Have Alchemical Free Energy Simulations Come of Age?

New and Remaining Challenges

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Introduction

History of free energy simulations (FES) - a roller coaster ride





History of free energy simulations (FES) — a roller coaster ride



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Accurate and Reliable Prediction of Relative Ligand Binding Potency in Prospective Drug Discovery by Way of a Modern Free-Energy Calculation Protocol and Force Field

Lengk Wang, Yuge Wu, Yuging Deng, Byungkon Kim, Leo Pienco, Grana Kiala, Camiry Lugyer, Staugheessy Robinson, Jankius K. Dinginer, Jeenny Generato, Duron L. Romerle, Cang Massel, Lennier L. Kingdr, T. Thomas Sherkeensen, Tugi Beumog, Wangaro, Bommi, G. Harder, Waooy Sherman, Mark Benerl, Ran Wetter, Mark Marckal, Leat Fige, Tamir Fand, Teng In, David, Maching-, William L. Jangersen, Back-J. Bener, Brank Marckal, Leat Fige, J.

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 Che this: J. Am. Chem. Soc. 2015; 137, 7, 2695–2703 Publication Date: January 27, 2015 – https://doi.org/10.1021/j.9512751q Copyright & 2015 American Chemical Society

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Journal of the American

Chemical Society

Schroedinger FEP+ (2015)

Have FES become an engineering problem?

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As with much of computational chemistry, commercial approaches grow into the space forged by academic exploration, and highlighted by market opportunity. Schrödinger's contribution³⁵ in 2015 showcased their own internal efforts at 'taming' the calculation of relative free energy calculations (sesentially turning it into an engineering problem). This work served as a clarion call, announcing the availability of a protocol for the turnkey evaluation of relative free energies of binding, and intended for routine use in a drug discovery environment. Now every major vendor of commercial software has their own approach to evaluate relative free energies of binding, via a variety of methodologies (many of which are highlighted in this very volume). It is now harder to find a vendor of commercial modeling software that *does not* offer a free energy

(quoted from a preprint copy on researchgate.net)

Have FES become an engineering problem?



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(quoted from a preprint copy on researchgate.net)

"Although free-energy methods have made a significant impact, they aren't as robust or accurate as we'd like." (Advertisement from OpenEye, 2024)



Part I: What makes (has made) FES so hard?

Self-terms (aka "intraperturbed group contributions")

Definition



Definition



Definition



Self-terms¹ ("intraperturbed group contributions")²: free energy contributions to $\Delta\Delta G$ resulting from energy changes in the group that is mutated (-X \rightarrow -Y)

¹Biochemistry 1991, 30, 3217ff. ²J. Chem. Phys. 1991, 94, 4532ff.

Back-of-the-envelope analysis

- The potential energy function can always be unambigously separated into individual contributions
- However, there is no corresponding (unique) separation at the level of free energy differences
- Free energy contributions from changes in intramolecular terms to a free energy difference depend on the medium/environment (M1/M2). We *cannot* expect cancellation.

System/Method	$\Delta\Delta G_{solv}$ [kcal/mol]
CH ₄ /CH ₃ OH ¹	-7.10 ± 0.63



¹Experimental data from FreeSolv.



J. Phys. Chem. B 2009, 113, 8967ff. Biophys. J. 2013, 104, 453ff.

System/Method	$\Delta\Delta G_{solv}$ [kcal/mol]
CH ₄ /CH ₃ OH ¹	-7.10 ± 0.63
Ala/Ser ²	-2.83 ± 0.24



¹Experimental data from FreeSolv. ²Full td. cycle.



J. Phys. Chem. B 2009, 113, 8967ff. Biophys. J. 2013, 104, 453ff.

$\Delta\Delta G_{solv}$ [kcal/mol]
-7.10 ± 0.63
-2.83 ± 0.24
-5.66 ± 0.08

¹Experimental data from FreeSolv. ²Full td. cycle. ³Excluding "self-terms"





J. Phys. Chem. B 2009, 113, 8967ff. Biophys. J. 2013, 104, 453ff.

• Never ignore/omit legs of a td. cycle!

