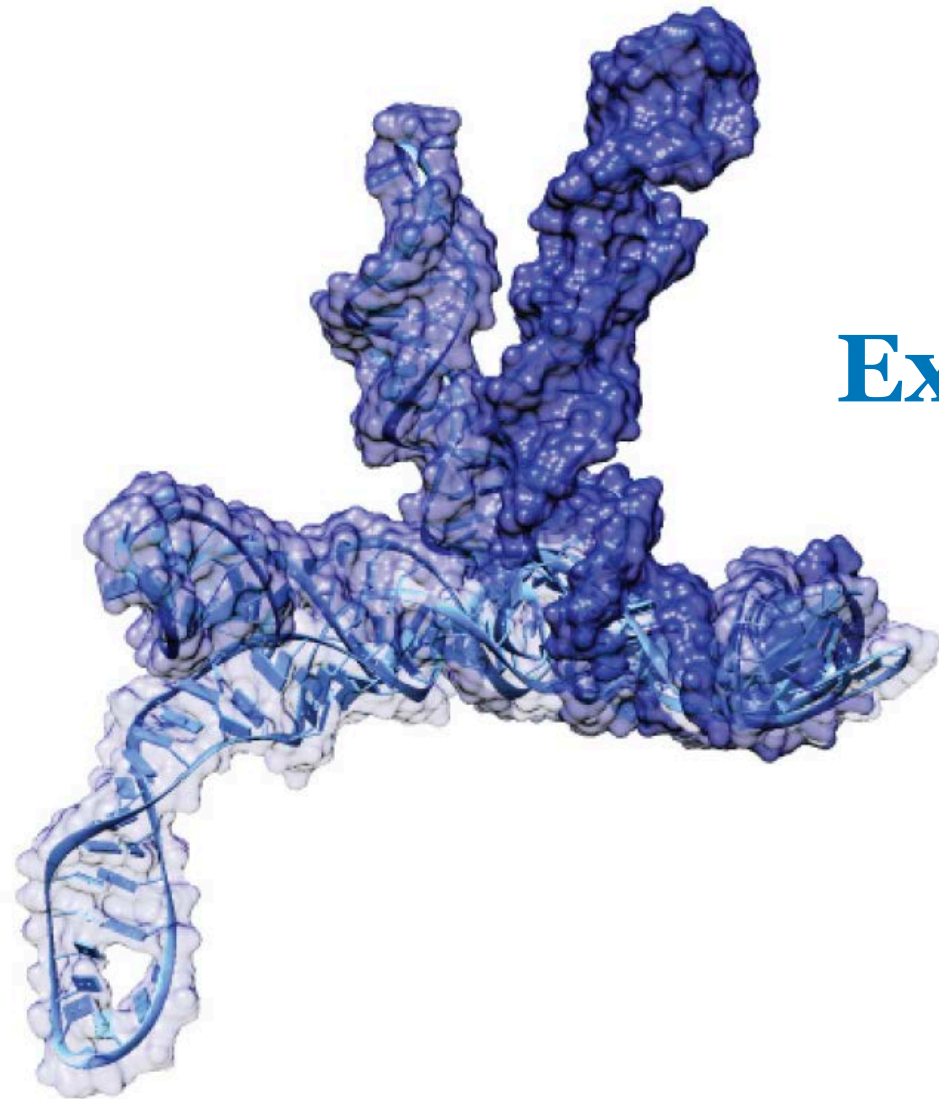




Université  
Paris Cité



# Exploring RNA energy landscapes

**Samuela Pasquali**

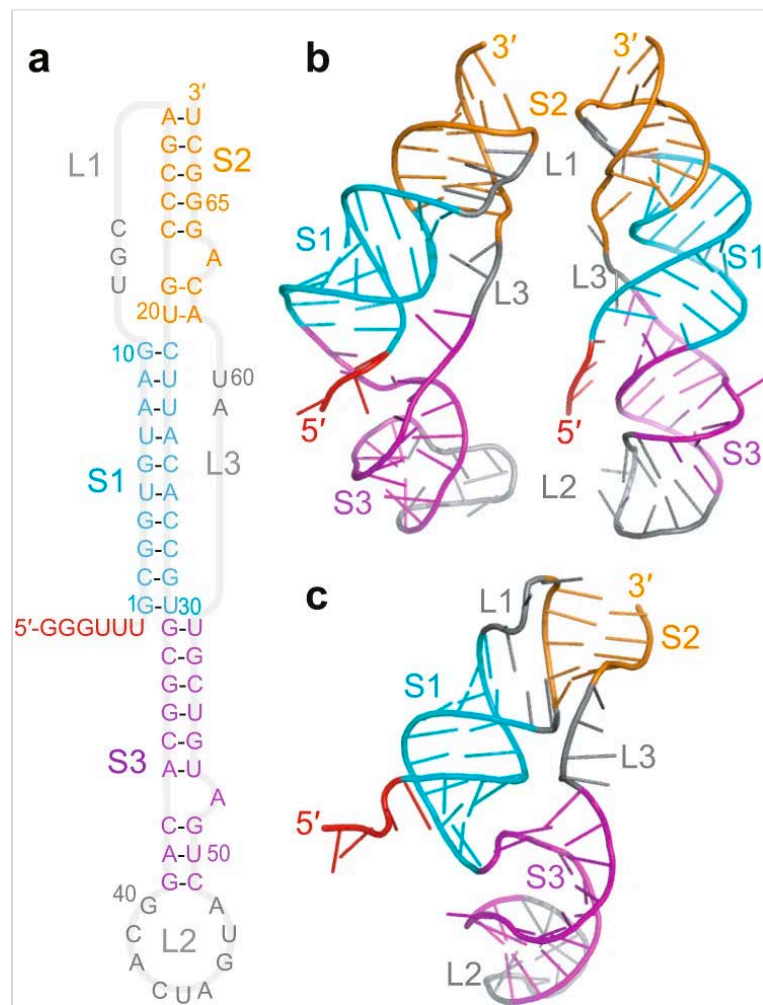
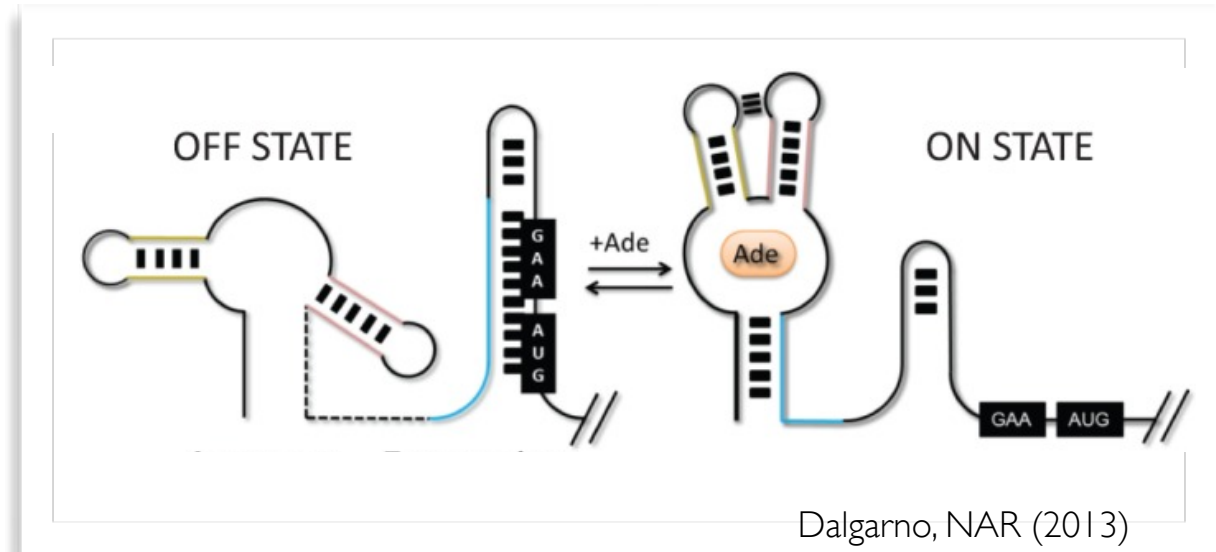
**Physics Professor**

Laboratoire Biologie Fonctionnelle et Adaptative,  
Molecular modeling and drug design team  
School of Pharmacy and School of Science

