

Computational electrostatics for biomolecular systems

Nathan Baker

Washington University in St. Louis
Dept. of Biochemistry and Molecular Biophysics
Center for Computational Biology
<http://agave.wustl.edu/>
baker@ccb.wustl.edu



Overview

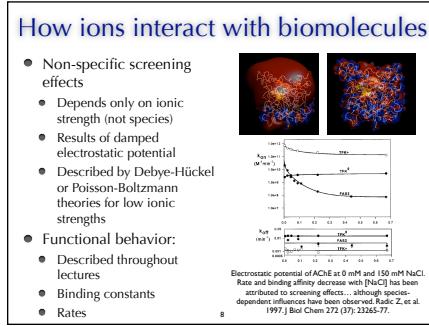
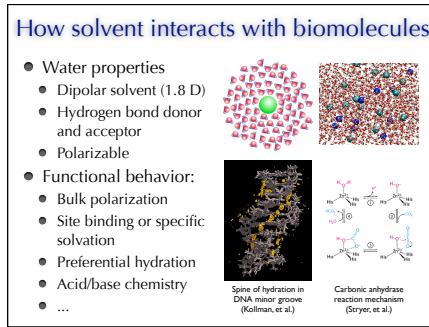
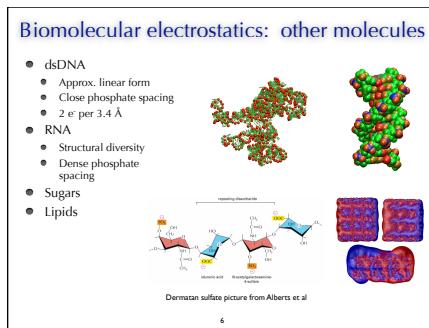
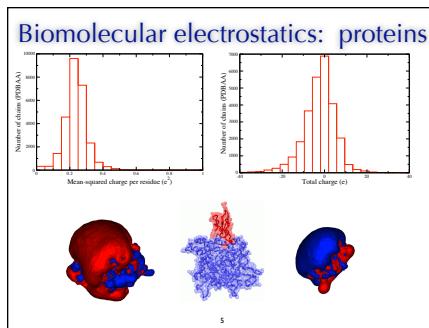
- Sessions:
 - Lecture: "Basic electrostatics and solvation"
 - Lab: "Using APBS and PDB2PQR" and laptop setup (if desired)
 - Lecture: "Advanced electrostatics and solvation"
 - Lab: "Advanced solvation topics"
 - Throughout the day: discussion of your own projects
 - Workshop materials available at <http://tinyurl.com/ccpb-apbs-workshop>

2

Basic electrostatics and solvation

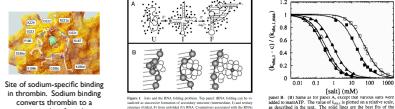
Electrostatics and solvation in biomolecular systems

4



How ions interact with biomolecules

- Site-specific binding
- Ion-specific
- Site geometry, electrostatics, coordination, etc. enables favorable binding
- Functional behavior: co-factors, allosteric activation, folding, etc.



Site of sodium-specific binding in chromatin. Sodium binding converts chromatin to a nucleoplasmin form by allosterically enhancing the rate and changing substrate specificity. (Bianchi et al. 2004) *Bio Chem* **279** (10): 31842-53.

Draper DE et al. 2005. Annu. Rev. Biophys. Biomol. Struct. **34**: 221-43.

9

How ions interact with biomolecules

- Hofmeister effects (preferential hydration)
 - How much salt is required to precipitate a protein? It depends on the salt...
 - Partitioning of ions between water and nonspecific sites on biomolecule
 - Dependent on ion type (solvation energy, etc.)
 - Dominate at high salt concentrations
 - Functional behavior: protein stability, membrane structure and surface potentials, protein-protein interactions



Friedrich Hofmeister

most stabilizing strongly solvated anions	most destabilizing weakly solvated anions
$\text{citrate}^3 > \text{SO}_4^{2-} > \text{PO}_4^{3-} > \text{F}^- > \text{Cl}^- > \text{Br}^- > \text{I}^- > \text{NO}_3^- > \text{ClO}_4^-$	
$\text{N}(\text{Me})_4^+ > \text{NH}_4^+ > \text{Cs}^+ > \text{Rb}^+ > \text{K}^+ > \text{Na}^+ > \text{H}^+ > \text{Ca}^{2+} > \text{Mg}^{2+} > \text{Al}^{3+}$	weakly solvated cations

