RNA dynamics using molecular modeling and experimental data

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RNA



$DNA \rightarrow RNA \rightarrow proteins$

(central dogma of molecular biology)

RNA



DNA DNA \rightarrow RNA DNA \rightarrow RNA \rightarrow proteins



http://ocw.mit.edu/courses/biology/

7-345-non-coding-rnas-junk-or-critical-regulators-in-health-and-disease-spring-2012/

RNA Structure ...



RNA Structure ...



... and function

Coding RNAs: function depends mostly on ID* Non-coding RNAs: function depends on ID, 2D, and 3D[%] <u>Dynamics</u> is often fundamental^{\$}

*and at least partly on 2D, Faure et al, NAR (2016); Langdon et al, Science (2018) %ribosomes, ribozymes, riboswitches,... \$binding with proteins/ligands/ions, catalysis, etc

Molecular dynamics

$$E_{\text{total}} = \sum_{\text{bonds}} k_{\text{b}} \left(\ell - \ell_0 \right)^2 + \sum_{\text{angles}} k_a \left(\theta - \theta_0 \right)^2$$
$$+ \sum_{\text{torsions}} \frac{1}{2} V_n [1 + \cos(n\omega - \gamma)]^2$$
$$+ \sum_{j=1}^{N-1} \sum_{i=j+1}^N \left\{ \varepsilon_{i,j} \left[\left(\frac{r_{0ij}}{r_{ij}} \right)^{12} - 2 \left(\frac{r_{0ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi \varepsilon_0 r_{ij}} \right\}$$

Empirical force field*:

- Chemically motivated interactions
- Atomistic details
- Explicit water and ions
- No polarization
- No chemical reactivity

Approx ~20-200 ns/day

*AMBER (ff99+parmbsc0+ChiOL3+TIP3P)





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High (unlimited) time and space resolution

Access to dynamics

(Relatively) cheap



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Short timescales

Force-field inaccuracies

lt's just a model

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Short timescales

Force-field inaccuracies

lt's just a model

In science, as in life, it is very dangerous to fall in love with beautiful models

V.J. Pande

RNA timescales



Sponer, Bussi, et al, Chem Rev (2018)

RNA timescales



Issues with force fields



Condon et al, JCTC (2015) Bergonzo et al, RNA (2015)

Kuhrova et al, JCTC (2016) Bottaro et al, JPCL (2016)

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Issues with force fields



Bergonzo et al, RNA (2015)

Ruhrova et al, JCTC (2016) Bottaro et al, JPCL (2016)

Solution-phase experiments

<u>NMR</u>

- Proton distances, angles, etc
- Many different techniques
- Standard forward models*





Chemical probing

- Identify reactive nucleotides
- Different probes (e.g. DMS/CMCT/SHAPE)
- Non-standard forward models**

*i.e. "formula to compute experiment from structure" (e.g. Karplus formulas for J_c) **usually reactive nucleotides are interpreted as "non WC paired" (pictures from Podbevsek et al, Sci Rep 2018)

Solution-phase experiments



• Non-standard forward models**

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Agenda

- Combine experiment (NMR) and MD
- enforce averages*
- dynamics of a RNA hairpin[%]



- RNA (and DNA) unzipping dynamics[&]
- Go model
- Helicase mediated unwinding
- Experimental validation



*Cesari, Reisser, and Bussi, Computation (2018) *Podbevsek et al, Sci. Rep. (2018); Reisser et al, NAR (2020) *Colizzi et al, PNAS (2019)

Enforce expected value (underdetermined)

 $\langle f \rangle = \sum P(x)f(x) = f_{data}$

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$$\langle f \rangle = \sum_{x} P(x) f(x) = f_{data}$$

P(r)

Entropy*
$$S[P] = -\sum_{x} P(x) \log \frac{T(x)}{Q(x)}$$

P=posterior Q=prior

Jaynes Proc IEEE (1982) Chodera and Pitera, JCTC (2014) Cesari, Reisser, Bussi, Computation (2018) *Entropy measures "how much extra information is needed" besides Q(x)

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$$\langle f \rangle = \sum_{x} P(x) f(x) = f_{data}$$

P(r)

D-Destavion

Entropy*

$$S[P] = -\sum_{x} P(x) \log \frac{T(x)}{Q(x)}$$
Q=prior
MaxEnt

$$\frac{\delta S}{\delta P(x)} = 0 \longrightarrow \frac{P(x) \propto Q(x)e^{-\lambda f(x)}}{U' = U + \lambda k_B T f(x)}$$

