article, 110, 6458 (2006); J. Phys. Chem. A 111, 10861 (2007)

## Efficiency




Threonine in a water droplet:

- inner region: 18 A (2700 atoms)
- total system: 7200-42.000 atoms

Benighaus \& Thiel, JCTC 4 (2008) 1600.

## Dynamics in electronically excited states and proton transfer



Bondar et al., JACS 44 (2004) 14668, Structure 12 (2004) 1281

## Dynamics in electronically excited states and proton transfer



## Proton transfer in bR



## $1^{\text {st }}$ step: Photo-isomerisation



Reaction coordinate, efficiency

| alcohol | not specific (11 cis) | 10 ps | 0.1 |
| :--- | :--- | :--- | :--- |
| bR | trans | 13 cis | 0.5 ps |

## $1^{\text {st }}$ step: Photo-isomerisation



Reaction coordinate, efficiency

- 2 modes: C-C stretch and torsion
- specificity, speed?
- rotation in limited space: simple rotation?
- structure in K


## How is the energy stored in K?



Rotation in limited space

## Rotation in limited space



## Energy scheme: bR-K-L



## Proton transfer: bacteriorhodopsin



## Primary proton transfer step in bacteriorhodopsin: path 2

## Ana-Nicoleta Bondar. Marcus Elstner, Sandor Suhai, <br> Jeremy C. Smith and Stefan Fischer

Computational Molecular Bioply/sics, isetitute for Sientific Conputisg. Heitlolbarg Univarsity, Ginrmany
Molasular Biophysies Mepartimant, German Gancer Fsesneh Gontar, Heidalbarg. Germany


## Energy scheme: bR-K-L



## Directionality in the early photocycle steps





## Energy storage

$7 \mathrm{kcal} / \mathrm{mol}$ in retinal twist + $7 \mathrm{kcal} / \mathrm{mol}$ in perturbation of $h$-bonding interactions

- enough energy is stored to drive the photocycle:
membrane potential: 7kcal/mole
- thermal cis-trans isomerization is energetically unfavourable
- balance between productivity and energy storage


## Why no back-proton transfer?


what causes the 'energy-drop' between $M_{1}-M_{2}$ intermediates?
$\rightarrow$ Changes in structure: early M vs. late M

- Thr89-Asp85 distance
- \# waters
- deprotonation of 'proton release group' (next PT site)


## Step 2: ‘Proton release’



## 'Proton release'



1) proton transfer 2)destabilization of H -bonded network

A. $\quad$ Cytoplasm (CP)


Extracellular (EC)

## 'Proton release'



1) proton transfer
2)destabilization of H -bonded network

A. $\quad$ Cytoplasm (CP)


Extracellular (EC)

## 'Proton release'



1) proton transfer
2)destabilization of H -bondednetwork
$3) \rightarrow$ Arginin moves 'down

Question: what comes first: Arg movement or proton relase?
$\rightarrow \mathrm{MD}$ and free energy profiles

## Arginine dynamics

1) proton transfer
2) destabilization of H -bonded network
3) $\rightarrow$ Arginin moves down

## Arginine dynamics



1) proton transfer
2)destabilization of H -bonded. network
2) $\rightarrow$ Arginin moves down

## 'Free energy profile’



Clemens et al., to be published

## 'Proton release'



1) proton transfer
2)destabilization of H -bondednetwork
2) $\rightarrow$ Arginin moves down

- deprotonation:
a) positive charge of Arg destabilzes proton at PRG b) Glu's are 'moved apart' $\boldsymbol{\rightarrow}$ change of $\mathrm{pK}_{\mathrm{a}}$
$\rightarrow \mathrm{pK}_{\mathrm{a}}$ calculations


## 'Proton release'



1) proton transfer
2)destabilization of H -bondednetwork
2) $\rightarrow$ Arginin moves down
3) $=>$ positive charge of Arg 'pushes' proton out.
unclear up to now:
What is the 'proton release group?

## 'Proton release group' (PRG): first suggestion one glu or even both glutamates?

- FTIR difference spectra: PRG is not Glu (194 or 204)!
- no signal from $\mathrm{C}=\mathrm{O}$ band between $1700-1770 \mathrm{~cm}^{-1}$ detected after release!


## 'Proton release group' (PRG): first suggestion one glu or even both glutamates?

- FTIR difference spectra: PRG is not Glu (194 or 204)!
- no signal from $\mathrm{C}=\mathrm{O}$ band between $1700-1770 \mathrm{~cm}^{-1}$ detected after release!



## PRG: a protonated water cluster?

(Nature 439:109, PNAS 102:3633)


- FT-IR: continuum band between $1700 \mathrm{~cm}^{-1}$ and $2100 \mathrm{~cm}^{-1}$ measured
- characteristic for Zundel-complex

Zundel Ion



## Computational support for protonated cluster


electrostatic calculations

- proton may sit on a water cluster


QM/MM CPMD

- continuum band reported
- constraints on cluster
- Glu's not QM

Rousseau et al., Ang. 2004, 116,4908

## QM/MM MD calculations: include the Glu's in QM


method: QM/MM/GSBP
DFT-B3LYP/CHARMM/GSBP 2ps dynamics
SCC-DFTB/CHARMM/GSBP 2ns dynamics (for IR spectra)

- proton leaves water cluster within 1 ps
- stable conformation between Glu194 and Glu204


## QM/MM MD calculations


$\rightarrow 3$ problems/questions:

1. Is this compatible with crystal structures?
2. can we explain the missing $\mathrm{C}=\mathrm{O}$ signature in IR spectra?
3. can we explain the continuum modes?

