# Sampling strategies to approximate RNA folding kinetics

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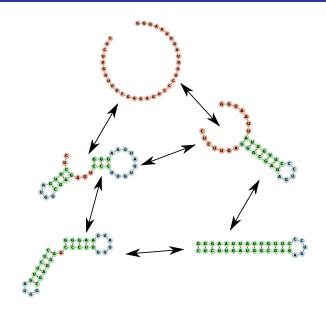
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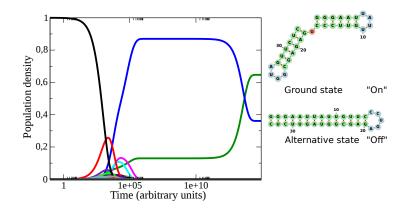
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# RNA Structure Dynamics

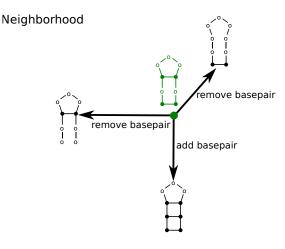


# RNA Switch Folding Kinetics

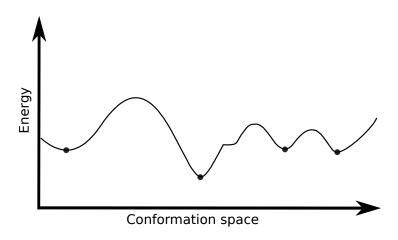


## **Energy Landscape**

$$L = \{S, f, M\}; S = \{s_1, s_2, ...\}; f : s \to \mathbb{R}; M = " + / - 1 \text{bp"}$$



# Energy Landscape - Growth

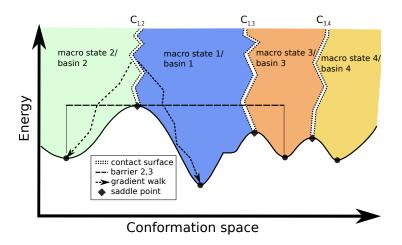


growth: 1.8<sup>N</sup>

atoms in the universe:  $10^{80}$ 

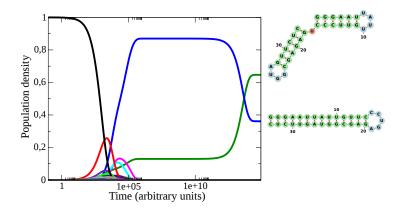
$$1.8^{N} = 10^{80} \rightarrow N = 312$$
 nucleotides

## Coarse Graining



# RNA Folding Kinetics

$$\frac{dp_i(t)}{dt} = \sum_{j \neq i} \left[ p_j(t) r_{ji} - p_i(t) r_{ij} \right]$$



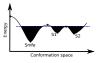
#### Goals

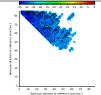
- Make RNA folding kinetics prediction applicable to biologically relevant sequence lengths (> 100nt)
- How to do that?
  - Sample the energy landscape to cover most important states
  - ② Determine physically meaningful partitioning of partial landscape into macro states
  - 3 Derive good transition rate approximations for resulting macro states
  - Implement the above into a pipeline

### State Generation

#### Exhaustive enumeration

- up to a certain threshold
- exponential number of structures
- $\rightarrow$  only for short sequences

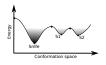




Boltzmann sampling (importance sampling)

$$P(s) = \frac{e^{-\frac{E(s)}{RT}}}{Q}$$
 with  $Q = \sum_{S} e^{-\frac{E(s)}{RT}}$ 

- highly redundant
- only structures with small energy deviations from the ground state

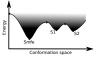


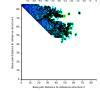


Variable temperature sampling

$$T = \xi \cdot T_0, \, \xi > 1$$

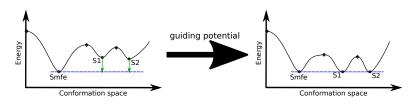
- undirected
- large T = sampling from uniform distribution





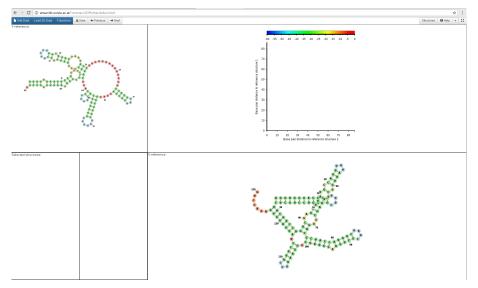
# New Approach: Guiding Potentials

sampling with focus on important reference structures

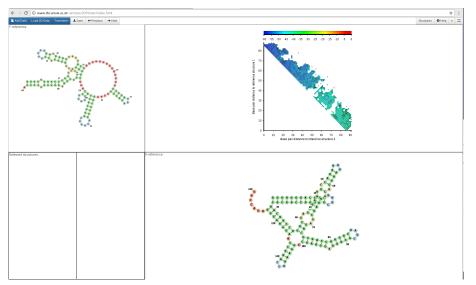


$$p(s_1) = p(s_2) = p(s_{mfe})$$
  
 $E'(s) = E(s) + \hat{E}(s)$   
 $\hat{E}(s) = d(s, s_1) \cdot w_1 + d(s, s_2) \cdot w_2$ 

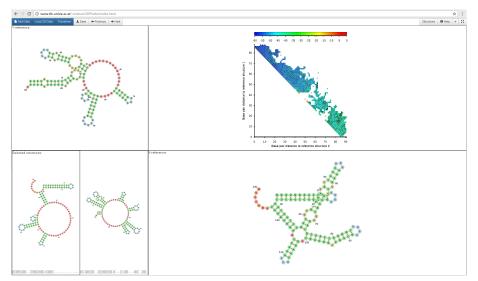
## Interactive Guided Sampling - Initial References



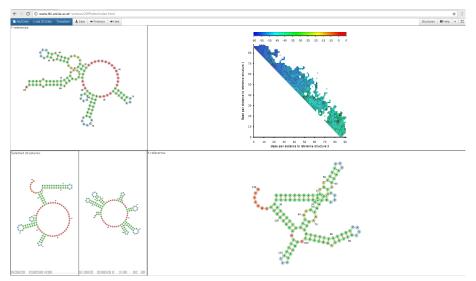
# Interactive Guided Sampling - Iteration 1



## Interactive Guided Sampling - New References



# Interactive Guided Sampling - Iteration 2



#### **Tasks**

- Develop an automated iterative sampling strategy which is fast and produces both, diverse and most important structures of the energy landscape.
- ② Develop cluster-strategies for RNA structures, to identify important structures and to generate macrostates.
- Oevelop methods for computing the transition rates for incomplete landscapes.
- Onstruct a pipeline and programs to compute RNA folding kinetics for long sequences and explore the underlying energy landscape. Implement a web server, which provides a comfortable graphical user interface.

# Thank you!

- Ivo Hofacker
- RNALands project team:
  - Andrea Tanzer, Ronny Lorenz, Maria Waldl, Yann Ponty, Mireille Regnier, Hélène Touzet, Loic Paulevé, Alain Denise, Juraj Michalik