Adapted from <http://www.tbsi.ac.uk/water/hofmeier.htm>

10

Computational methods for biomolecular electrostatics and solvation

11

Modeling biomolecule-solvent interactions

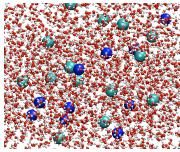
Increasing detail, cost ↑

Solvent models	Ion models
<ul style="list-style-type: none"> Quantum Explicit Polarizable Fixed charge 	<ul style="list-style-type: none"> Quantum Explicit Polarizable Fixed charge
<ul style="list-style-type: none"> Integral equation RISM 3D methods DFT 	<ul style="list-style-type: none"> Integral equation RISM 3D methods DFT
<ul style="list-style-type: none"> Primitive Poisson equation 	<ul style="list-style-type: none"> Field-theoretic Extended models Poisson-Boltzmann equation
<ul style="list-style-type: none"> Phenomenological Generalized Born, et al Modified Coulomb's law 	<ul style="list-style-type: none"> Phenomenological Generalized Born, et al Modified Debye-Hückel

12

Explicit solvent simulations

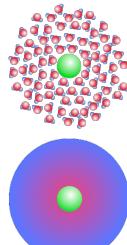
- Sample the configuration space of the system: ions, atomically-detailed water, solute
- Sample with respect to a particular ensemble: NpT, NVT, NVE, etc.
- Molecular dynamics or Monte Carlo
- Advantages:
 - High levels of detail
 - Additional degrees of freedom readily included
 - All interactions are explicit
- Disadvantages:
 - Slow and uncertain convergence
 - Boundary effects
 - Poor scaling
 - Some effects still not considered in many force fields...



13

Implicit solvent models

- Solute typically only accounts for 5-10% of atoms in explicit solvent simulation...
- ...so treat solvent effects implicitly:
 - Solvent as polarization density
 - Ions as "mobile" charge density
- Linear and local solvent response
- "Mean field" ion behavior
- Uncertain treatment of "apolar" effects



Solvation free energies (and mean forces)

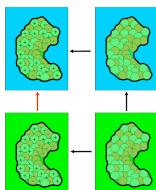
- "Potentials of mean force" (PMF) and solvation free energies
- Function of conformation
- Integration over explicit degrees of freedom yields free energy
- *Global information*
- Mean forces
 - Derivatives of PMFs for atom positions
 - Integration yields PMFs
- *Local information*



15

Polar solvation (implicit)

- Charging free energies
- Solvent: dielectric effects through Poisson equation
- Ions: mean-field screening effects through Poisson-Boltzmann equation



16

Electrostatics in a homogeneous dielectric

- An *isotropic* dielectric continuum exhibits the same response in all directions
- The dielectric tensor can be reduced to a scalar
- For a homogeneous isotropic dielectric, electrostatic energies are still governed by Coulomb's law (with a dielectric coefficient)

$$U = \frac{q_1 q_2}{4\pi\epsilon_0 \epsilon r}$$

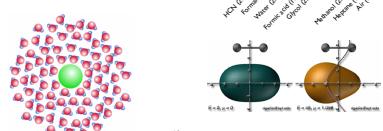
$$\mathbf{F} = \frac{q_1 q_2}{4\pi\epsilon_0 \epsilon r^2} \frac{\mathbf{r}}{r}$$

Dielectric constant

17

Dielectric constants

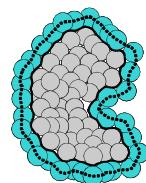
- Several contributions to polarizability
 - Electronic polarizability
 - Intramolecular rearrangement
 - Reorientation of permanent dipole moment
 - Hydrogen bonding networks



18

Molecular dielectric coefficients

- A heterogeneous molecule like a biomolecule shouldn't really be represented by a continuum dielectric...
- ...however, that doesn't keep people from trying
- Multiple dielectric values:
 - 1 = vacuum
 - 2.4 = atomic polarizability (solid)
 - 4.10 = some libration, minor sidechain rearrangement
 - 10-20 = significant internal rearrangement
- Multiple surface definitions:
 - van der Waals
 - Splines
 - Molecular surface