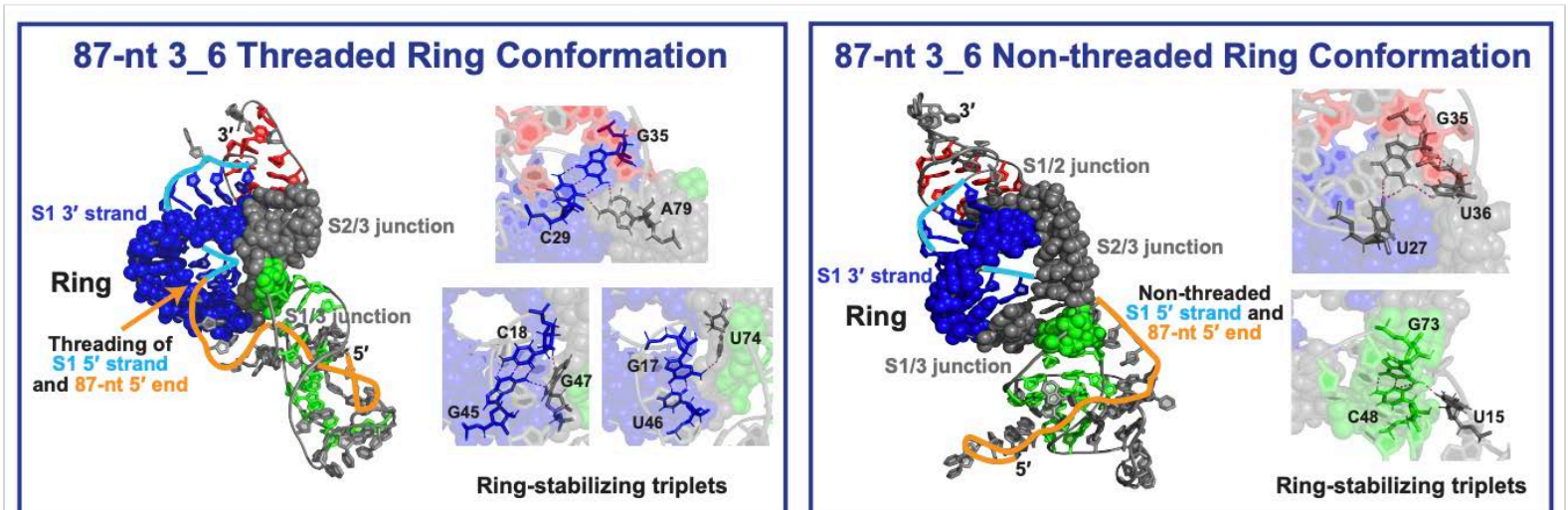
# Structural Polymorphism

A given sequence can adopt multiple alternative structures, not just flexibility

Large scale rearrangements

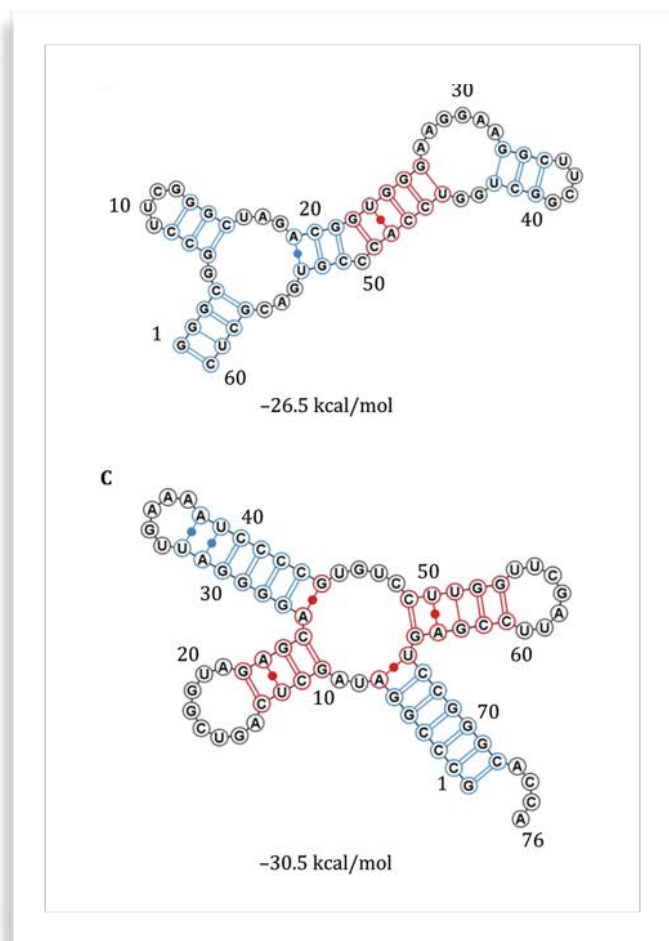


Woodside, Nature Comm (2021)



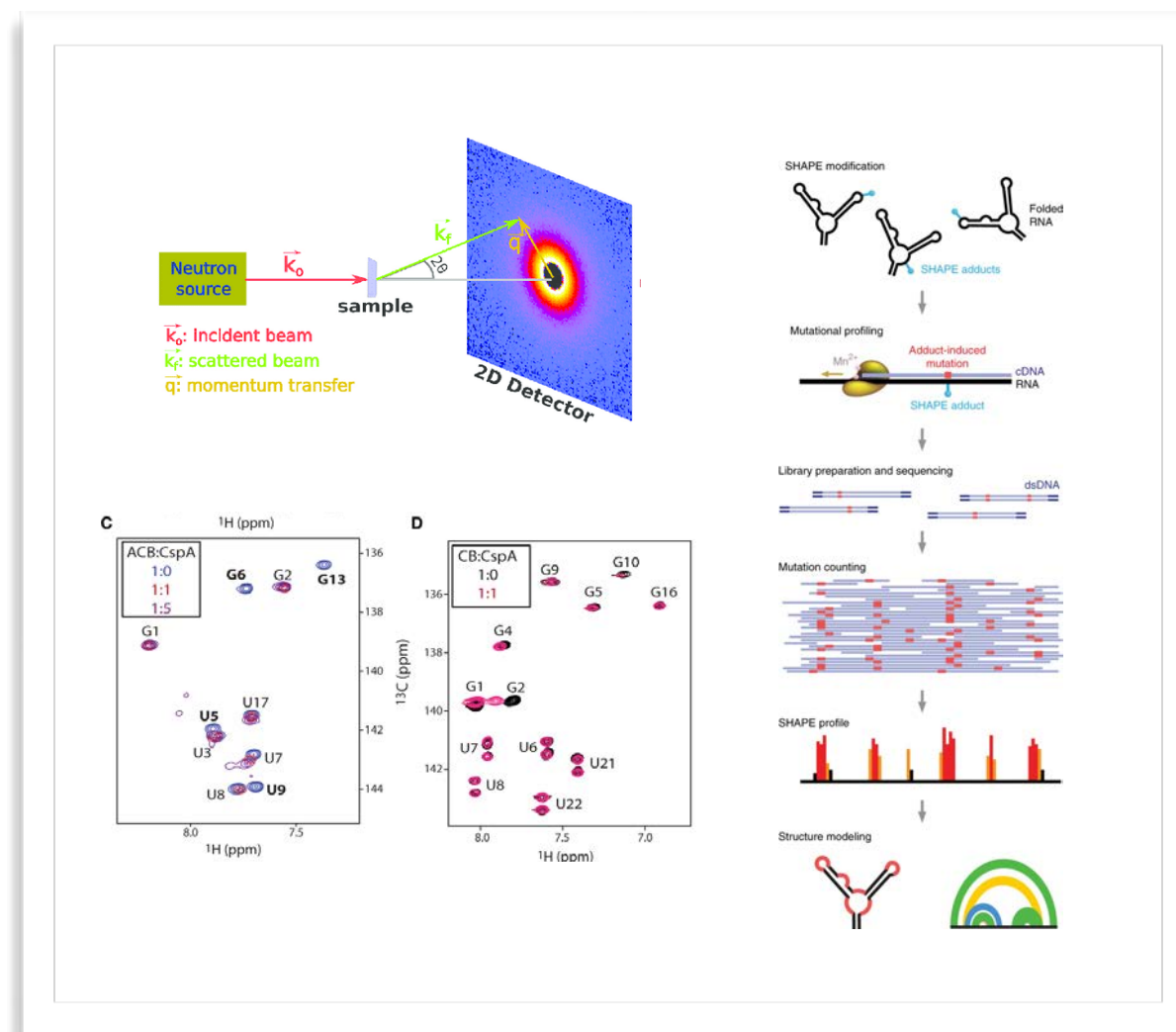
Schlick, Nature Comm (2022)

# Role of modeling



Ensembles of 2D structures  
canonical BP  
~ pseudoknots

←→  
**gap to be filled by  
physical modeling**



Ensembles of 3D dynamical structures  
sensitive to their environment  
More or less indirect hints at the 3D structure

## 3D structures

**dynamics, thermodynamics, influence of the environment**





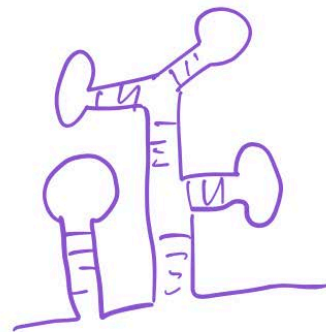
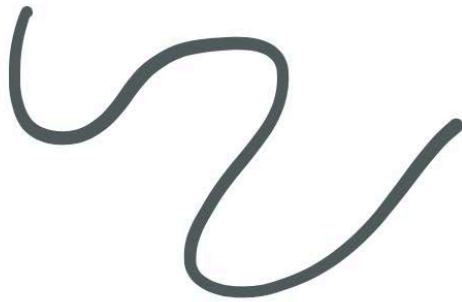
# Modeling