- Never ignore/omit legs of a td. cycle!
- $\cdot \Rightarrow$ But what if you have contributions that must cancel?
- $\cdot \Rightarrow$ Can one prove that a contribution is identical in both legs of the td. cycle?

 \Rightarrow Single/dual topology, dummy atoms etc.

Example: acetone and its enol tautomer



Example: acetone and its enol tautomer



Example: acetone and its enol tautomer



Example: acetone and its enol tautomer



One needs placeholders – dummy atoms [{r_D}]

Example: acetone and its enol tautomer



One needs placeholders – dummy atoms [{r_D}]

• Should not influence the physical system [{R}]

Example: acetone and its enol tautomer



One needs placeholders – dummy atoms $[{\mathbf{r}_D}]$

- Should not influence the physical system [{R}]
- $[{\mathbf{r}_D}]$ must not contribute to $\Delta\Delta G!$

My secret recipe [HJR1959]

THE JOURNAL OF CHEMICAL PHYSICS VOLUME 31, NUMBER 6 DECEMBER, 1939

Molecular Partition Functions in Terms of Local Properties

DUBLER R. HEISCHNERG,[®] Department of Chemistry, Harword University, Cambridge 88, Massachundts AND HAROLD S. JORNSTON', AND DORALD RARY, Department of Chemistry, University of California, Barkeley 4, California (Received June 17, 1959)

My secret recipe [HJR1959]

THE JOURNAL OF CHEMICAL PHYSICS VOLUME 31, NUMBER 6 DECEMBER, 1939

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DUDLEY R. HERSCHRACH, ⁹ Department of Chemistry, Harstod University, Candridge 38, Massachaudts AND HARGED S. JOUNSTONY AND DONAED RARY, Department of Chemistry, University of California, Backdey 4, California (Received June 17, 1959)

Think about (dummy) atoms in suitable internal coordinates

My secret recipe [HJR1959]

THE JOURNAL OF CHEMICAL PHYSICS VOLUME 31, NUMBER 6 DECEMBER, 1939

Molecular Partition Functions in Terms of Local Properties

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Think about (dummy) atoms in suitable internal coordinates

Atom	Configuration	Coordinates	J.,
a = 1	ł	x, y, z	V
x = 2*	1_2 •	$r_{12},\theta_{wx},\phi_{wx}$	$4\pi r_{12}^2$
x = 3*	2 3	$r_{22}, \phi_{123}, \phi_{123}'$	r ₁₀ 1
	<u>ب</u> م	$r_{10},\phi_{100},\phi_{10}$	$2\pi r_{\rm H}^2 \sin \phi_{\rm HI}$
		$r_{33}, r_{13}, \phi_{0.6}$	$2\pi (r_{10}r_{11}/r_{12})$
x=4	1234	ras, \$200, \$200'	734 ²
	1 2 1 A 4	t_{14}, ϕ_{124}, τ	$r_{24}{}^2 {\rm Sid} \phi_{224}$
	3.	Pau, Prau, Amu	$r_{24}^2/\sin\!\phi_{241}$
		r_{16}, r_{14}, r_{21}	$(r_{1i}r_{1i}/r_{1i}r_{2i})(e_{2i}xe_{2i},e_{2i})^{-1}$
	1º	r_{14},ϕ_{114},θ	$r_{\rm H}^2\cos\theta/\cos\phi_{\rm es}$
	3 2	r_{14}, r_{26}, θ	$r_{11}/[\sin\phi_{141}-(r_{14}\tau,\phi_{14},r_{16})]$ $(\sin\theta$

HERSCHBACH, JOHNSTON, AND RAPP

• Separability:
$$Z \stackrel{?}{=} Z(\{R\}) \times Z(b(\{r_D\}))$$

Dummy atoms 101

- Separability: $Z \stackrel{?}{=} Z(\{R\}) \times Z(b(\{r_D\}))$
- Focus on "junction"



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Dummy atoms 101

- Separability: $Z \stackrel{?}{=} Z(\{R\}) \times Z(b(\{r_D\}))$
- Focus on "junction"



• Avoid needless sampling



Dummy Atoms in Alchemical Free Energy Calculations

Markus Fleck, Marcus Wieder, and Stefan Boresch*

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 Publication Date: June 14, 2021 Nies, Vickorg 10, 2012/es, cite, Col 2028
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"Why was this paper still necessary in 2021?"