19

Gauss' law, Gauss' theorem, and Poisson equation

- Gauss' law: the integral of the displacement over a surface equals the enclosed charge (general conservation relation)

$$\int_{\partial\Omega} \epsilon(\mathbf{s}) \mathbf{E}(\mathbf{s}) \cdot d\mathbf{s} = \int_{\Omega} \frac{\rho(\mathbf{x})}{\epsilon_0} d\mathbf{x}$$
- Gauss' theorem: the integral of a flux over a closed surface equals the enclosed divergence

$$\int_{\partial\Omega} \mathbf{v}(\mathbf{s}) \cdot d\mathbf{s} = \int_{\Omega} \nabla \cdot \mathbf{v}(\mathbf{x}) d\mathbf{x}$$

$$\int_{\Omega} \epsilon(\mathbf{s}) \mathbf{E}(\mathbf{s}) \cdot d\mathbf{s} = \int_{\Omega} \nabla \cdot (\epsilon(\mathbf{x}) \mathbf{E}(\mathbf{x})) d\mathbf{x}$$
- Poisson's equation: divergence of the displacement equals the charge density

$$\int_{\Omega} \nabla \cdot (\epsilon(\mathbf{x}) \mathbf{E}(\mathbf{x})) d\mathbf{x} = \int_{\Omega} \frac{\rho(\mathbf{x})}{\epsilon_0} d\mathbf{x}$$

$$\nabla \cdot (\epsilon(\mathbf{x}) \mathbf{E}(\mathbf{x})) = \frac{\rho(\mathbf{x})}{\epsilon_0}$$

20

Poisson equation: structural elements

- Charge distribution & boundary conditions: solute atom positions and charges
- Dielectric function: solute atom radii, positions; solvent radius; polarizabilities
- Assumptions: linear and local response; no mobile ions

$$\begin{aligned}-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) &= \rho(\mathbf{x}) \quad \text{for } \mathbf{x} \in \Omega \\ \phi(\mathbf{x}) &= \phi_0(\mathbf{x}) \quad \text{for } \mathbf{x} \in \partial\Omega\end{aligned}$$

21

Poisson equation: energies

- Total energies obtained from:
 - Integral of polarization energy
 - Sum of charge-potential interactions

$$\begin{aligned}G[\phi] &= \frac{1}{4\pi} \int \left\{ \rho(\mathbf{x})\phi(\mathbf{x}) - \frac{\epsilon(\mathbf{x})}{2} [\nabla\phi(\mathbf{x})]^2 \right\} d\mathbf{x} \\ &= -\frac{1}{8\pi} \int \epsilon(\mathbf{x}) [\nabla\phi(\mathbf{x})]^2 d\mathbf{x} \\ &= -\frac{1}{8\pi} \int \rho(\mathbf{x})\phi(\mathbf{x}) d\mathbf{x} = -\frac{1}{8\pi} \sum_i q_i \phi(\mathbf{x}_i)\end{aligned}$$

22

Electrostatic energy example: Born ion

23

The Born ion

- What is the energy of transferring a non-polarizable ion from between two dielectrics?
- Free energy for charging a sphere in solvent and vacuum
- No *polar* energy for transferring the uncharged sphere to solvent

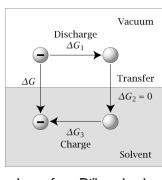


Image from Dill textbook.

24

Born ion: solvation energies

- Integrate polarization for dielectric media
- Assume ion is non-polarizable
- Subtract energies between media

$$\begin{aligned}
 G_1 &= \frac{\epsilon_0}{2} \int_{\text{solvent}} \epsilon_i [\nabla \phi_i(\mathbf{x})]^2 d\mathbf{x} \\
 &= \frac{\epsilon_0}{2} \int_a^\infty \epsilon_i \left(-\frac{q}{4\pi\epsilon_0\epsilon_i r^2} \right)^2 4\pi r^2 dr \\
 &= \frac{q^2}{8\pi\epsilon_0\epsilon_i a} \\
 \Delta G &= G_2 - G_1 \\
 &= \frac{q^2}{8\pi\epsilon_0 a} \left(\frac{1}{\epsilon_2} - \frac{1}{\epsilon_1} \right)
 \end{aligned}$$

25

Poisson-Boltzmann theory

- Simplifies to Debye-Hückel theory
- Continuum dielectric (Poisson equation)
- Non-correlated implicit ions (mean field theory)
- Limitations:
 - Low ion concentration
 - Low ion valency
 - No specific interactions: ion-solute, ion-ion, ion-solvent, solute-solvent, ...
- Going to provide a very simple derivation (**other approaches are more entertaining!**)

26

Poisson-Boltzmann derivation: Step 1

- Start with Poisson equation to describe solvation and electrostatics
- Supplement biomolecular charge distribution with mobile ion term

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) = \rho_f(\mathbf{x}) + \rho_m(\mathbf{x})$$

27

Poisson-Boltzmann equation: Step 2

- Choose mobile ion distribution form
 - Boltzmann distribution implies no ion-ion correlation
 - Apparent lack of normalization implies grand canonical ensemble
 - No detailed structure for ion desolvation
- Result: nonlinear partial differential equation
- Don't forget boundary conditions!