Jaynes Proc IEEE (1982) Chodera and Pitera, JCTC (2014) Cesari, Reisser, Bussi, Computation (2018) *Entropy measures "how much extra information is needed" besides Q(x)



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Comments on MaxEnt



observed quantity

Very good prior required (when compared with harmonic restraint)

Much information from prior is retained



WWW. PHDCOMICS. COM

see Bonomiser and "Maximum Parsimony" methods

LABEL=resA

MACIANO

ERROR TYPE=LAPLACE

ARG=j1,j2,jA3,j4,j5,jA6, KAPPA=0.001,0.001,0.001, TAU=3.0,3.0,3.0,3.0,3.0,

Comments on MaxEnt



Comments on MaxEnt



SISSA

SINE B2 elements



Solution data (hairpin)







%Podbevsek, et al Sci. Rep. (2018)

A posteriori reweighting

Run a long MD from NMR structure (just dynamics close to native)

Several NOEs are violated

Reweight to enforce NOE signals



Podbevsek, et al Sci. Rep. (2018)

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Podbevsek, et al Sci. Rep. (2018)

A posteriori reweighting



Podbevsek, et al Sci. Rep. (2018)

Enhanced sampling on SINE hairpin

8 Replicas (RECT*)

Accelerated degrees of freedom: χ14-16 and coordination numbers 14-16

MaxEnt for 125 NOEs throughout the whole hairpin



*Gil-Ley and Bussi, JCTC (2015) Reisser et al, NAR (2020)

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Kish's sample size ~ 0.7

Clustering



Annotated and plotted with Barnaba, Bottaro et al, RNA (2019) (pip install barnaba)

Clustering

Clusters are <u>homogeneous</u> (low eRMSD* and same X-pattern) thanks to an ad-hoc (expensive) clustering method based on maximum cliques@

See-González-Alemán et al, JCIM (2020) for a quality-threshold clustering[&] with similar properties and for a comparison with the popular "GROMOS" method^{\$}



*Bottaro et al, NAR (2014) @Reisser et al, NAR (2020) &Heyer et al, Genome Res (1999) \$Daura et al, ACIE (1999)

Annotated and plotted with Barnaba, Bottaro et al, RNA (2019) (pip install barnaba)

Select the smallest number of conformational clusters that can explain exp data

 $\langle f_{NOE}(d_i) \rangle_{\text{set}} = \sum_{i=1}^{Y} w'_y \langle f_{NOE}(d_i) \rangle_y$ $y \in \text{set}$ $D_{KL}(w'_y||P_y) = \sum_{y \in \text{set}} w'_y \ln \frac{w'_y}{P_y}$ OCCAM'S RAZOR "WHEN FACED WITH TWO POSSIBLE EXPLANATIONS, THE SIMPLER OF THE TWO IS THE ONE MOST

LIKELY TO BE TRUE."

%Podbevsek, et al Sci. Rep. (2018) Reisser et al, NAR (2020)

Select the smallest number of conformational clusters that can explain exp data $D_{KL}=1.71$





OCCAM'S RAZOR

"WHEN FACED WITH TWO POSSIBLE EXPLANATIONS, THE SIMPLER OF THE TWO IS THE ONE MOST LIKELY TO BE TRUE."



Reisser et al, NAR (2020)





plumed.org/masterclass

Zoom lectures with a limited number of participants

Dedicated Slack workspace

Deadline Nov 18, 2020

Class 🔻	Торіс 🗘	Lecture I 🛛 🌩	Lecture II 🛛 🔶	Instructor 🕆
21.VII	Performance optimization	April 26, 2021	May 3, 2021	M. Bonomi
21.VI	Dimensionality reduction	April 12, 2021	April 19, 2021	G. Tribello
21.V	Replica exchange methods	March 15, 2021	March 22, 2021	G. Bussi
21.IV	Metadynamics	March 1, 2021	March 8, 2021	M. Bonomi
21.111	Umbrella sampling	February 15, 2021	February 22, 2021	G. Bussi
21.II	Statistical errors in MD	February 1, 2021	February 8, 2021	G. Tribello
21.1	PLUMED syntax and analysis	January 18, 2021	January 25, 2021	M. Bonomi



PLUMED-NEST

The public repository of the PLUMED consortium



- Repository of the data needed to reproduce PLUMED-enhanced simulations
- PLUMED input files tested for compatibility with current version of the code
- Hyperlinks to PLUMED documentation to learn from real-life examples
- Promote scientific reproducibility create educational material
- 110 eggs in the nest as of today



