

Overview of Free Energy Methods and Collective Variables in NAMD

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Outline:

Introduction

Free energy applications

Alchemical free energy calculations

- Free Energy Perturbation (FEP)
- Thermodynamic Integration (TI)
- FEP in NAMD and VMD

Geometrical free-energy calculations

- Steered Molecular Dynamic (SMD)
- Adaptive Biasing Potential
 - Metadynamics (MtD)
 - Well-tempered metadynamics (WT-MtD)
- Adaptive Biasing Force (ABF)
- Extended-system Adaptive Biasing Force (eABF)

Introduction: Free energy applications





Introduction: Free energy applications

- Partition coefficients
- Protein-ligand binding
- Protein-protein
- Binding permeabilities
- Activation barriers
- Site-directed mutagenesis
- Structural modifications

Lai, J., Ghaemi, Z., Luthey-Schulten, Z., 2017, Biochemistry, 56, 45, 5972–5979 M Soroush Barhaghi, C Luyet, JJ Potoff. Mol. Phys 117 (23-24), 3827-3839







$$\Delta F(A \to B) = -\frac{1}{\beta} \ln \langle \exp(-\beta (U_B - U_A)) \rangle_A \qquad \beta = \frac{1}{k_B T}$$
$$\Delta F(B \to A) = -\frac{1}{\beta} \ln \langle \exp(-\beta (U_A - U_B)) \rangle_B$$

$$\Delta F(A \longrightarrow B) = -\Delta F(B \longrightarrow A)$$



Jorgensen, W. L.; Ravimohan, C. J. Chem. Phys. 1985, 83, 3050-3054 Landau, L. D. Statistical physics, 1938 Zwanzig, R. W. J. Chem. Phys. 1954, 22, 1420-1426

Alchemical free energy calculation: Stratification



Valleau, J. P.; Card, D. N. J. Chem. Phys. 1972, 57, 5457-5462

Chipot, C.; Pohorille, A. Free energy calculations. Theory and applications in chemistry and biology, 2007

Alchemical free energy calculation: Stratification

$$U(\lambda) = \lambda U_B + (1 - \lambda) U_A \qquad \Delta F(A \to B) = -\frac{1}{\beta} \sum_{i=0}^{N-1} \ln \left\{ \exp[-\beta (U(\lambda_{i+1}) - U(\lambda_i))] \right\}_i$$

$$A(\lambda_0 = 0) < \lambda_1 < \dots < \lambda_{N-1} < B(\lambda_N = 1)$$

$$(A \to B) = -\frac{1}{\beta} \sum_{i=0}^{N-1} \ln \left\{ \exp[-\beta (U(\lambda_{i+1}) - U(\lambda_i))] \right\}_i$$

M Soroush Barhaghi, C Luyet, JJ Potoff. Mol. Phys 117 (23-24), 3827-3839

Alchemical free energy calculation: Stratification

$$\Delta F(A \to B) = -\frac{1}{\beta} \sum_{i=0}^{N-1} \ln \langle \exp[-\beta (U(\lambda_{i+1}) - U(\lambda_i))] \rangle_i$$

 $U(\lambda) = \lambda U_B + (1 - \lambda)U_A$

$$\lambda U_B(r_{ij},\lambda) = \lambda_{LJ}\epsilon_{ij} \left[\left(\frac{R_{min}^2}{r_{ij}^2 + \alpha(1-\lambda_{LJ})} \right)^6 - \left(\frac{R_{min}^2}{r_{ij}^2 + \alpha(1-\lambda_{LJ})} \right)^3 \right] + \lambda_{Elect} \frac{q_i q_j}{\epsilon r_{ij}}$$

$$(1-\lambda)U_A(r_{ij},\lambda) = (1-\lambda_{LJ})\epsilon_{ij}\left[\left(\frac{R_{min}^2}{r_{ij}^2+\alpha\lambda_{LJ}}\right)^6 - \left(\frac{R_{min}^2}{r_{ij}^2+\alpha\lambda_{LJ}}\right)^3\right] + (1-\lambda_{Elect})\frac{q_iq_j}{\epsilon r_{ij}}$$

Alchemical free energy calculation: TI



T. Steinbrecher, I. Joung, and D. A. Case, *J. Comput. Chem.* **32** (15), 3253 (2011). J. G. Kirkwood. J. Chem. Phys. 1935, 3, 300-313.

10

Alchemical free energy calculation: Sampling



Jorgensen, W. L.; Ravimohan, C. J. Chem. Phys. 1985, 83, 3050-3054 Pearlman, D. A.; Kollman, P. A. J. Chem. Phys. 1989, 91, 7831-7839 Berendsen, H. J. C. in Renugopalakrishnan, V.; et al. Eds. Proteins, Structure, Dynamics and Design ESCOM, 1991, 384-392

Alchemical free energy calculation: BAR





Maximum-likelihood estimator of the freeenergy change. Guarantees the minimum variance.