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) = \rho_f(\mathbf{x}) + \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]}$$

28

Equation coefficients: “fixed” charge distribution

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) = \rho_f(\mathbf{x}) + \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]}$$

- Charges are *modeled as* delta functions: hard to represent
- Often discretized as splines to “smooth” the problem
- Higher-order charge distributions also possible

29

Equation coefficients: mobile ion distribution

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) = \rho_f(\mathbf{x}) + \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]}$$

- Usually assume a single exclusion function for all ions
- Generally based on inflated van der Waals radii

30

Equation coefficients: dielectric function

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) = \rho_f(\mathbf{x}) + \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]}$$

- Describes change in local polarizability
- Low dielectric interior (2-20)
- High dielectric exterior (80)
- Many definitions
 - Molecular
 - Solvent-accessible
 - van der Waals
 - Smoothed (Gaussian, spline)
- Results can be *very sensitive* to surface definition!

31

PB special cases: symmetric electrolyte

- Assume similar steric interactions for each species with solute
- Simplify two-term exponential series to hyperbolic sine

$$\begin{aligned} \rho_m(\mathbf{x}) &= qce^{-\beta[q\phi(\mathbf{x}) + V(\mathbf{x})]} - qce^{-\beta[-q\phi(\mathbf{x}) + V(\mathbf{x})]} \\ &= qce^{-\beta V(\mathbf{x})} [e^{-\beta q\phi(\mathbf{x})} - e^{\beta q\phi(\mathbf{x})}] \\ &= -2qce^{-\beta V(\mathbf{x})} \sinh [\beta q\phi(\mathbf{x})] \\ &= -\bar{\kappa}^2(\mathbf{x}) \sinh [\beta q\phi(\mathbf{x})] \end{aligned}$$

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi + \bar{\kappa}^2(\mathbf{x}) \sinh [\beta q\phi(\mathbf{x})] = \rho_f(\mathbf{x})$$

32

PB special cases: linearization

- Assume similar steric interactions for each species with solute
- Assume very small local electrostatic energies
- Taylor series expansion of exponential
- Bulk solution electroneutrality

$$\begin{aligned}\rho_m(\mathbf{x}) &= \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]} \\ &\approx e^{-\beta V(\mathbf{x})} \sum_m q_m c_m [1 - \beta q_m \phi(\mathbf{x})] \\ &= -\left[\beta e^{-\beta V(\mathbf{x})} \sum_m q_m^2 c_m \right] \phi(\mathbf{x}) \\ &= -\bar{\kappa}^2(\mathbf{x}) \phi(\mathbf{x})\end{aligned}$$

$$-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi + \bar{\kappa}^2(\mathbf{x}) \phi(\mathbf{x}) = \rho_f(\mathbf{x})$$

33

Poisson-Boltzmann energies

- Similar to Poisson equation
- Functional: integral of solution over domain
- Solution extremizes energy
- Basis for calculating forces: charge-field, dielectric boundary, osmotic pressure

$$\begin{aligned}G[\phi] &= \frac{1}{4\pi} \int_{\Omega} \left\{ \rho_f(\mathbf{x}) \phi(\mathbf{x}) - \frac{\epsilon(\mathbf{x})}{2} |\nabla \phi(\mathbf{x})|^2 + \sum_m c_m \left[e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]} - 1 \right] \right\} d\mathbf{x} \\ &\approx \frac{1}{4\pi} \int_{\Omega} \left\{ \rho_f(\mathbf{x}) \phi(\mathbf{x}) - \frac{\epsilon(\mathbf{x})}{2} |\nabla \phi(\mathbf{x})|^2 + \frac{\bar{\kappa}^2(\mathbf{x})}{2} |\phi(\mathbf{x})|^2 \right\} d\mathbf{x} \\ &= -\frac{1}{8\pi} \int_{\Omega} \rho_f(\mathbf{x}) \phi(\mathbf{x}) d\mathbf{x}\end{aligned}$$

34

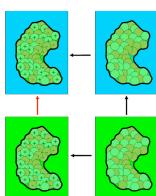
Poisson-Boltzmann equation

$$\begin{aligned}-\nabla \cdot \epsilon(\mathbf{x}) \nabla \phi(\mathbf{x}) &= \rho_f(\mathbf{x}) + \sum_m q_m c_m e^{-\beta[q_m \phi(\mathbf{x}) + V_m(\mathbf{x})]} \\ \text{Reaction field} &\quad \text{Solute} \\ \text{Dielectric boundary} &\quad \text{Solvent} \\ \text{Osmotic} &\quad \text{Pressure}\end{aligned}$$

35

Reminder: polar solvation

- Charging free energies
- Solvent: dielectric effects through Poisson equation
- Ions: mean-field screening effects through Poisson-Boltzmann equation
- What about the uncharged steps?