this is not a cow



this is not a cow either



**Real life is messy**  
**Pragmatic and greedy approach**

Use multiple models at different resolutions

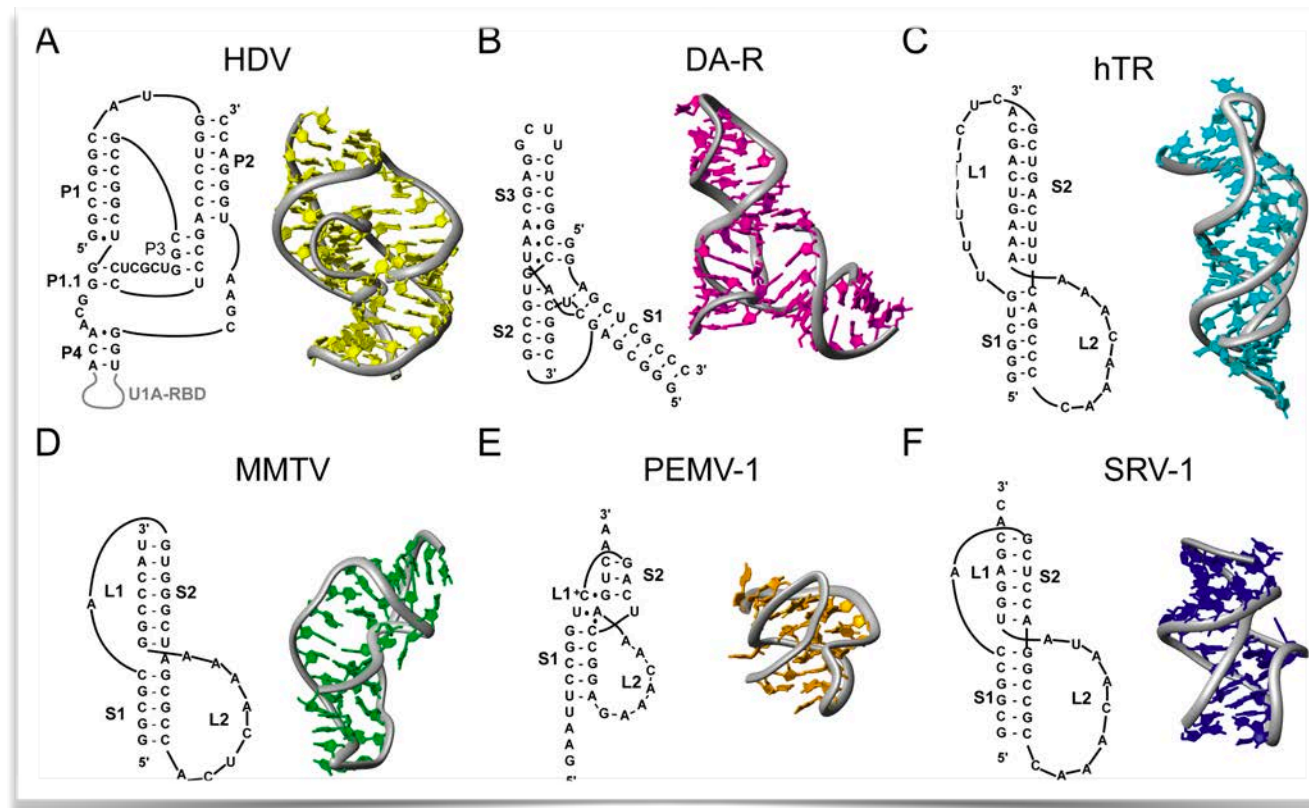
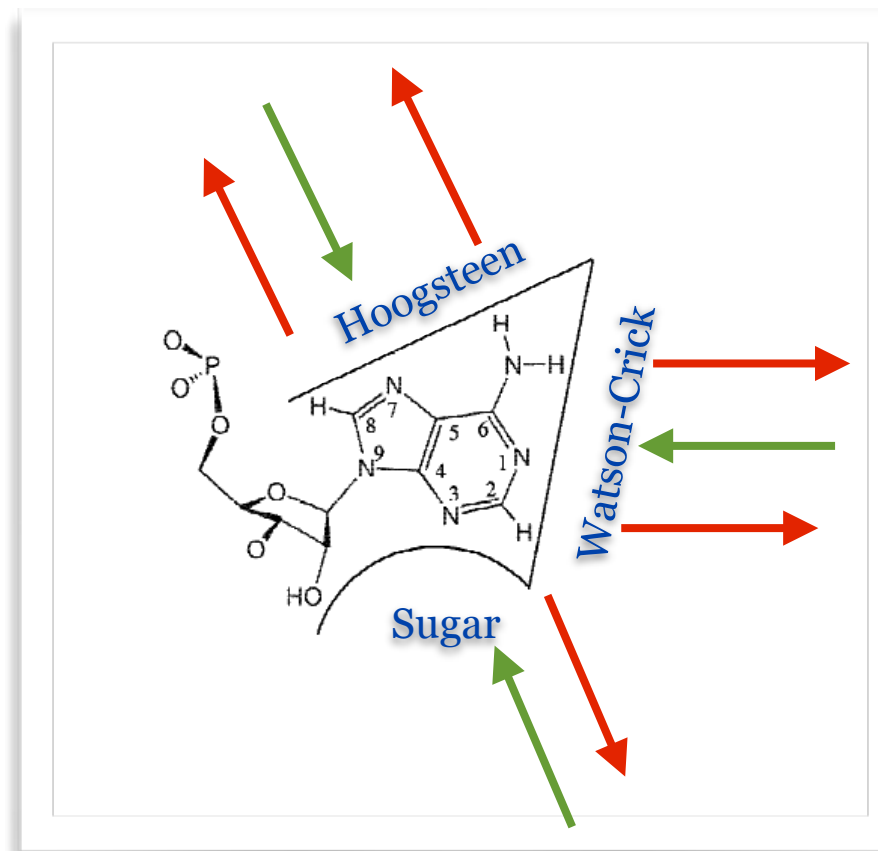
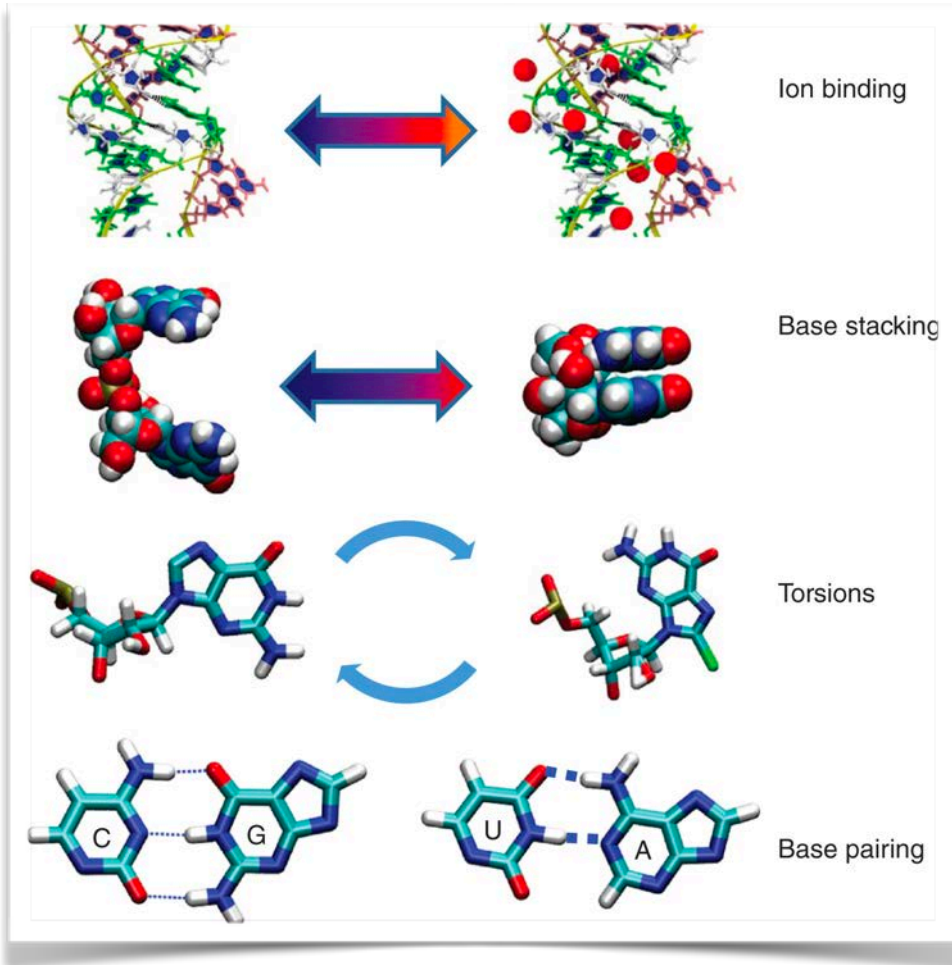
Use different sampling methods

Mix and match

Talk to experimentalists!

Make the model as close as possible to experiments

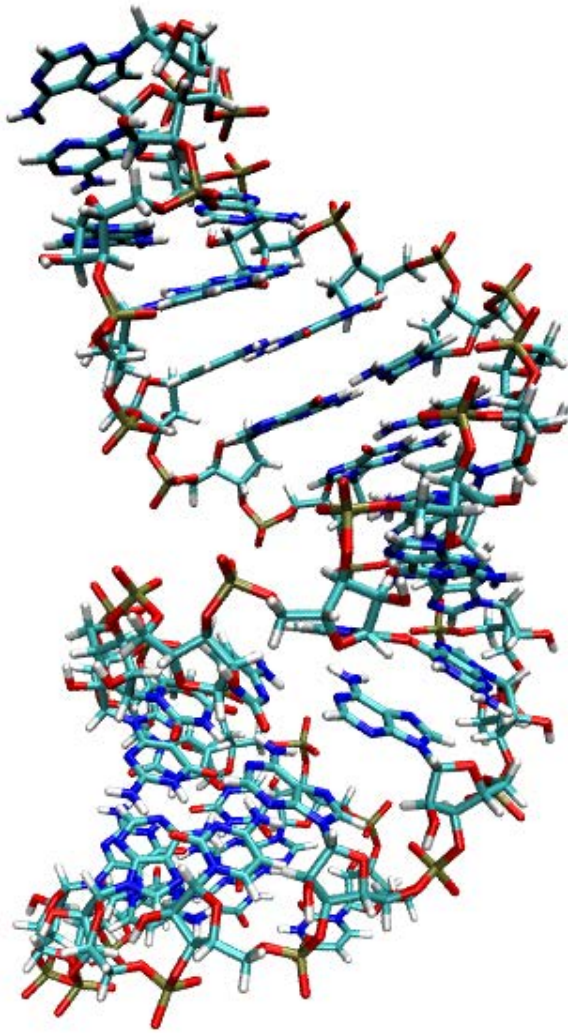
# RNA structural features



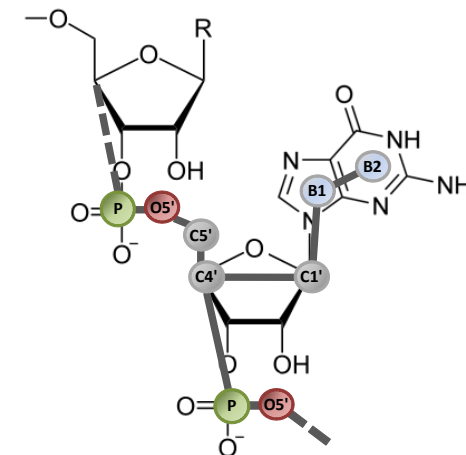
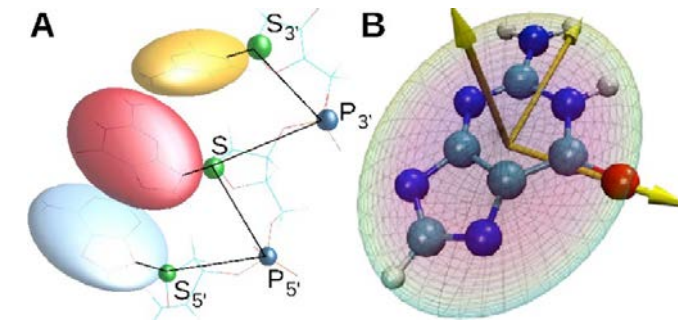
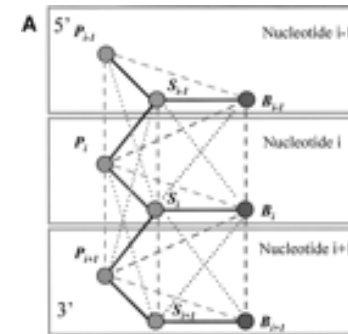
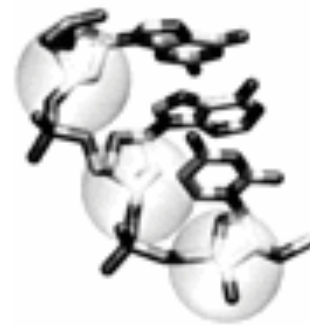
# Physical modeling (how dirty do you want to get?)