Bennett, C. H. J. Comp. Phys. 1976, 22, 245–268. Shirts, M.R., and Chodera, J.D. 2008, J. Chem. Phys. 129, 124105.



Alchemical free energy calculation: Dual-topology



GROUP -0.27 ATOM CI CT3 ATOM HI1 0.09 HA ATOM HI2 HA 0.09 ATOM HI3 HA 0.09 GROUP 1 HI1 HM1 HF2 HF3 ATOM CM CT3 -0.27Т 0.09 ATOM HM1 HA \HF ATOM HM2 0.09 HA CI----CM----CF ATOM HI 0.09 HI\ HA ATOM HF HA 0.09 HI2 HI3 HM2 HF1 GROUP -0.27 ATOM CF CT3 ATOM HF1 HA 0.09 ATOM HF2 HA 0.09 ATOM HF3 HA 0.09 1 BOND CI HI1 CI HI2 CI HI3 ! ethane 1 BOND CF HF1 CF HF2 CF HF3 ! ethane 2 CF СМ BOND CI СМ ! common BOND СМ HM1 СМ HM2 ! common BOND CM ΗI ! ethane 1 BOND CM HF ! ethane 2 ! No patching PATCHING FIRST NONE LAST NONE

ethane -> ethane

* Topology for ethane-to-ethane transformation ! pretend we are CHARMM27_1

0.00

27 1

RESI ZERO

Alchemical free energy calculation: Dual-topology



# FEP PARAMETERS FOR FORWARD		# FEP PARAMETERS FOR BACKWARD					
source	/tools/fep.tcl	source	<pre>/tools/fep.tcl</pre>				
alch	on	alch	on				
alchType	FEP	alchType	FEP				
alchFile	zero.fep	alchFile	zero.fep				
alchCol	B	alchCol	B				
alchOutFile	forward-shift.fepout	alchOutFile	backward-shift.fepout				
alchOutFreq	10	alchOutFreq	10				
alchVdwLambdaEnd	1.0	alchVdwLambdaEnd	1.0				
alchElecLambdaStart	0.5	alchElecLambdaStart	0.5				
alchVdWShiftCoeff	6.0	alchVdWShiftCoeff	6.0				
alchDecouple	yes	alchDecouple	yes				
alchEquilSteps	100	alchEquilSteps	100				
set numSteps	500	set numSteps	500				
runFEP 0.0 1.0 0.0625	\$numSteps	runFEP 1.0 0.0 -0.062	5 \$numSteps				

source	<pre>/tools/fep.tcl</pre>	ATOM	1	CI	ZERO	1	-1.167	0.224	0.034	1.00 -	1.00
		ATOM	2	HI1	ZERO	1	-2.133	-0.414	0.000	1.00 -	1.00
alch alchType alchFile alchCol alchOutFile alchOutFreq	on FEP zero.fep B forward-shift.fepout 10	ATOM	3	HI2	ZERO	1	-1.260	0.824	0.876	1.00 -	1.00
		ATOM	4	HI3	ZERO	1	-1.258	0.825	-0.874	1.00 -	1.00
		ATOM	5	СМ	ZERO	1	0.001	-0.652	-0.002	1.00	0.00
		ATOM	6	HM1	ZERO	1	0.000	-1.313	-0.890	1.00	0.00
		ATOM	7	HM2	ZERO	1	0.005	-1.308	0.889	1.00	0.00
		ATOM	8	ΗI	ZERO	1	1.234	0.192	0.000	1.00 -	1.00
alchVdWShiftCoeff alchDecouple	6.0	ATOM	9	HF	ZERO	1	-1.237	0.190	0.000	1.00	1.00
	yes	ATOM	10	CF	ZERO	1	1.289	0.150	-0.078	1.00	1.00
		ATOM	11	HF1	ZERO	1	2.149	-0.425	-0.001	1.00	1.00
alchEquilSteps	100	АТОМ	12	HF2	ZERO	1	1.256	0.837	-0.893	1.00	1.00
set numSteps	500	ΑΤΟΜ	13	н г 3	ZERO	1	1.131	0.871	0.940	1.00	1.00
		ATOM	14	OH2	TTP3	1	-5 574	-5 971	-9 203	1 00	0 00
		ATOM	15	U1	TTD3	1	-5 545	-5 020	-9 301	1 00	0.00
runFEP 0.0 1.0 0.0625 \$numSteps		AION	10	111	TTT	Ŧ	5.545	5.020	J.JUI	1.00	0.00
		• • •									

$$U_B(r_{ij},\lambda) = \lambda_{LJ}\epsilon_{ij} \left[\left(\frac{R_{min}^2}{r_{ij}^2 + \alpha (1 - \lambda_{LJ})} \right)^6 - \left(\frac{R_{min}^2}{r_{ij}^2 + \alpha (1 - \lambda_{LJ})} \right)^3 \right] + \lambda_{Elect} \frac{q_i q_j}{\epsilon r_{ij}}$$