36

Nonpolar solvation (implicit)

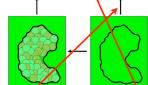
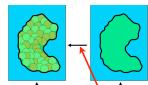
- It's not just surface area!
- WCA formalism:
 - Cavity creation
 - Small length scales: proportional to volume (pressure) and area (surface tension)
 - Large length scales: proportional to area (surface tension)
- Dispersive interactions
- Modeled by WCA formalism
- Integral of potential over solvent-accessible volume



Adapted from: Levy RM, Zhang LY, Gallicchio E, Fets AK. 2003. *J Am Chem Soc* **125** (31): 9523-9530.

37

Nonpolar solvation: implementation



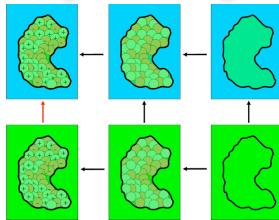
$$W^{(np)}(\mathbf{x}) = \gamma A(\mathbf{x}; \sigma) + pV(\mathbf{x}; \sigma) + p \int_{\Omega} g_0(\mathbf{x}, \mathbf{y}; \sigma) U_{att}^{(np)}(\mathbf{x}, \mathbf{y}; \sigma) d\mathbf{y}$$

$$\mathbf{F}_1^{(np)}(\mathbf{x}) = -\nabla \frac{\partial A(\mathbf{x}; \sigma)}{\partial \mathbf{x}_i} - p \frac{\partial V(\mathbf{x}; \sigma)}{\partial \mathbf{x}_i} - p \int_{\Omega} g_0(\mathbf{x}, \mathbf{y}; \sigma) \frac{\partial U_{att}^{(np)}}{\partial \mathbf{x}_i}(\mathbf{x}, \mathbf{y}; \sigma) d\mathbf{y}$$

Wagener JA, Balter NA. Proc Natl Acad Sci USA. **103**:8331-6, 2006.

38

Putting it all back together



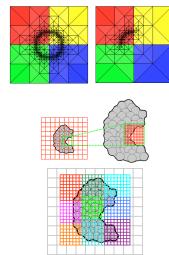
Adapted from: Levy RM, Zhang LY, Gallicchio E, Fets AK. 2003. *J Am Chem Soc* **125** (31): 9523-9530.

39

Software for continuum electrostatics and solvation

Solving the PB equation

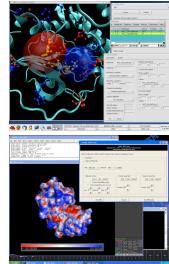
- Parallel adaptive finite element methods
 - Bank and Holst, *SIAM Review*, 2003
 - A posteriori residual-based error estimators
 - PB-specific customization
 - FETK-based solution (<http://www.fek.org/>)
- Parallel focusing methods
 - Baker et al, *Proc Natl Acad Sci*, 2001
 - Loosely related to Bank-Holst method
 - PMG-based solution (<http://www.fek.org/>)



41

Implicit solvent tools

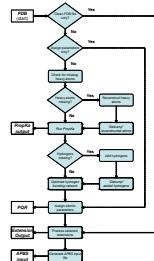
- APBS (<http://apbs.sj.net/>)
- PB electrostatics calculations
- Freely available
- Fast finite element (FETK) and multigrid (PMG) solvers from Holst group (<http://fek.org/>)
- Works with most popular visualization software (VMD, PMV, PyMOL)
- Links with CHARMM, AMBER, TINKER*
- PDB2PQR (<http://pdb2pqr.sj.net/>)



42

PDB2PQR

- PDB2PQR (<http://pdb2pqr.sj.net/>)
- Collaborative project: Jens Nielsen, Jan Jensen, and Gerhard Klebe groups
- Prepares PDB files for other calculations
- Assigns titration states (PROPKA) and optimizes hydrogen positions
- “Repairs” missing heavy atoms
- Assigns parameters
- Web-based and command-line
- Freely available (GPL or BSD) and extensible



Dolinsky TJ, et al. *Nucleic Acids Res.* **35**:W522-5, 2007;

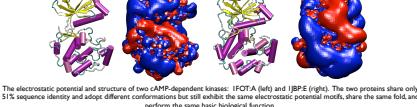
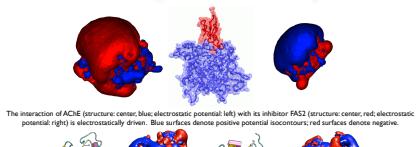
Dolinsky TJ, et al. *Nucleic Acids Res.* **32**:W665-7, 2007; 43

Advanced electrostatics and solvation

Applications of continuum electrostatics

Visualization and analysis of electrostatic potentials

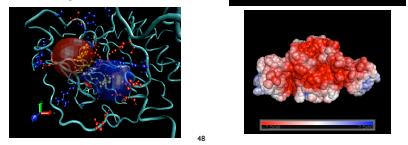
Electrostatic potential comparisons



47

Inspection of ligand binding sites

- Balanol protein kinase A binding (Wong CF, et al. J Med Chem 44, 1530-9 (2001))
- NikR Ni(II) and DNA binding



Quantitative comparison of electrostatic potentials

- Do electrostatic potentials tell us anything about biomolecular function?
 - Ligand binding
 - Active sites or shifted pKs?
 - Structural (destabilization?)