## Atomistic description (explicit or implicit solvent)

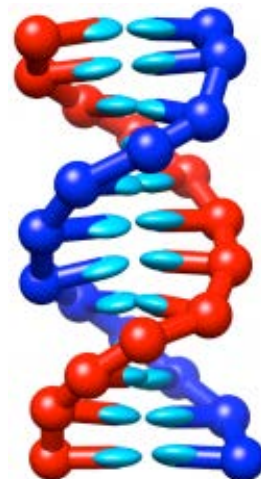
$$V(r^N) = \sum_{\text{bonds}} k_b(l - l_0)^2 + \sum_{\text{angles}} k_a(\theta - \theta_0)^2$$
$$+ \sum_{\text{torsions}} \sum_n \frac{1}{2} V_n [1 + \cos(n\omega - \gamma)] + \sum_{j=1}^{N-1} \sum_{i=j+1}^N f_{ij} \left\{ \epsilon_{ij} \left[ \left( \frac{r_{0ij}}{r_{ij}} \right)^{12} - 2 \left( \frac{r_{0ij}}{r_{ij}} \right)^6 \right] + \frac{q_i q_j}{4\pi\epsilon_0 r_{ij}} \right\}$$



## Coarse-graining



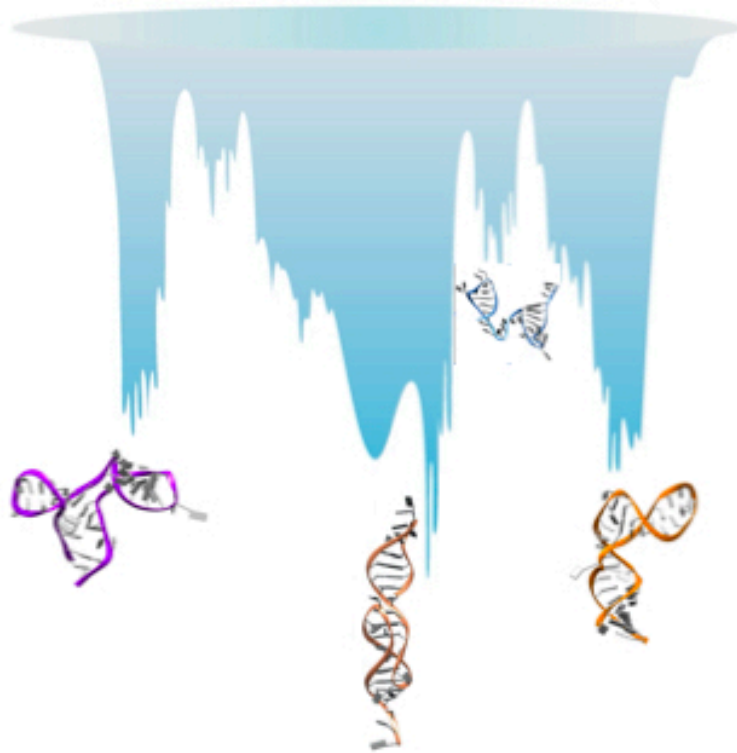
and more...



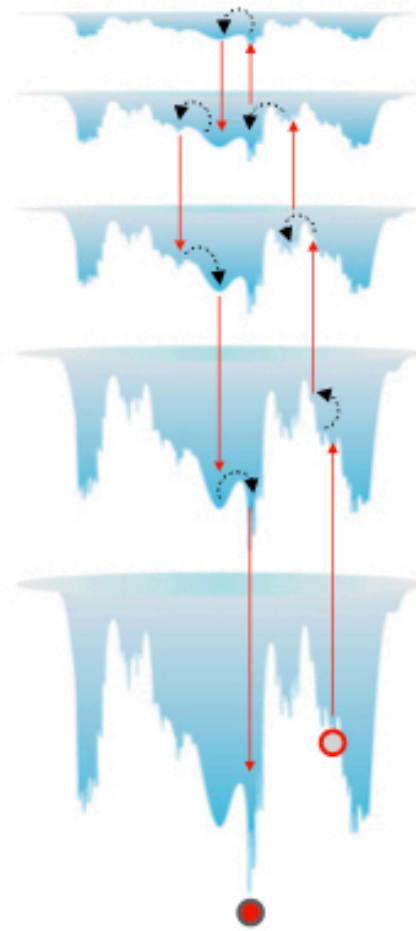


# Use whatever works!

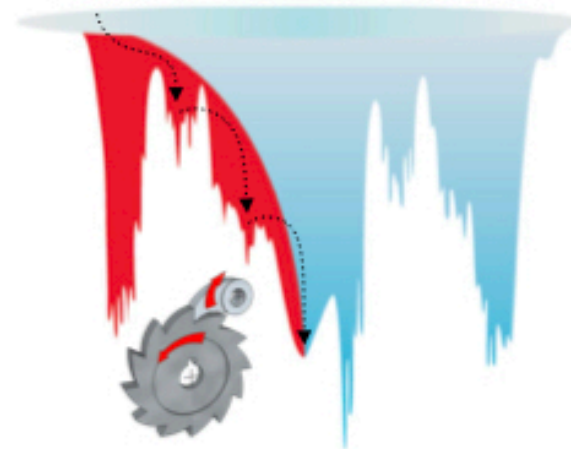
i.e. No method is perfect but if you combine more than one you might have a chance to get things right



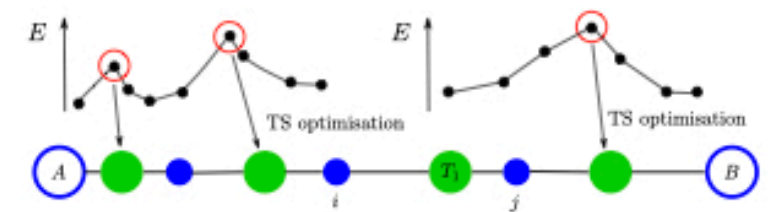
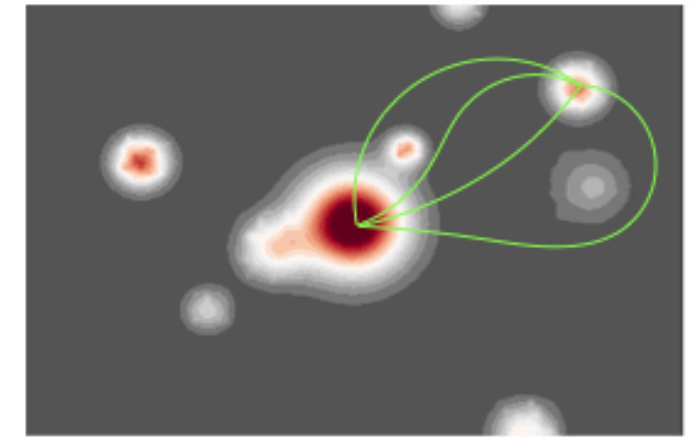
A) Hamiltonian Replica Exchange



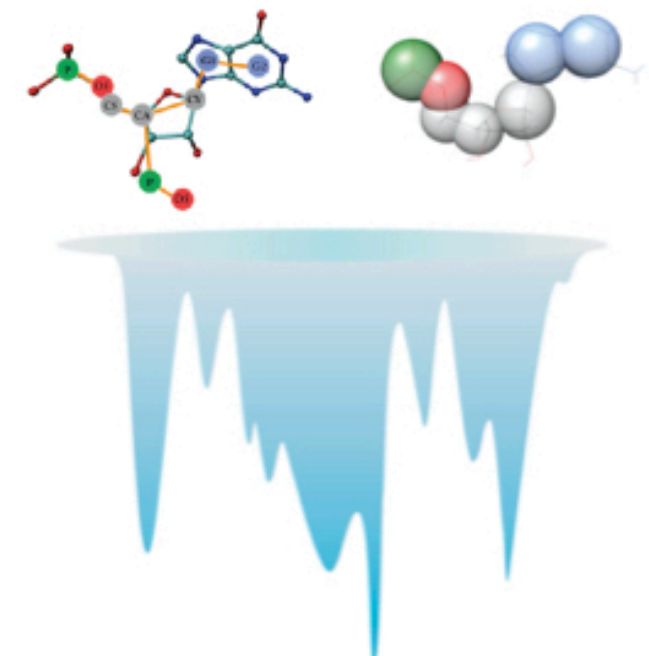
B) Ratchet-and-pawl biased dynamics



C) Path-sampling simulations



D) Coarse-grained models



# Ups and downs

## H-REX

- ✓ Full Solvation  
Only solute is affected by the energy rescaling  
Use standard force fields
- ✗ Need multiple copies of the system (~30)  
Can deal only with small systems (~few dozens nt)

## DPS

- ✓ Sample widely the conformational space  
Allows to define “families” of structures (basins)  
Allow to obtain kinetic data
- ✗ Implicit solvent  
Can deal only with small systems (~few dozens nt)  
Hard time with entropy

## rMD

- ✓ Full Solvation  
Use standard force fields  
Good statistics on folding trajectories
- ✗ Knowledge of native state required  
Cannot study alternative foldings in a single MD

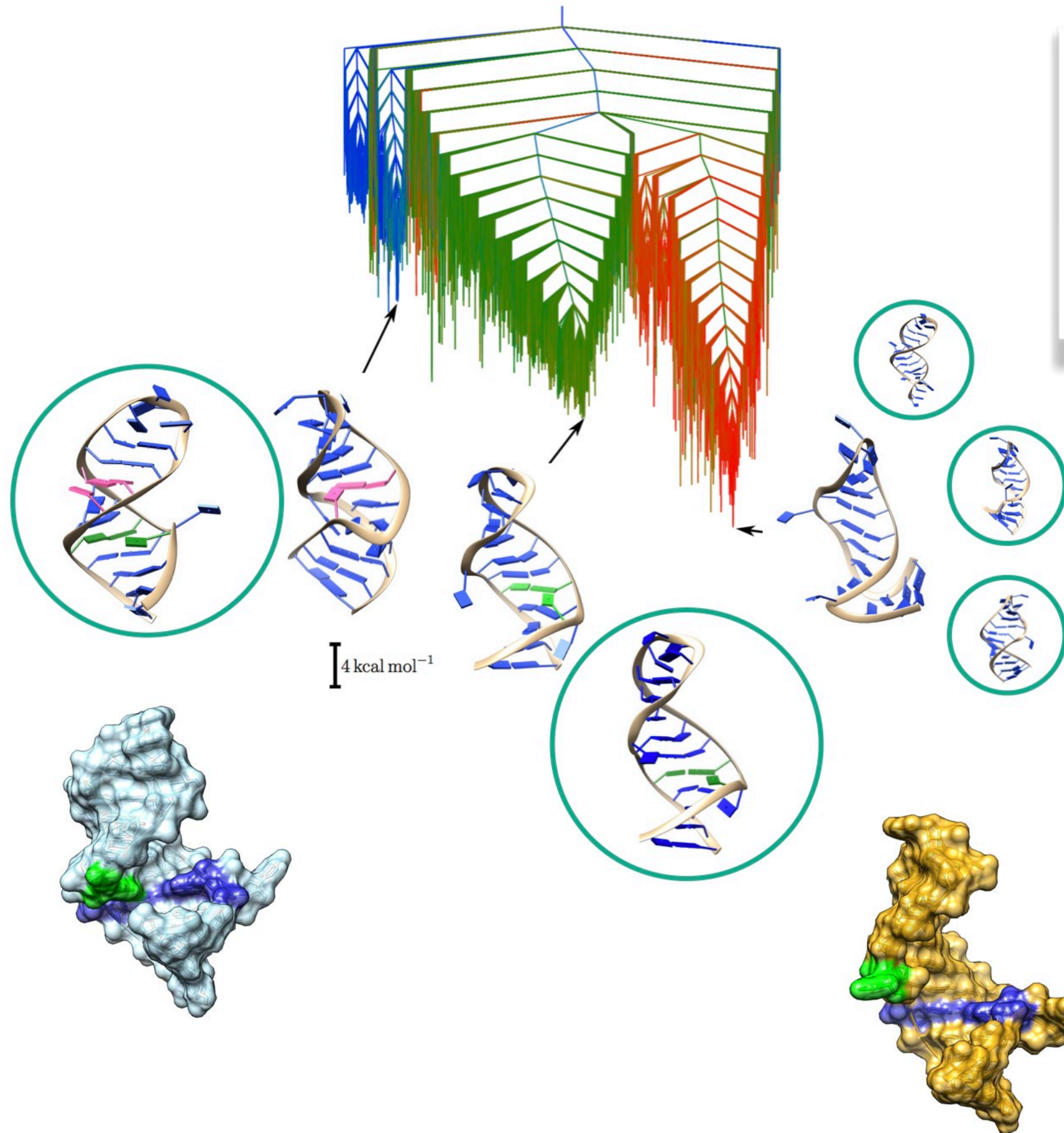
## CG models

- ✓ Allow to study larger systems for longer time scales  
Allow to highlight essential elements of the system description
- ✗ Loss of atomistic details  
Implicit solvent  
No generally recognized model