Alchemical free energy calculation: VMD FEP Analysis



Geometrical free energy calculation: Steered MD simulation

$$E(\mathbf{S},t) = \frac{1}{2}k(t)[\mathbf{S} - \mathbf{S}(t)]^2, \qquad \mathbf{S}(t) = \mathbf{S}_0 + vt$$



$$W = \int_0^t \frac{dE(\boldsymbol{S}, t')}{dt'} dt'$$

$$W = \int_0^t -k(t) [S - S(t)] v dt' + \int_0^t \frac{1}{2} [S - S(t)]^2 \frac{dk(t')}{dt'} dt'$$

 $\Delta F = -\frac{1}{\beta} \ln \langle \exp(-\beta \mathbf{W}) \rangle$

If pulling process is **reversible**, it is possible to obtain free energy surfaces from **repeated non-equilibrium experiments**.

C. Jarzynski, Phys. Rev. Lett. 1997, 78, 2690 C. Jarzynski, Phys. Rev. E, 1997, 56, 5018 A colvar *S* is as a differentiable function of the vector atomic Cartesian coordinates *r*.

Depending on the structure of the system, S(r) is often a function of much fewer arguments than 3*N*, or can be expressed as a combination of such functions

$$\boldsymbol{S}(\boldsymbol{r}) = \boldsymbol{S}(\boldsymbol{r}_1, \boldsymbol{r}_2, \dots, \boldsymbol{r}_N)$$

$$\boldsymbol{S}(\boldsymbol{r}) = S(\boldsymbol{z}^1(\boldsymbol{r}), \boldsymbol{z}^2(\boldsymbol{r}), \dots)$$

Colvars

Collective variables module for molecular simulation programs



A software module for molecular simulation programs, which provides a flexible and highperformance platform for present and future algorithms (**reference article**).

Reference manual:

- LAMMPS version: PDF HTML
- NAMD version: PDF HTML
- VMD version: PDF HTML

These features are contributed to NAMD by Giacomo Fiorin (NIH) and Jérôme Hénin (CNRS, France)

https://colvars.github.io/ https://github.com/Colvars/colvars https://www.ks.uiuc.edu/Research/namd/2.14/ug/node53.html

Geometrical free energy calculation: Collective variables

Component		Biases					
 Scalar distance Distance z Distance xy Polar theta Polar phi Distance inverse Distance pairs Dipole magnitude Angle Dipole angle dihedral Coordinate number Self coordinate number Group coordinate number Hydrogen bond RMSD Orientation angle 	 18. Orientation projection 19. tilt 20. Spin angle 21. gyration 22. inertia 23. Inertia z 24. Eigen vector 25. Alpha dihedrals 26. Alpha angles 27. Dihedral Principle Component Non-scalar Distance vector Distance direction cartesian orientation 	 Thermodynamic Integration 9. Multidimensional histograms Adaptive Biasing Force 10. Probability distribution- sestraints Extended-system Adaptive restraints Biasing Force Metadynamics a. Ensemble-Biased Metadynamics b. Well-tempered metadynamics c. Multiple-walker metadynamics Harmonic restraints: SMD b. Moving restraints: US c. Changing force constant Harmonic wall restraints Adaptive Linear Bias 					





Geometrical free energy calculation: Unbiased simulation



Need to perform: Simulated tempering , parallel tempering , and Hamiltonian replica exchange

Y. Sugita, Y. Okamoto, Chem. Phys. Lett. 314 (1999) 141.
H. Fukunishi, O. Watanabe, S. Takada, J. Chem. Phys. 116 (2002) 9058.

N-acetyl-*N*[′]-methyl-L-alanylamide (NANMA)

E. Marinari, G. Parisi, Europhys. Lett. 19 (1992) 451. U.H.E. Hansmann, Chem. Phys. Lett. 281 (1997) 140.

Geometrical free energy calculation: Biased simulation



Geometrical free energy calculation: Adaptive Biasing Potential

Metadynamics

The bias potential is built as a sum of Gaussian functions centered on the previously visited configurations in the CVs space.