PH domain comparison: similar fold, similar electrostatics, different sequence. Bloomberg N, et al. *Proteins* 37, 879-877 (1999).

SOD comparison. Lavery DR, et al. *Biochemistry* 42, 3464-73 (2003).

Purine Mg²⁺ and RNA binding sites in an unfolded protein. Brock AH. *J Mol Biol* 312, 885-96 (2001).

49

Multiresolution contour trees

POB Data → POR Data → Accessibility Potential Data → Quantitative analysis → Visualization

50

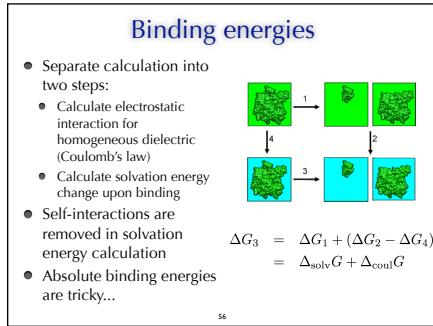
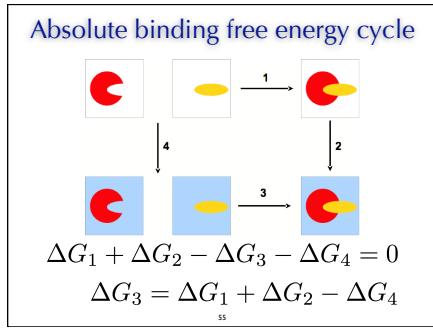
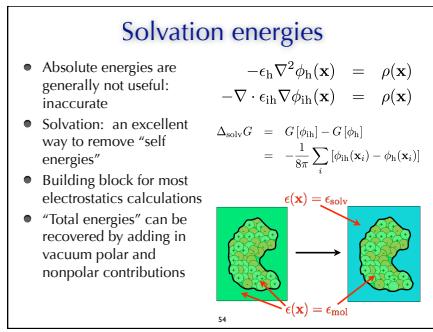
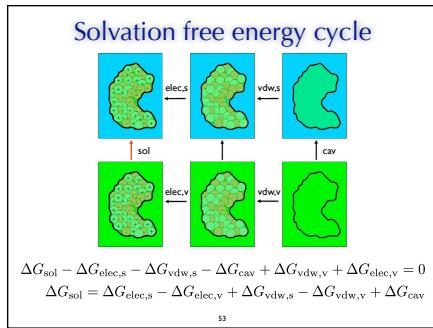
Thermodynamics

Free energy cycles

- At the heart of most calculations...
- ...because we can't usually directly calculate the quantity of interest
- Most important principle:
 - Energy is a state function
 - Integral of energy changes over a closed cycle is zero

$$\Delta G_{A \rightarrow B} + \Delta G_{B \rightarrow C} + \Delta G_{C \rightarrow D} + \Delta G_{D \rightarrow A} = 0$$

52



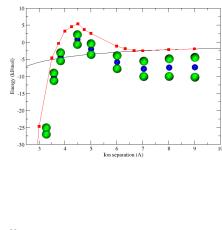
Ion desolvation PMF

- Two nonpolarizable ions
 - Solve for polar energy as a function of separation
 - Poisson equation
- Increase in energy as water is “squeezed” out
 - Desolvation effect
 - Smaller volume of polarized water
- Important points
 - Non-superposition of ion potentials
 - Reaction field causes repulsion at short distances
 - Dielectric medium “focuses” field

57

Polar binding energy (PMF): two ions

- Water dielectric
- Two ions: 3 Å radii, non-polarizable, opposite charges
- Basic calculation:
 - Calculate solvation energies of isolated ions
 - Calculate solvation energy of “complex”
 - Subtract solvation energies
 - Add vacuum Coulomb’s law



58

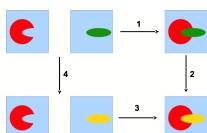
Polar binding energy: how-to

- Method #1 (allows for conformational change)
 - Calculate solvation energies for complex and isolated components. Use focusing as needed.
 - Subtract to calculate solvation energy change upon binding.
 - Calculate Coulombic energies for complex and isolated components *using same internal dielectric constant!* Subtract to calculate Coulombic energy change upon binding.
 - Add solvation and Coulombic energy changes.
- Method #2 (fast but dangerous!)
 - Calculate absolute energies for complex and isolated components. Using focusing as needed. *Use the same grid, dielectric, etc. parameters for all calculations!!!*
 - Subtract.