# Combining strategies: DPS + REST2 REX



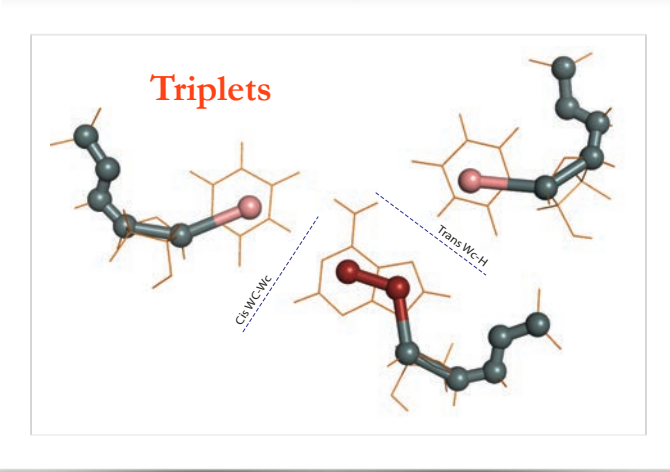
## REST2 (24 H-replicas)

Explicit solvent: interactions with water and ions, solvation effects full entropy contribution.

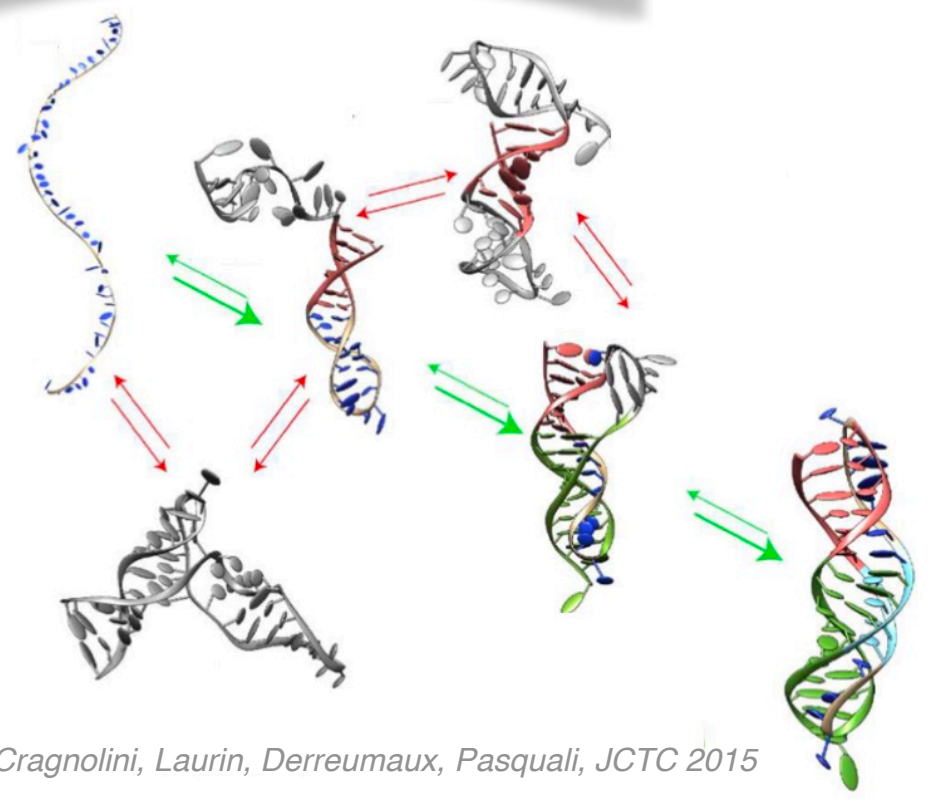
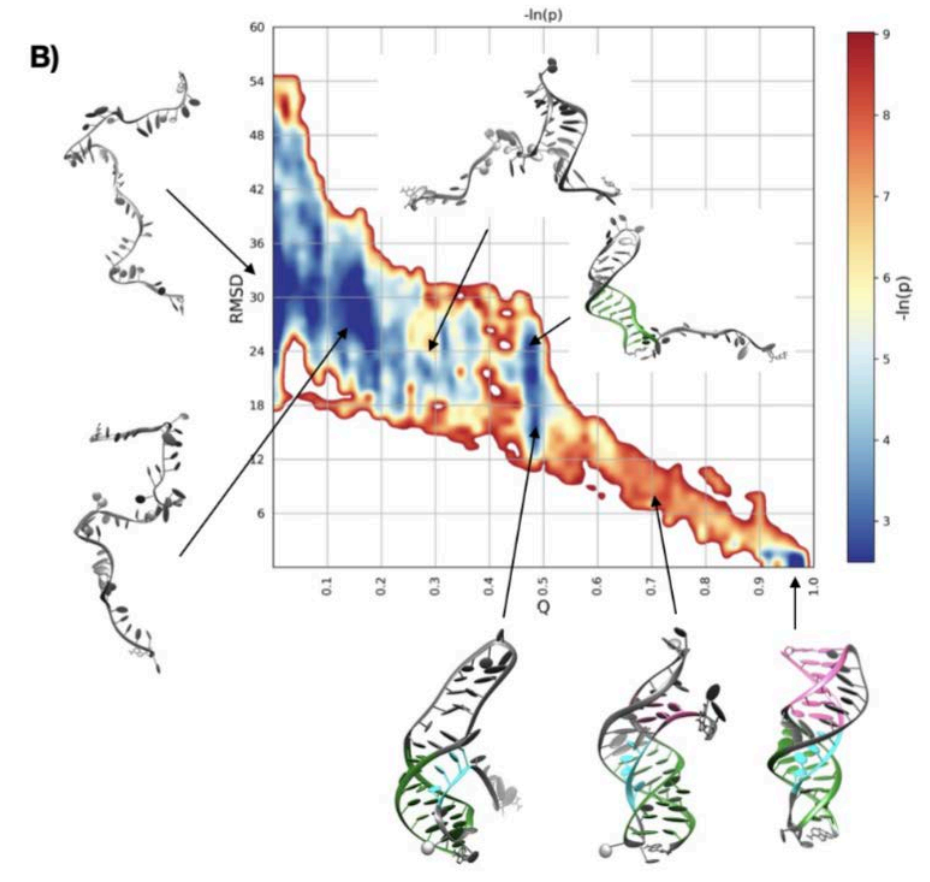
Slow convergence, expensive calculations, limited exploration of new conformations