$$F(\mathbf{S}) = -\frac{1}{\beta} \ln N(\mathbf{S}) - E(\mathbf{S}) + C$$

$$\lim_{t\to\infty} E(\mathbf{S},t) = -F(\mathbf{S}) + C$$



Geometrical free energy calculation: Adaptive Biasing Potential

Well-tempered Metadynamics

$$E(\mathbf{S},t) = \sum_{t'=\tau,2\tau,\dots}^{t'

$$F(\mathbf{S}) = -\frac{1}{\beta} \ln N(\mathbf{S}) - E(\mathbf{S}) + C$$

$$\lim_{t\to\infty} E(\mathbf{S},t) = -\frac{T+\Delta T}{\Delta T}F(\mathbf{S})$$$$

movies by Glovanni Bussi

Barducci, G. Bussi, M. Parrinello, Phys. Rev. Lett. 100 (2008) 020603. Viedo by Giovanni Bussi

Barducci, Bussi and

Parrinello

PRL (2008)

Laio and Parrinello,

PNAS (2002)

Geometrical free energy calculation: Adaptive Biasing Force

ABF

$$\Delta F(S) = \int_{s_0}^{s_1} \frac{dF(S)}{dS} dS \qquad \qquad \frac{dF(S)}{dS} = \left\langle \frac{\partial \mathcal{H}}{\partial S} \right\rangle_S \longrightarrow \qquad \begin{array}{l} \text{Ensemble average of an} \\ \text{instantaneous force, acting on} \\ \text{the reaction parameter } S. \end{array}$$

Force acting along *S* Geometric entropic contribution

$$\frac{\partial U}{\partial \mathbf{S}} = \frac{\partial U}{\partial \mathbf{r}} \times \frac{\partial \mathbf{r}}{\partial \mathbf{S}}$$

Need a full set of generalized coordinates!

Geometrical free energy calculation: Adaptive Biasing Force

$$\frac{\partial F(\boldsymbol{S})}{\partial \boldsymbol{S}} = \left\langle \frac{\partial U}{\partial \boldsymbol{S}} - k_B T \frac{\partial \ln|\boldsymbol{J}|}{\partial \boldsymbol{S}} \right\rangle_{\boldsymbol{S}}$$

For an arbitrary vector field w such that $w_i \cdot \nabla S_i \neq 0$

$$\frac{\partial F(\boldsymbol{S})}{\partial \boldsymbol{S}} = \left\langle \nabla U. \frac{\boldsymbol{w}_i}{\boldsymbol{w}_i. \nabla \boldsymbol{S}} - k_B T \nabla. \frac{\boldsymbol{w}_i}{\boldsymbol{w}_i. \nabla \boldsymbol{S}} \right\rangle_{\boldsymbol{S}}$$

If we assume: $w_i \cdot \nabla S_j = \delta_{ij}$

$$\frac{\partial F(\boldsymbol{S})}{\partial \boldsymbol{S}} = \langle \nabla U. \, \boldsymbol{w}_i - k_B T \nabla. \, \boldsymbol{w}_i \rangle_{\boldsymbol{S}}$$

M. J. Ruiz-Montero, D. Frenkel, and J. J. Brey. Mol. Phys., 90:925–941, 1997.
Montero, M. J.; Frenkel, D.; Brey, J. J. Mol. Phys. 1997, 90, 925–941
W. K. den Otter. J. Chem. Phys., 112:7283–7292, 2000.
G. Ciccotti, R. Kapral, and E. Vanden-Eijnden. Chem Phys Chem, 6(9):1809–1814, 2005

PMF between an NaCl ion pair in water



Extended-system ABF

Bias is not applied directly to the collective variable!

Bias is applied to an extended fictitious coordinate (λ) that evolves dynamically according to Newtonian or Langevin dynamics.

$$E^{extended}(\mathbf{S},\lambda) = U(r) + \frac{k}{2}(\mathbf{S}-\lambda)^2$$

$$\sigma = \sqrt{\frac{k_B T}{k}} \qquad \tau = 2\pi \sqrt{\frac{m}{k}}$$

Corrected z-averaged restraint (CZAR) estimator of the free energy

$$\frac{\partial F(S)}{\partial S} = -\frac{1}{\beta} \frac{\partial \ln N(S)}{\partial S} + k(\langle \lambda \rangle_S - S)$$

Free energy tutorials

http://www.ks.uiuc.edu/Training/Tutorials/#freeenergymethods

Jérôme Hénin

November 4, 2014

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Free energy calculations along a reaction coordinate: A tutorial for adaptive biasing force simulations



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In silico alchemy: A tutorial for alchemical free-energy perturbation calculations with NAMD

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Protein:ligand standard binding free energies: A tutorial for alchemical and geometrical transformations



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> String method with swarms of trajectories: A tutorial for free-energy calculations along a minimum-action path



Mikolai Fajer Jérôme Hénin Benoît Roux Christophe Chipot August 19, 2015

Please visit www.ks.uiuc.edu/Training/Tutorials/ to get the latest version of this tutorial, to obtain more tutorials like this one, or to join the tutorial-l@ks.uiuc.edu mailing list for additional help.

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