## 1) crystal structures


this model is NOT consistent with Xray data
$\mathrm{O}-\mathrm{O}$ distance too larqe: $\mathrm{R}=4.5 \mathrm{~A}$

|  |  | distance $(A)$ |
| :--- | :--- | :---: |
| Ground | 1C3W $(1.55 \AA)(25)$ | 3.0 |
| Ground | 1QHJ $(1.90 \AA)(40)$ | 2.4 |
| Ground | 1KGB $(1.65 \AA)(41)$ | 2.5 |
| Ground | 1IW6 $(2.30 \AA)(42)$ | 2.5 |
| Ground | 1C8R $(1.80 \AA)(43)$ | 2.6 |
| L | 1EOP $(2.10 \AA$ A) (44) | 3.1 |
| L | 1O0A $(1.62 \AA)(27)$ | 3.1 |
| L | 1UCQ $(2.40 \AA)(45)$ | 2.6 |
| L | 1VJM $(2.30 \AA)(46)$ | 2.4 |
| L | 2NTW $(1.53 \AA)(26)$ | 4.2 |

this one fits: $\mathrm{O}-\mathrm{O}$ distance $\mathrm{R}=2.5 \mathrm{~A}$
small distance only possible due to shared proton!

## 2) Continuum modes


shared proton leads to continuum mode

IR spectra with only one Glu in QM region: continuum missing

Phatak et al., PNAS 105, 19672



## 2) Continuum modes


shared proton leads to continuum mode

IR spectra with only one Glu in QM region: continuum missing

Phatak et al., PNAS 105, 19672


## 3) $\mathrm{C}=\mathrm{O}$ stretch


what about $\mathrm{C}=\mathrm{O}$ ?


## 3) $\mathrm{C}=\mathrm{O}$ stretch



## 3) $\mathrm{C}=\mathrm{O}$ stretch


what about $\mathrm{C}=\mathrm{O}$ ?
$\rightarrow \mathrm{C}=\mathrm{O}$ is below $1690 \mathrm{~cm}^{-1}$ due to strong H -bond
can not be detected experimentally due to strong absorption of backbone!

$1700-1750 \mathrm{~cm}^{-1}$


## QM/MM MD on PRG

Downward movement of ARG82 occurs after 1st PT: leads to proton release

Clemens et al., to be published

Structural model of proton release group: proton shared by Glu's

1) consistent with crystal structures
2) strong H -bond shift $\mathrm{C}=\mathrm{O}$ below $1700 \mathrm{~cm}^{-1}$ : not measurable
3) continuum mode is NOT protonated water cluster, strong H-bonds (LBHB's) do as well


## O $\rightarrow$ bR: PT step 5



no wt $X$-ray structure, open questions:

1. number of waters inactive site?

2. number of waters inactive site?
3. is there an $\{0\}$ intermediate with Asp212 protonated?
$\mathrm{C}=\mathrm{O}\left(\mathrm{cm}^{-1}\right)$
0 \{0\}
UVvis (eV)
17521712
1.941 .98

4. number of waters inactive site?
5. is there an $\{O\}$ intermediate with Asp212 protonated?

|  | 0 | $\{0\}$ |
| :--- | :--- | :--- |
| $\mathrm{C}=\mathrm{O}\left(\mathrm{cm}^{-1}\right)$ | $\mathbf{1 7 5 2}$ | 1712 |
| UVvis $(\mathrm{eV})$ | 1.94 | 1.98 |

3. movement of Arg82 side-chain?


0 . use acid blue strucure!

1. number of waters inactive site:
2. is there an $\{O\}$ intermediate with Asp212 protonated?

|  | 0 | \{0\} |
| :---: | :---: | :---: |
| $\mathrm{C}=\mathrm{O}\left(\mathrm{cm}^{-1}\right)$ | 1752 | 1712 |
| UVvis (eV) | 1.94 | 2.00 |

3. movement of Arg82 side-chain? DOWN


## O $\rightarrow$ bR: PT step 5



## initial and end

 states resolved:calculate PT pathways using:

- reation path techniques
- umbrella sampling


## Reaction path calculations for PT




| Model | Path | Member <br> of proton <br> wire | Activatio <br> n energy <br> (kcal/ <br> mol) | Reaction <br> Energy <br> (kcal/ <br> mol) |
| :---: | :---: | :---: | :---: | :---: |
| gsbr | Path1 |  <br> waters | 35.6 | -3.8 |
| gsbr | Path 2 | Asp212, <br>  <br> waters | 35.6 | -4.2 |

$\mathrm{O} \rightarrow \mathrm{bR}$
$\mathrm{O} \rightarrow \mathrm{bR}$


## Model 2:Arg82 down




| Model | Path | Member <br> of proton <br> wire | Activation <br> energy <br> (kcal/ <br> mol) | Reaction <br> Energy <br> (kcal/ <br> mol) |
| :---: | :---: | :---: | :---: | :---: |
| da- <br> gsbr | Path3 | waters | $\mathbf{2 3 . 0}$ | $\mathbf{1 0 . 1}$ |

## Proton transfer: other systems



GFP

## Proton transfer

Bacterial reaction center
Bacteriorhodopsin
Aquaporin
ADH, CA
Aquaporin
GFP: excited states PT
DNA- Bases

Photosynthetic Reaction Center