# Triple helix folding: CG-MD + rMD

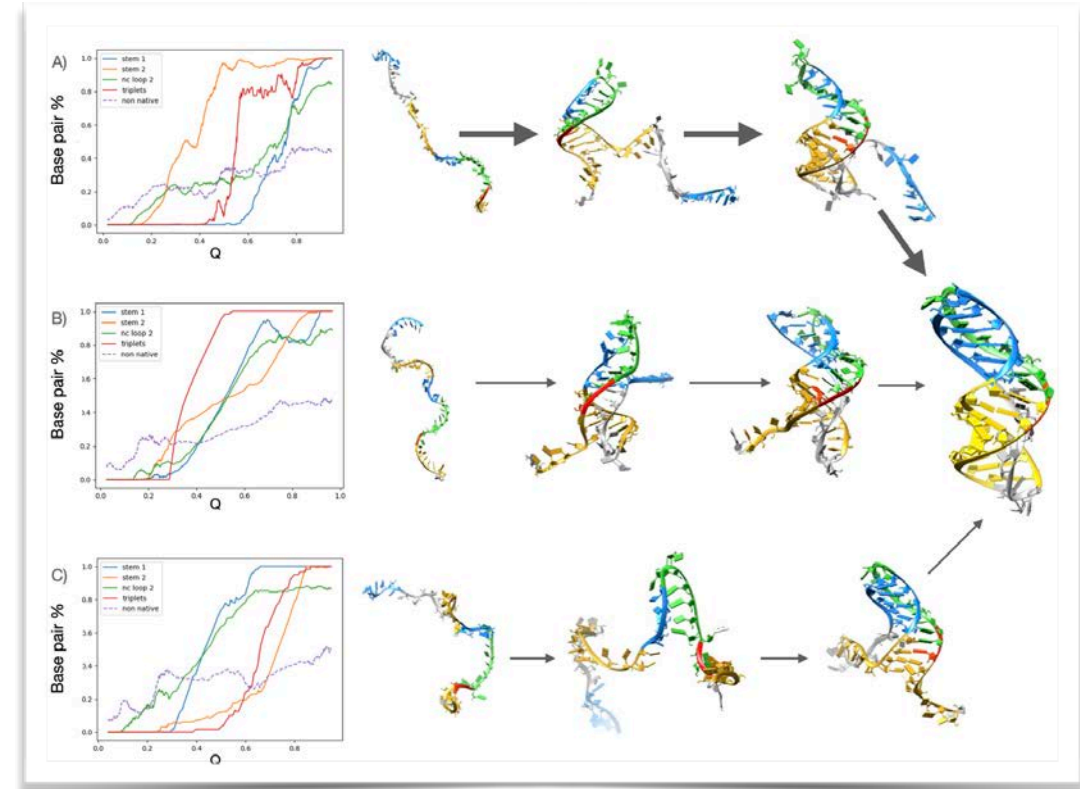


**rMD (100 short simulations)**  
 Full solvation, fast folding.  
 Strong bias, need of a good reaction coordinate.



*Cragolini, Laurin, Derreumaux, Pasquali, JCTC 2015*

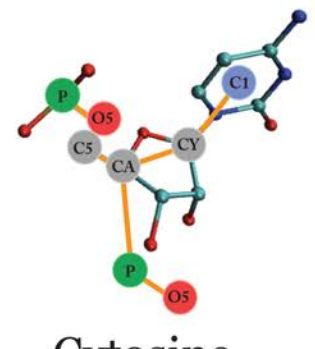
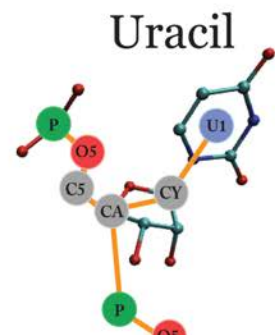
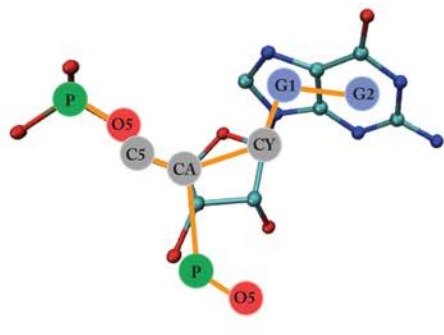
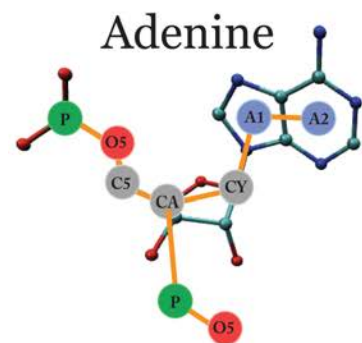
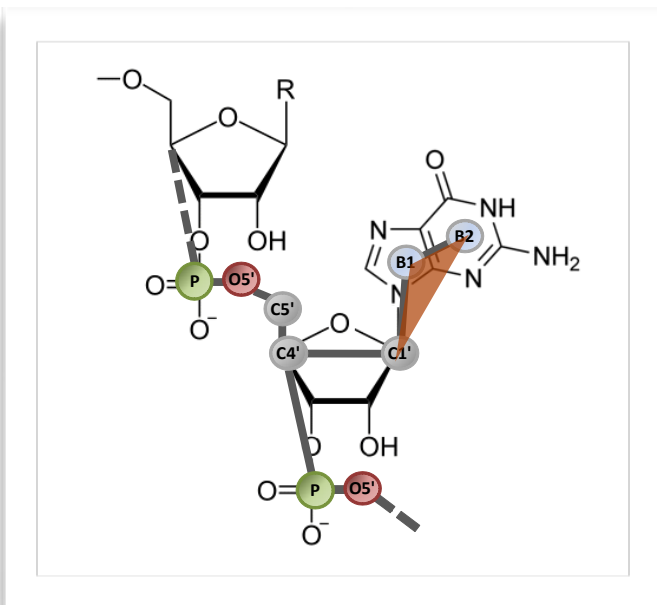
**HiRE-RNA (64 replicas REMD)**  
 No bias, large exploration of conformational space  
 Approximate force field, no solvent nor ions



*Lazzari, Micheletti, Pasquali, Faccioli, preprint 2022*

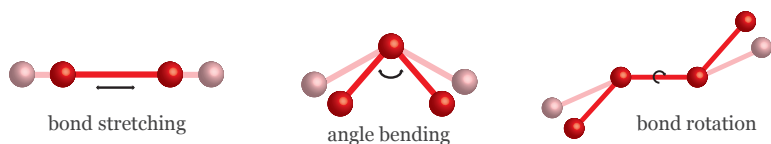


# Coarse-grained RNA modeling: HiRE-RNA



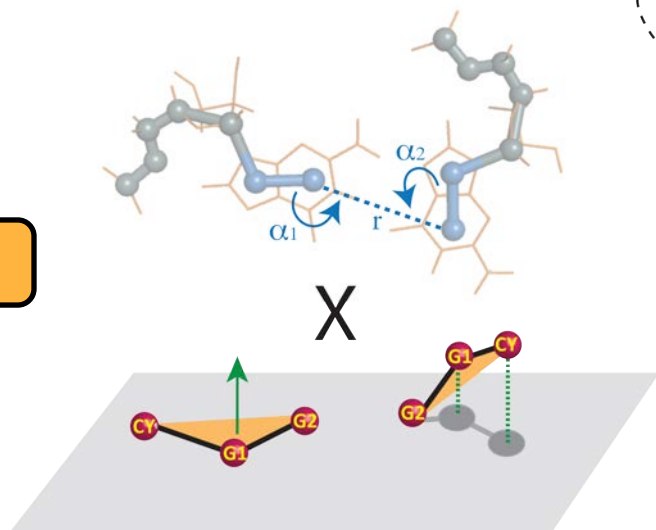
$$E = E_{\text{local}} + E_{\text{ex vol}} + E_{\text{BP}} + E_{\text{electrostatics}} + E_{\text{stacking}}$$

harmonic  
statistical parameters

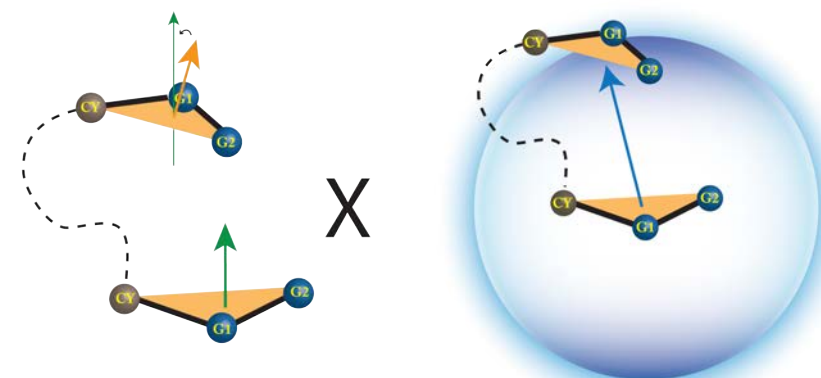


$$E_{\text{BP}} = E_{\text{HB}} \times E_{\text{plane}}$$

Planarity  
Non-canonical pairs

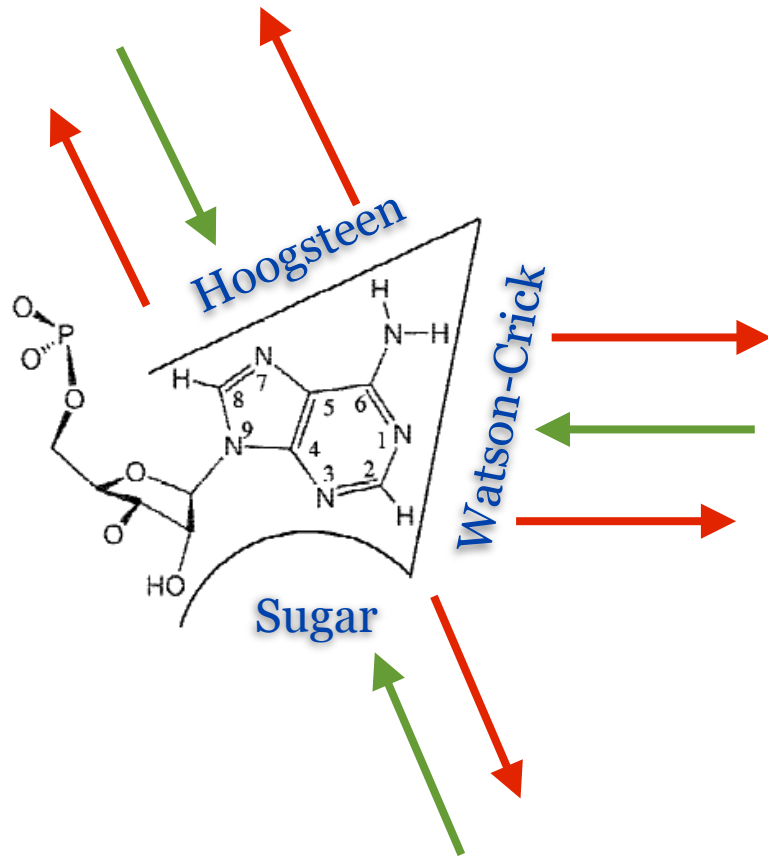


Base orientation

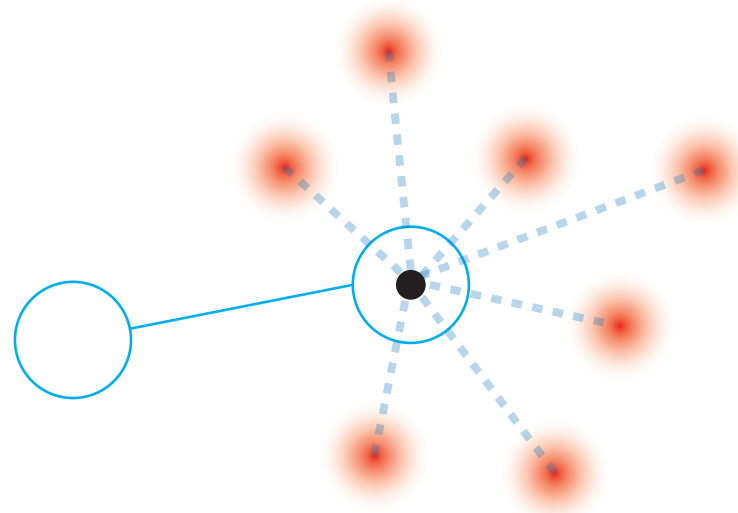




# Base pairing



~150 different experimentally accounted interactions 1, 2 or 3 HB per pair



A A <i>trans HH</i>  ②	A A <i>trans HS</i>  ①	A A <i>trans WcWc</i>  ②
A C <i>cis WcWc</i>  ①	A C <i>cis WcWc</i>  ①	A G <i>cis WcS</i>  ①
A G <i>cis WcWc</i>  ②	A G <i>trans HS</i>  ②	A G <i>trans WcWc</i>  ①
A U <i>cis WcWc</i>  ②	A U <i>trans WcH</i>  ②	C C <i>trans WcWc</i>  ②
C U <i>cis WcWc</i>  ①	C U <i>trans WcH</i>  ①	G C <i>cis WcWc</i>  ③
G C <i>trans HH</i>  ①	G G <i>cis WcH</i>  ①	G G <i>cis WcH</i>  ②
G U <i>cis WcWc</i>  ②	G U <i>trans WcWc</i>  ①	U U <i>cis WcWc</i>  ②

# Stacking

$$E_{STK} = -\epsilon e^{-\sigma(r_{ij}-r_0)^2} (\vec{n}_i \cdot \vec{n}_j)^2 (e^{-\alpha(1-\cos(\theta-\theta_0))^2} + e^{-\alpha(1-\cos(\pi-\theta-\theta_0))^2})$$

Semi-sequence dependent parameters : purine-purine, purine-pyrimidine, pyrimidine-pyrimidine