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Project ID: plumID:19.072 Source: plumed.0.dat Originally used with PLUMED version: 2.4 Stable: raw zipped stdout - stderr Master: raw zipped stdout - stderr

RESTART INCLUDE FILE=cv.dat INCLUDE FILE=plu_maxent_NOE_RECT.dat

""""""" #### Metadynamics ###############################

Ho

- Reposito
- PLUMED

METAD ARG=c77 SIGMA=0.25 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=-pi GRID_MAX=pi METAD ARG=c78 SIGMA=0.25 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=-pi GRID_MAX=pi METAD ARG=c79 SIGMA=0.25 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=-pi GRID_MAX=pi METAD ARG=co77 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID MIN=0 GRID MAX=30 F METAD ARG=co78 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID MIN=0 GRID MAX=30 F METAD ARG=co79 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID MIN=0 GRID MAX=30 F

- Hyperlin
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Project ID: plumID:19.072

METAD

This is part of the bias module

Used to performed metadynamics on one or more collective variables.

In a metadynamics simulations a history dependent bias composed of intermittently added Gaussian functions is added to the potential [64].

$$V(\vec{s}, t) = \sum_{k\tau < t} W(k\tau) \exp\left(-\sum_{i=1}^{d} \frac{(s_i - s_i^{(0)}(k\tau))^2}{2\sigma_i^2}\right)$$

This potential forces the system away from the kinetic traps in the potential energy surface and out into the unexplored parts of the energy landscape. Information on the Gaussian functions from which this potential is composed is output to a file called HILLS, which is used both PLUMFED METAD ARG=co78 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=0 GRID_MAX=30 File

- PLUMED METAD ARG=co78 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=0 GRID_MAX=30 F METAD ARG=co79 SIGMA=0.05 HEIGHT=0 PACE=500 BIASFACTOR=1.001 TEMP=300 GRID_MIN=0 GRID_MAX=30 F
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Fields marked with "*" are optional

plumID	new (plumID to be assigned) 🜲		
Project name			
URL			
PLUMED input files*	examples: colvar.dat, bias.dat,		
Category	bio 🜲		
Keywords	examples: metadynamics, RNA, protein folding, small mo		
Instructions	Please explain how to use the deposited input files and provide a list of other software used (i.e. GROMACS) along with the specific version (i.e. 2018.6)		
PLUMED version	examples: 2.4, 2.5-dev		
Contributor			
Publication	examples: 10.1016/j.cpc.2013.09.018, unpublished		
Contact			
Contact email			
· · · *			

Home

RNA (and DNA) unzipping



Preferential path?

Terminal asymmetry? (3'-5')

Sequence dependence? (GC-CG)

RNA (and DNA) unzipping



<u>Unzipping</u> is ubiquitously required in RNA metabolism (transcription, translation, etc) *In vivo*: helicases*

Structure-based model



RNA (A-helix) vs DNA (B-helix)



relative stability of dangling intermediates (kcal/mol)

RNA: preference for 3' stacking (consistent with explicit solvent MD) DNA: sequence dependent

Colizzi et al, PNAS (2019) Results are consistent with atomistic MD, Colizzi and Bussi, JACS (2012)

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Helix "unwindability"



- Proportional to "inverse of average waiting time"
- Depends on the unwinding direction

Experimental validation on DNA



VS



First check thermal stability



VS



First check thermal stability



Experiments: efficiency



Processivity is higher when displaced strand is pyrimidine rich

Valid on the 3 tested helicases! 1/8 prob to get this by chance :-)



Conditions (n=3 repetitions): 50nM dsDNA 500nM helicase ImM MgCl2 0.Img/mL BSA Addition of ImM ATP

Speculation: helicase directionality



<u>RNA helicases always process 3'⇒5'</u> <u>DNA helicases exist for both directions</u>

Speculation: helicase directionality



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Acknowledgements

Mattia Bernetti Nicola Calonaci Thorben Frohelking Valerio Piomponi

<u>Sabine Reißer</u> (now at MDC, Berlin) <u>Francesco Colizzi</u> (now at IRB, Barcelona)

Carlos Penedo C. Perez-Gonzalez Remi Fritzen Malcom F White (St Andrews, UK)

Koby Levy (Weizmann, Israel)





Silvia Zucchelli (SISSA+Uni Novara)† Stefano Gustincich (IIT Genova)