59

Relative binding free energy cycle

- Usually better accuracy
- Cancellation of numerical errors
- Cancellation of hard-to-quantify terms
- Useful for predicting mutations, changes in functional groups, etc.



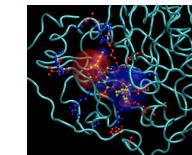
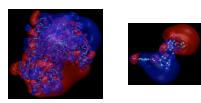
$$\Delta G_1 + \Delta G_2 - \Delta G_3 - \Delta G_4 = 0$$

$$\Delta\Delta G = \Delta G_1 - \Delta G_3 = \Delta G_4 - \Delta G_2$$

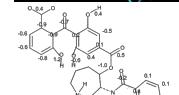
60

Binding energy example

- Protein kinase A inhibition by balanol
- Wong CF, et al. *J Med Chem* 44, 1530-9 (2001)
- Continuum electrostatics analysis of protein mutations and functional group changes on binding affinity



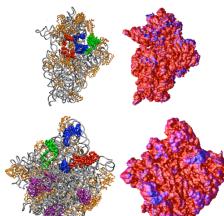
61



Application to ribosomes

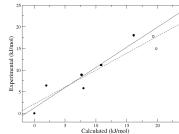
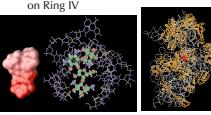
- Ribosome central to protein synthesis machinery
- Target for several pharmaceuticals
- Nucleoprotein composition make it computationally challenging
- Composed of two subunits (large and small):
 - Large: consists of 88,000 atoms and roughly 200 Å cube
 - Small: consists of more than 95,000 atoms and roughly 200 Å cube
- Function involves several interesting features:
 - Protein-nucleic acid association
 - Protein-protein association
 - Continuum charge
 - Site dependent (type and quantity)
- Solved on 343 processors of Blue Horizon to 0.41 Å (30S) and 0.43 Å (50S) resolution

Baker NA, et al. *Proc Natl Acad Sci USA*, **98**, 10037-41, 2001; Ma C, et al. *J Am Chem Soc*, **124**, 1438-42, 2002.



Ribosome-antibiotic binding

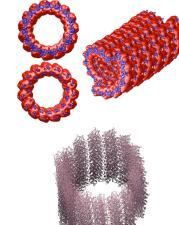
- Determine binding energies between 30S ribosomal subunit and aminoglycoside antibiotics
- Good agreement for experimental and computational relative binding free energies: 0.78 ± 0.13 slope with small molecules, 0.95 ± 0.19 slope without
- Suggests importance of basic groups on Ring IV



Baker NA, et al. *Proc Natl Acad Sci USA*, **98**, 10037-41, 2001; Ma C, et al. *J Am Chem Soc*, **124**, 1438-42, 2002.

Application to microtubules

- Important cytoskeletal components: structure, transport, motility, division
- Typically 250-300 Å in diameter and up to millimeters in length
- Computationally difficult due to size (1,500 atoms Å⁻³) and charge (-4.5 e Å⁻³)
- Solved LBPE at 150 mM ionic strength on 686 processors for 600 Å-long, 1.2-million-atom microtubule
- Resolution to 0.54 Å for largest calculation: quantitative accuracy



Baker NA, et al. *Proc Natl Acad Sci USA*, **98**, 10037-41, 2001; Sept D, et al. *Protein Sci*, **12**, 2257-61, 2003.

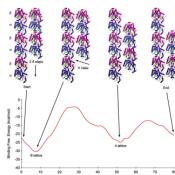
64

Microtubule stability and assembly

- Collaboration with Andy McCammon (UCSD) and Dave Sept (Wash U BME)
- Performed series of calculations on tubulin dimers and protofilament pairs
- Poisson-Boltzmann electrostatics and SASA apolar energies
- Observed 7 kcal/mol stronger interactions between protofilaments than within
- Determined energetics for helix properties: predict correct minimum for experimentally-observed A (52 Å) and B (8-9 Å) lattices



Baker NA, et al. Proc Natl Acad Sci USA, **98**, 10037-41, 2001;
Dolinsky TJ, et al. Nucleic Acids Res, **32**, W665-7, 2004