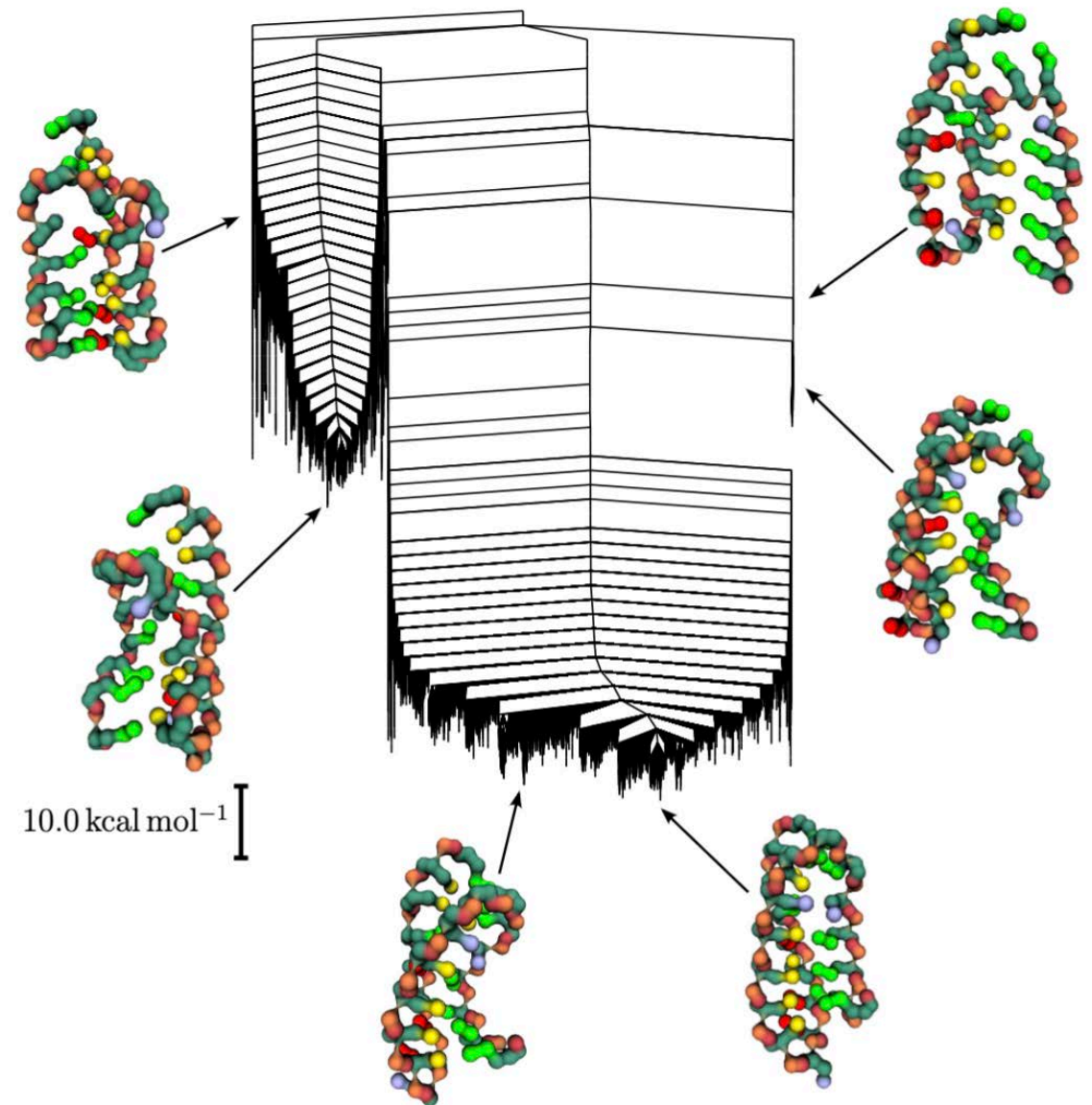
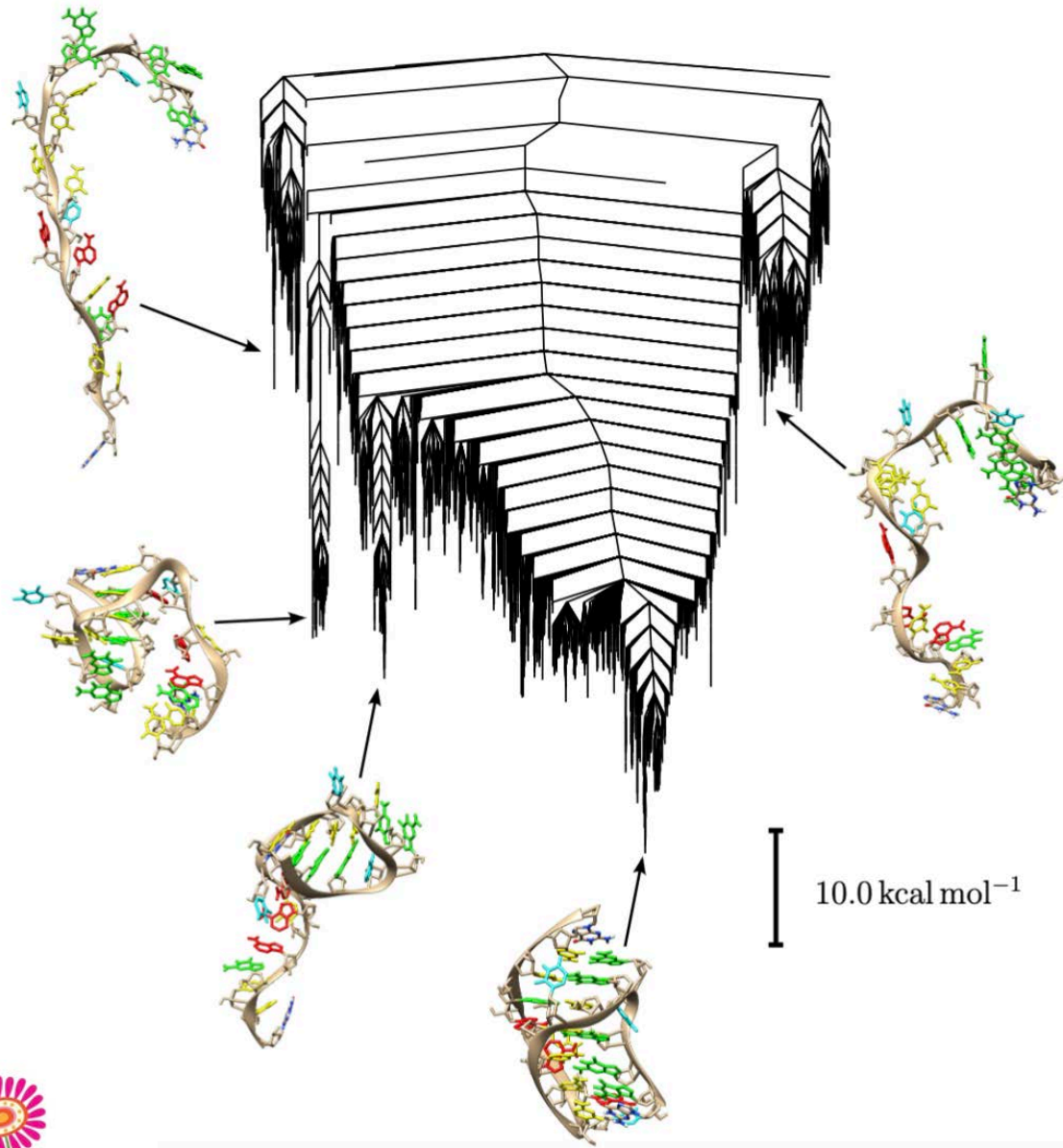
> 200 parameters



# Force field optimization



Comparison of atomistic and CG energy landscapes → optimize to match energy differences



Can we use EL comparisons also to assess the quality of atomistic force-fields?





# Generalized landscapes

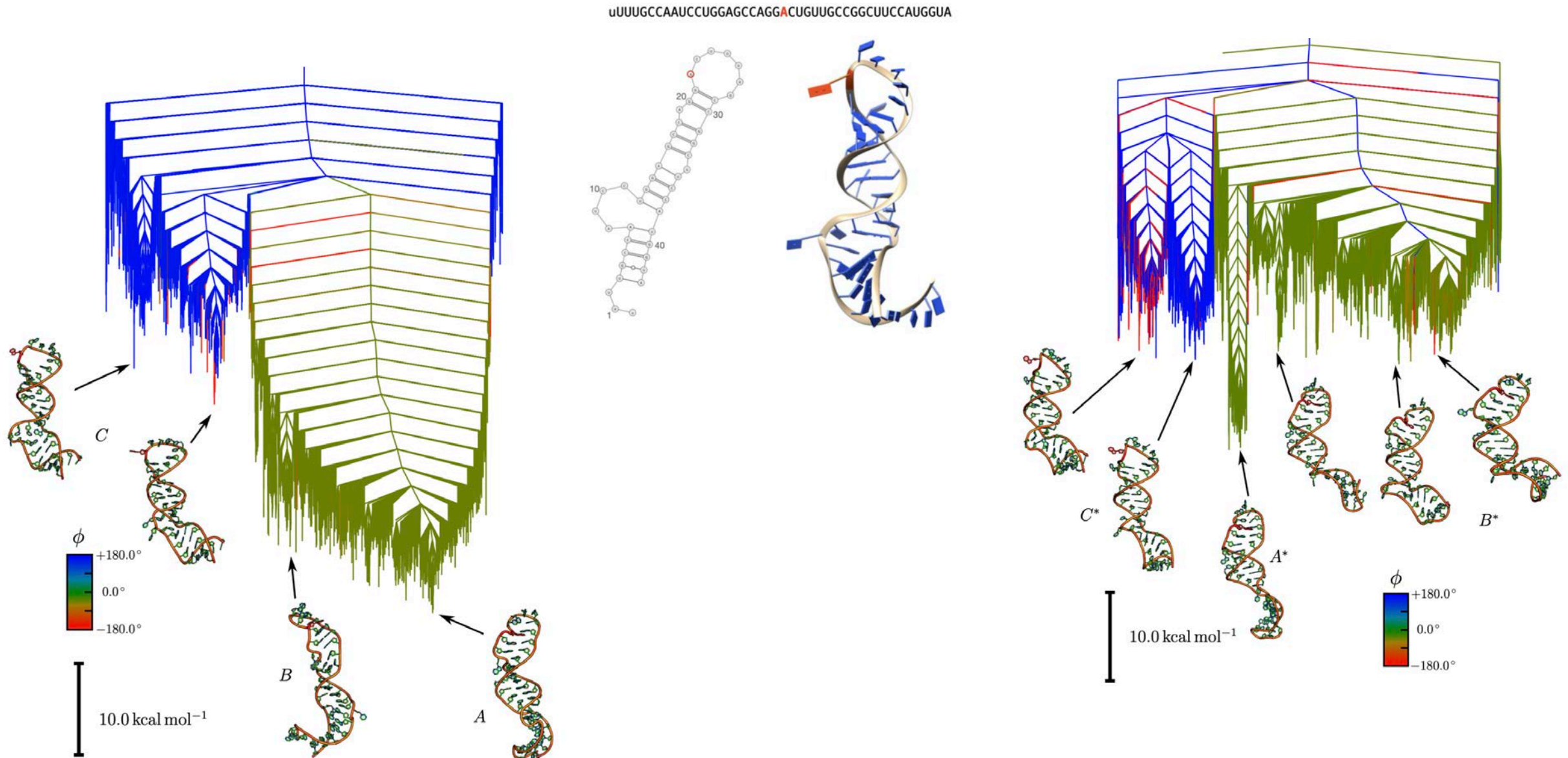
Discrete variables

mutations, chemical modifications

methylation

Continuous variables

Temperature, pH, ionic conditions...





