Computational Estimation of Energy Parameters for modified Nucleotides

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- Secondary structures can be decomposed into loops formed by adjacent pairs
- A free energy contribution is assigned to each loop

$$E(\mathcal{S}) \approx \sum_{l \in \mathcal{S}} E(l)$$

- 294 independent nearest neighbor parameters included in the Turner NNDB¹
 - From 802 UV melting experiments
- Virtually no energy parameters for modified bases

¹Turner et al., "NNDB: The nearest neighbor parameter database for predicting stability of nucleic acid secondary structure.", 2009, NAR 38, D280–D282

Computational Estimations of Nearest Neighbor Parameters

- Coarse grained models VS Molecular dynamics
 - No solvent
 - Less degrees of freedom
 - Lower computational costs
- Coarse grained models seem to be the best choice
 - Rosetta-RECCES
 - Coarse grained moves
 - Energy calculation at atom level

RECCES² Simulation



- Temperature changes during the simulation
 - To overcome energy barriers and sample the full conformation space
- Energy of each conformation determined by an energy function
 - Combination of Physics- and knowledge-based terms



Simulated tempering ⇔ T=420K T=900K T=9000K WHAM Density of states $Z = \sum e^{-\beta E(s)}$ ΔG ΛH

 $^{^2}$ Chou et al., "Blind tests of RNAnearest-neighbor energy prediction", 2016 Proceedings of the National Academy of Sciences, 113(30), 8430–8435.

Comparison of free energy estimations



- Comparaison to estimations using existing parameters
- Duplex of 3 to 5 base pairs
- "good" correlation
- Systematic error
- Modification dependent
- Rosetta energy function poorly parameterized?
- Water plays a role in the stability of $\Psi \bullet A$ stacks

Molecular dynamics (MD)

- free energies of proteins and their ligands calculated for decades
- studies on nucleic acids rather limited
- including only inosine as modification³
- standard MD based on thermodynamic cycle to calculate the free energies
- impossible to simulate the chemical path
- using alchemical path
 - insert intermediate state $0 = \lambda_1, \lambda_2, ..., 1 = \lambda_n$
 - $\Delta G = \sum_i \Delta G_{i,i-1}$



³Sakuraba et al. "Free-Energy Calculation of Ribonucleic Inosines and Its Application to Nearest-Neighbor Parameters." Journal of Chemical Theory and Computation 16.9 (2020): 5923-5935.

Transformato⁴

- OpenMM as underlying MD programm
- Input files created by CHARMM-GUI
- Identify the maximum common substructure
- Construction of an alchemical path
 - Atoms not belonging to the common substructure are mutated to dummy atoms
 - Over a certain amount of steps the interactions of the dummy atoms are turned off
- Free energy difference to the common core calculated with Multistate Bennett Acceptance Ratio (MBAR)



⁴Karwounopoulos et al. "Relative binding free energy calculations with transformato: A molecular dynamics engine-independent tool." Frontiers in Molecular Biosciences 9 (2022)

G-C to IC and U-A to $\Psi\text{-A}$ at 1M NaCl



$\Delta\Delta G$ MD VS. RECCES

Duplex	MD	std	RECCES	Turner
5'CAICG 3'GUCGC	2.28	0.21	1.31	2.04
5'GCAICGC 3'CGUCGCG	2.04	0.27	1.79	2.04
5'GAAGA <mark>I</mark> GCAA 3'CUUCUCCGUU	1.88	0.44	2.05	1.73
5'GAAGAICCAA 3'CUUCUCGGUU	2.03	0.49	1.80	2.04
5'GGGCUCA <mark>I</mark> GCAGCCG 3'CCCGAGUCCGUCGGC	2.68	0.18		1.54
5'CGG <mark>P</mark> UCG 3'GCCAAGC	0.87	0.92	0.89	-2.86
5'GGGCAGG <mark>P</mark> UCGCGCC 3'CCCGUCCAAGCGCGG	-0.28	2.36		-2.86

Conclusion and Outlooks

- Rosetta-RECCES
 - Good predictions for WC, $G \bullet U$, and $I \bullet C$ base pairs
 - Systematic deviation for other modifications ($\Psi \bullet A$, $m^6 A \bullet U$)
- Molecular Dynamics
 - Framework still need some adaptations
 - Promising results with $I \bullet C$ base pairs
 - Use of different salt concentrations
- A combination of methods involving MD, RECCES, and experiments may represent the most suitable way
- Starting computations for a full set of stack pairs containing modifications
- Include larger loops

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Thank you for your attention







Comparison of free energy estimations

Canonical base pairs



- All simulated duplexes from both methods (2 to 5 BP)
- Average offset = 6.18
- linear fit: $y = 1.06 \cdot x + 6.92$
- Corr. coeff. = 0.95
- High correlation
- Slope of the linear fit near 1
- Both models are separated by \approx only a constant
- \Rightarrow This good concordance is reflected in the accurate parameter estimations for canonical base pairs

Comparison of free energy estimations





 $\Psi \bullet A$ Average offset = 4.11 linear fit: $y = 1.08 \cdot x + 5.05$ corr. coeff. = 0.87



 $I \bullet U$ Average offset = 6.59 linear fit: $y = 1.12 \cdot x + 7.97$ corr. coeff. = 0.87

 $m^6 A \bullet U$ Average offset = 2.62 linear fit: $y = 1.04 \cdot x + 2.97$ corr. coeff. = 0.80

High Resolution Melting (HRM) experiments ⁵

- Measures fluorescence as a function of temperature
- Derivation of thermodynamic parameters
- Good agreement with UV-melting if $T_m > 40^{\circ}C$

Is this a suitable alternative to UV-melting?

- Measurements for I C pairs in Jantsch Lab:
 - Oligos of 10 base pairs
 - NaCl concentrations 0mM, 150mM, 1000mM
 - Oligo concentration $0.5 \mu M$
 - Melting from 10 $85^\circ C$ in $0.5^\circ C$ steps
 - 3 replicates

⁵Wang et al. 2016, "Assessment for Melting Temperature Measurement of Nucleic Acid by HRM", Journal of Analytical Methods in Chemistry

Melting Data Analysis



• $A + B \rightleftharpoons AB$ with $2[AB] + [A] + [B] = c_o$

- $K_a = \frac{[AB]}{[A][B]} = \frac{2\theta}{c_o(1-\theta)^2}$
- $\theta(T_m) = 0.5$

Melting Data Analysis



• Use F(T) at low and high temperatures to estimate L_1 and L_2

• $F(T) = L_2(T) \cdot \theta(T) + L_1(T) \cdot (1 - \theta(T))$

Melting Data Analysis



What about ΔG_{37} , ΔH , and ΔS ?

Van't Hoff Analysis



Curve fitting



- formulate $\theta(T)$ as function of T, ΔH and ΔS using $\Delta G = \Delta H T\Delta S = -RT \ln K_a$ and $K_a = \frac{2\theta}{c_o(1-\theta)^2}$
- fit full function $F(T) = L_2(T) \cdot \theta(T) + L_1(T) \cdot (1 \theta(T))$