65

pK_a calculations

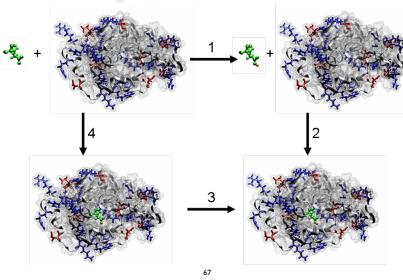
- Want acid dissociation constant for residues in a particular structural context
- Use "model" pK_as for amino acids
- Calculate "intrinsic" pK_a from two calculations:
 - Binding of unprotonated residue
 - Binding of protonated residue
- Calculate titration state and actual from sampling of coupled pK_as
- Conformational distributions can matter

66

Amino acid	α -carboxylic acid	α -amino	Side chain
Alanine	2.35	9.87	
Arginine	2.01	9.04	(2.48)
Asparagine	2.02	8.80	
Aspartic acid	2.10	9.82	3.86
Cysteine	2.05	10.25	8.00
Glutamic acid	2.10	9.47	4.07
Glycine	2.35	9.78	
Histidine	1.77	9.18	6.10
Isoleucine	2.23	9.76	
Leucine	2.33	9.74	
Lysine	2.18	8.95	(10.33)
Methionine	2.28	9.21	
Phenylalanine	2.58	9.24	
Proline	2.00	10.60	
Serine	2.21	9.15	
Threonine	2.09	9.10	
Tryptophan	2.38	9.39	
Tyrosine	2.20	9.11	
Valine	2.29	9.72	

67

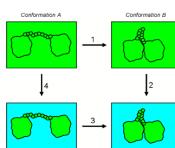
pK_a calculations



67

Conformational changes: two conformations

- Same idea as binding free energies
- Calculate polar energy change due to conformational change in homogeneous dielectric (Coulomb's law)
- Calculate polar solvation energy change due to conformation change in inhomogeneous dielectric
- Subtract.



68

Conformational change: multiple conformations

- MM/PBSA: include contribution from multiple conformations to energy
- Typically used for binding energy
- Accounts for conformational distribution effects on
 - Intra- and intermolecular energy (mechanics)
 - Solvation (Poisson-Boltzmann and apolar)
 - Entropy (quasi-harmonic)

$$Z_i = \int e^{-\beta(U(\mathbf{x}_i) + W(\mathbf{x}_i))} d\mathbf{x}_i \approx z_i^{\text{int}} e^{-\beta(U(\mathbf{x}_i) + W(\mathbf{x}_i))}$$

$$\Delta G = -\frac{1}{\beta} \log \left(\frac{Z_{AB}}{Z_A Z_B} \right)$$

$$\approx -\frac{1}{\beta} \log \left(\frac{z_{AB}^{\text{int}}}{z_A^{\text{int}} z_B^{\text{int}}} \right) + \langle U_{AB}(\mathbf{x}_i) + W_{AB}(\mathbf{x}_i) \rangle - \langle U_A(\mathbf{x}_i) + W_A(\mathbf{x}_i) \rangle - \langle U_B(\mathbf{x}_i) + W_B(\mathbf{x}_i) \rangle$$

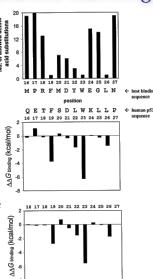
49

MM-PBSA: computational alanine scanning

- Examine the interface of oncoprotein MDM2 with N-terminus of tumor suppressor p53
- Apply MM-PBSA methods with normal mode entropies
- Surprisingly good results!
- Massova I, Kollman PA. *J Am Chem Soc* 121, 8133-43 (1999).



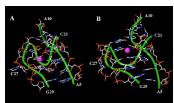
50



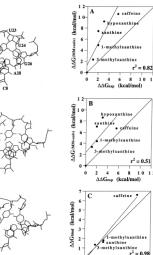
51

MM-PBSA: RNA-ligand interactions

- Calculate binding free energy of theophylline to RNA 33-mer
- Use normal mode entropy calculation
- Compare with thermodynamic integration
- Reasonable agreement between computational (-7.5 kcal/mol) and experimental (-9.0 kcal/mol) binding energies
- Pretty good relative binding free energies
- Gouda H, Kunz ID, Case DA, Kollman PA. 2003. *Biochemistry* 68 (1): 16-34.



71



72

Summary

- Continuum electrostatics:
 - Linear and local response
 - Mean field ion behavior
- Numerical methods
- Applications
 - Structural bioinformatics and other analyses
 - Thermodynamics
- Binding affinities
- Solvation energies
- Kinetics
- Forces
- Rate constants
- Dynamics

72