Applying [HJR1959]: Restraints in absolute binding free energy calculations

ABFE calculations (double decoupling method)

Need for restraints¹

$$\Delta A_{rest} = -k_B T \ln \frac{Z_{rest}}{8\pi^2 V_0}$$

¹Biophys. J. 1997, 72, 1047ff.

ABFE calculations (double decoupling method)

Need for restraints¹

$$\Delta A_{rest} = -k_B T \ln \frac{Z_{rest}}{8\pi^2 V_0}$$



Using [HJR1959]²: $Z_{rest} \approx$

$$r_{a,A,0}^2 \sin \theta_{A,0} \sin \theta_{B,0} \frac{(2\pi k_B T)^3}{(K_r^\prime K_{\theta_A}^\prime K_{\theta_B}^\prime K_{\phi_B}^\prime K_{\phi_B}^\prime K_{\phi_C}^\prime)^{1/2}}$$

¹Biophys. J. 1997, 72, 1047ff. ²J. Phys. Chem. B 2003, 107, 9535ff.

ABFE calculations (double decoupling method)



The much more complicated expressions by Schroedinger are not necessary³

¹Biophys. J. 1997, 72, 1047ff. ²J. Phys. Chem. B 2003, 107, 9535ff. ³ChemRxiv: 10.26434/chemrxiv-2023-8s9dz-v3, subm. JCIM

Part II: Where do we stand — ongoing challenges

A simple(?) task



$$\delta \Delta G = \Delta G_{solv}^{exp} - \Delta G_{solv}^{calc}$$

Beyond additive force fields \rightarrow QM/MM, ML/MM (ANI-2x/MM¹)



- \cdot indirect cycle
- OpenMM-ML²
- non-equil. switches³

¹10.26434/chemrxiv-2023-8jgjq ²github.com/openmm/openmm-ml ³github.com/wiederm/endstate_correction

Beyond additive force fields \rightarrow QM/MM, ML/MM (ANI-2x/MM¹)



- indirect cycle
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- non-equil. switches³

¹10.26434/chemrxiv-2023-8jgjq ²github.com/openmm/openmm-ml ³github.com/wiederm/endstate_correction



no real improvement

Mechanical embedding

Mechanical embedding

What next?

• Better (=electrostatic) embedding

Mechanical embedding

What next?

- Better (=electrostatic) embedding
- Indirect \rightarrow direct FES?

Mechanical embedding

What next?

- Better (=electrostatic) embedding
- Indirect \rightarrow direct FES?

 \Rightarrow Dummy atoms and end point issues in QM or ML?

Aren't we rushing ahead of ourselves?

Results agree with experiment



(c) S. Tkaczyk



(c) S. Tkaczyk



(c) S. Tkaczyk



The "usual suspects"

- Description of interactions
- Sampling
- System setup / technical issues (change in net charge)
- Errors in carrying out transformations



The "usual suspects"

- Description of interactions
- Sampling
- System setup / technical issues (change in net charge)
- Errors in carrying out transformations

Question(s): Can we distinguish between these?? Are we at least trying? When carrying out FES with today's "usual protocols:"

- flexibility of the free ligand
- flexibility of the binding site / the bound ligand
- \cdot bias from the starting pose



(c) R. Munroe (https://imgs.xkcd.com/comics/dependency.png)

Thank you, etc.

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- Martin Leitgeb,
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- Gerhard König
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- FWF
- NIH

Collaboration

- USF (Lee Woodcock, Fiona Kearns, Phillip Hudson)
- Exscientia, plc.
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TUE EV. POSTER

My thanks and best wishes to the Titans, Trendsetters, and Talispersons!

Thank you! Questions? Consider a ligand/solute L in some medium M (gas phase, aqueous solution, complexed to a receptor, ...)