# Generalized landscapes

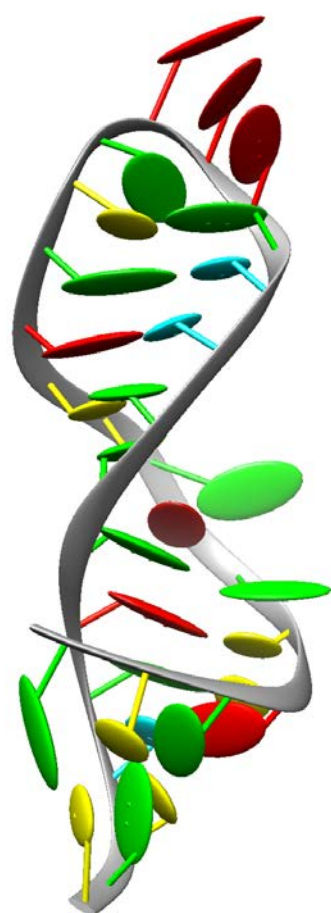


Discrete variables

mutations, chemical modifications

Continuous variables

Temperature, pH, ionic conditions...

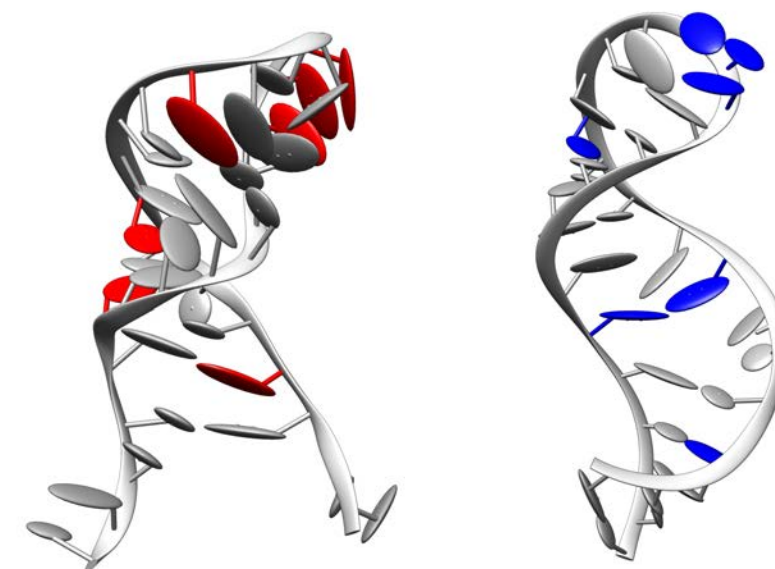
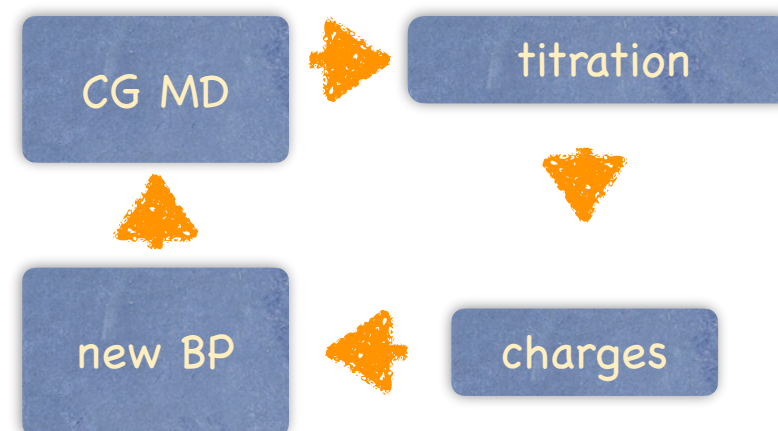


exposed  $\rightsquigarrow$  protonable  
pK<sub>a</sub> ~ isolated

neutral paired  $\rightsquigarrow$  protected  
lower pK<sub>a</sub>

N<sup>+</sup> paired  $\rightsquigarrow$  protected  
higher pK<sub>a</sub>

pH



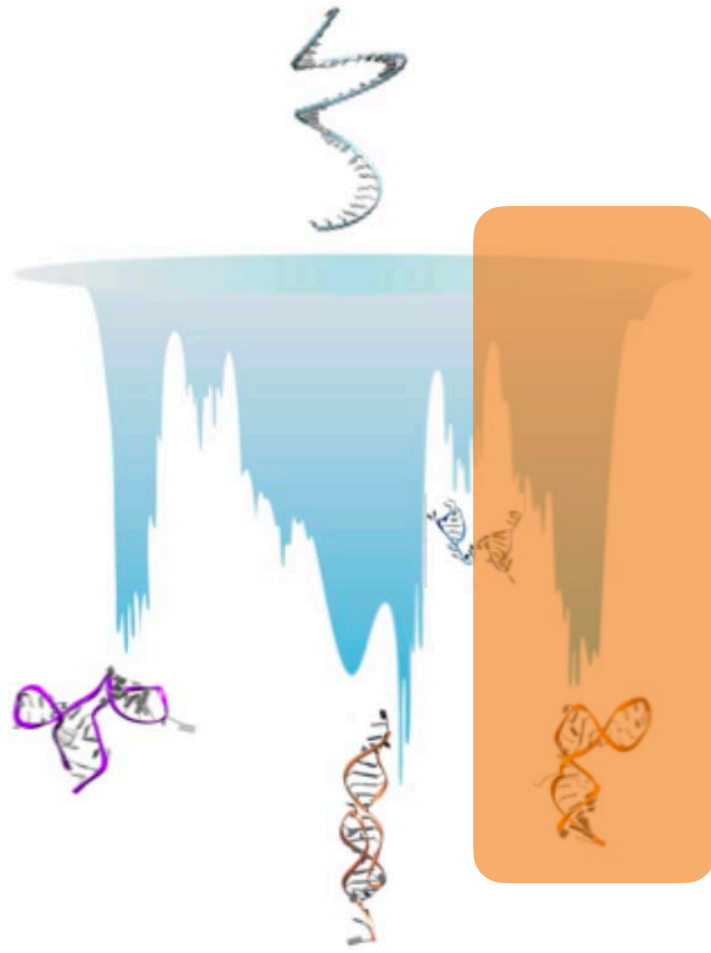
$$w_{TK} \approx \frac{e^2}{8\pi\epsilon_0\epsilon_r} \sum_{i>j}^{N_p} \left( \frac{z_i z_j}{r_{ij}} - \frac{Z_p^2 \kappa}{2(1 + \kappa b)} \right) \pm (pH - pK_a)$$

Fast MC protonation scheme

Teixeira, Lund, Barroso da Silva, JCTC, 2010

# Including experimental data and experimental conditions

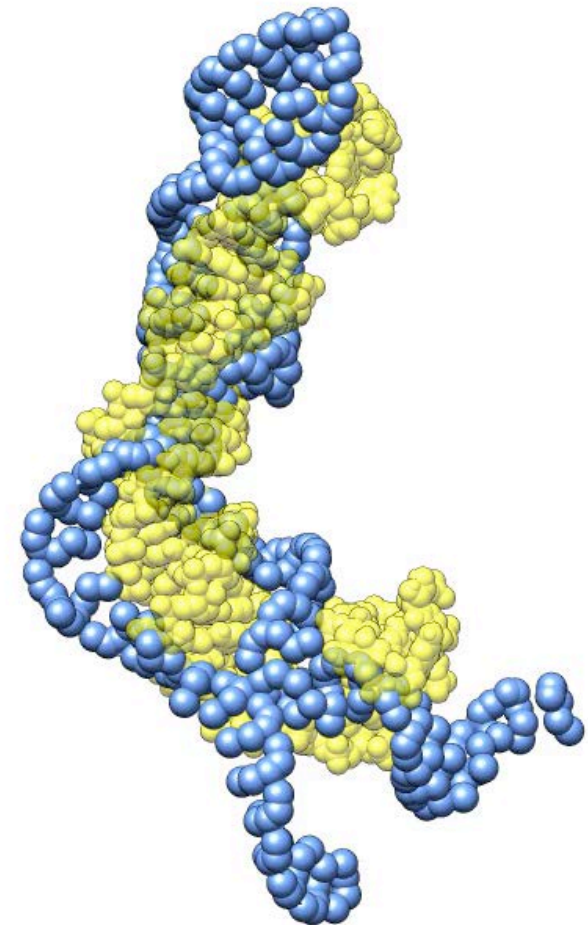
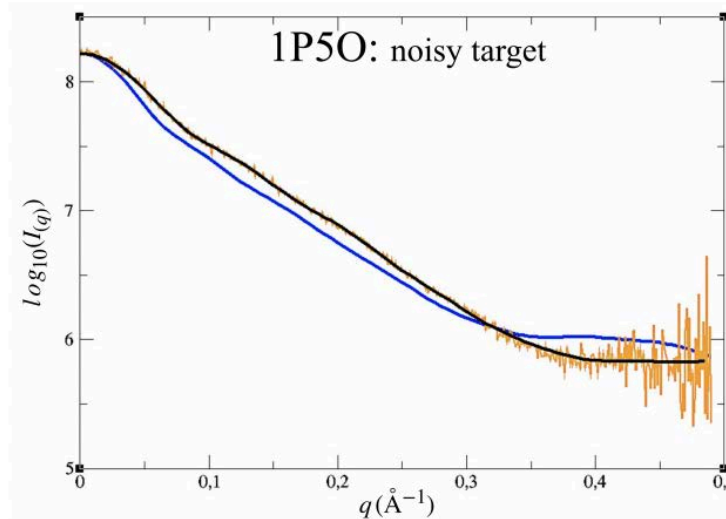
- What does the experiment actually measure?
- Is it possible to compute the outcome from hypothetical structures?
- Can we bias simulations based on this account?



Experimental data restricts the conformational space to be explored



SAXS



# Thanks to...

Chemistry Department  
University of Cambridge

David Wales  
Tristan Cragnolini\*



SISSA  
Cristian Micheletti

King's College London  
Konstantin Roeder



Laboratoire CiTCoM  
Université Paris Cité  
Elisa Frezza  
Liuba Mazzanti\*  
Bruno Sargueil



Università di Trento  
Pietro Faccioli

Institute of Biophysics  
Czech Republic's Academy of Sciences  
Jiri Sponer  
Petr Stadlbauer



University of Sao Paulo  
Fernando Barroso da Silva

Laboratoire de Biochimie Théorique  
Université Paris Cité

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