The ligand L = R - X consists of scaffold R and a functional group X. Thus, we have:

$$\{\mathbf{r}\} = \{\mathbf{r}_{\mathsf{L}}, \mathbf{r}_{\mathsf{M}}\} \qquad \{\mathbf{r}_{\mathsf{L}}\} = \{\mathbf{r}_{\mathsf{R}}, \mathbf{r}_{\mathsf{X}}\}$$

$$U(\{\mathbf{r}\}) = U_{L}(\{\mathbf{r}_{L}\}) + U_{L-M}(\{\mathbf{r}_{L}, \mathbf{r}_{M}\}) + U_{M}(\{\mathbf{r}_{M}\}) =$$

$$= \underbrace{U_{R-R}(\{\mathbf{r}_{R}\}) + U_{R-X}(\{\mathbf{r}_{R}, \mathbf{r}_{X}\}) + U_{X-X}(\{\mathbf{r}_{X}\})}_{U_{L}} +$$

$$+ \underbrace{U_{R-M}(\{\mathbf{r}_{R}, \mathbf{r}_{M}\}) + U_{X-M}(\{\mathbf{r}_{X}, \mathbf{r}_{M}\})}_{U_{L-M}} + U_{M}(\{\mathbf{r}_{M}\})$$

Self terms: a closer look

Let's now consider the mutation



$$\lambda = 0: R-X_0$$
 $\lambda = 1: R-X_1$

and make the potential energy dependent on λ :

$$U(\{\mathbf{r}\}, \lambda) = \underbrace{U_{R \cdot R}(\{\mathbf{r}_{R}\}) + U_{R \cdot X}(\{\mathbf{r}_{R}, \mathbf{r}_{X}\}, \lambda) + U_{X \cdot X}(\{\mathbf{r}_{X}\}, \lambda)}_{U_{L}} + \underbrace{U_{R - M}(\{\mathbf{r}_{R}, \mathbf{r}_{M}\}) + U_{X - M}(\{\mathbf{r}_{X}, \mathbf{r}_{M}\}, \lambda)}_{U_{L \cdot M}} + U_{M}(\{\mathbf{r}_{M}\})$$

TI:
$$\Delta A = A(\lambda = 1) - A(\lambda = 0) = \int_0^1 \left(\frac{dA}{d\lambda}\right) d\lambda = \int_0^1 \left\langle\frac{\partial U(\{\mathbf{r}\}, \lambda)}{\partial \lambda}\right\rangle_\lambda d\lambda$$

Self terms: a closer look

$$\frac{\left\langle \frac{\partial U(\{\mathbf{r}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}}{\left\langle \frac{\partial U_{R,X}(\{\mathbf{r}_{R},\mathbf{r}_{X}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}} + \left\langle \frac{\partial U_{X,X}(\{\mathbf{r}_{X},\mathbf{r}_{X}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}}{\left\langle \frac{\partial U_{X-M}(\{\mathbf{r}_{X},\mathbf{r}_{M}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}} + \left\langle \frac{\partial U_{X-M}(\{\mathbf{r}_{X},\mathbf{r}_{M}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}}{\left\langle \frac{\partial U_{R,X}(\{\mathbf{r}_{X},\mathbf{r}_{M}\},\lambda)}{\partial \lambda} \right\rangle_{\lambda}}$$

But:

$$\left\langle \frac{\partial U_{R,X}(\{\mathbf{r}_{R},\mathbf{r}_{X}\},\lambda)}{\partial\lambda} \right\rangle_{\lambda} = \frac{1}{Z(\lambda)} \int d\{\mathbf{r}_{R}\}d\{\mathbf{r}_{X}\}d\{\mathbf{r}_{M}\}\frac{\partial U_{R,X}(\{\mathbf{r}_{R},\mathbf{r}_{X}\},\lambda)}{\partial\lambda} \times \exp(-\beta U(\{\mathbf{r}_{R},\mathbf{r}_{X},\mathbf{r}_{M}\},\lambda))$$

etc. The integral cannot be separated further. The "self-term" contributions depend on the medium/environment \underline{M} .