

# Computational design of a circular RNA with prion-like behavior

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# RNA and artificial life

## RNA functional diversity

around 1980 discovery of catalytic RNA

around 2000 Ribosome is an RNA Enzyme

miRNA as regulatory elements to inhibit translation

## RNA world theory

genetic material + enzymatic function

## Complexity of Organisms

e.g. ratio RNA/Protein scales with complexity

2006: ENCODE, practically whole genome is transcribed

## RNA synthetic biology

engineering devices for altered gene expression

aptazymes (switches + ribozymes) to control gene expression

self-replicating RNA

self-polymerizing RNA

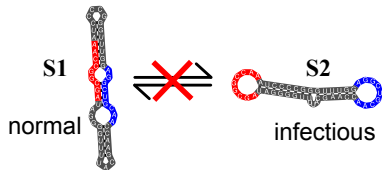
self-switching RNA

bottom up Artificial life  
inspired by nature

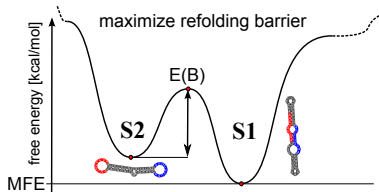


# Prions and conformational self-replication

## Requirements for an RNA prion

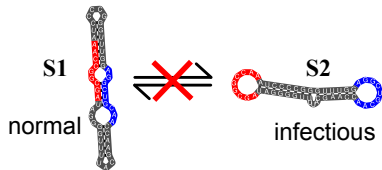


## Energy Landscape

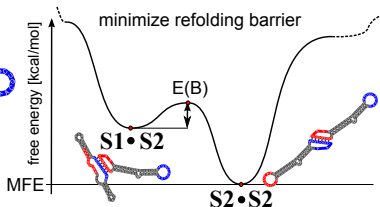
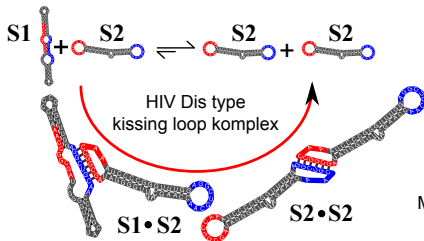
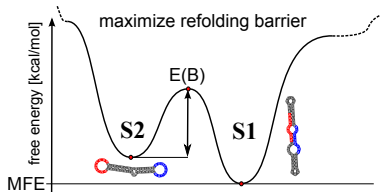


# Prions and conformational self-replication

## Requirements for an RNA prion

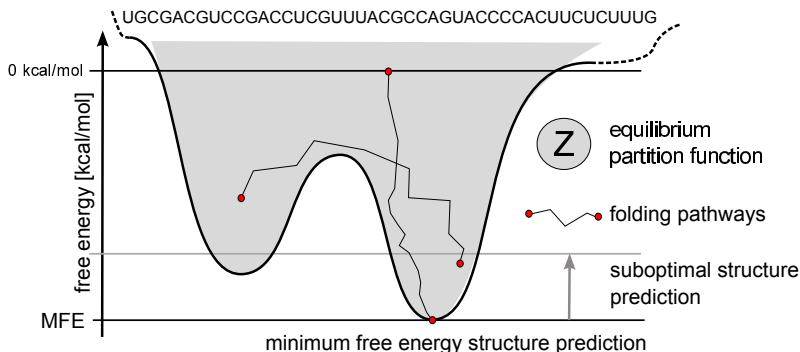


## Energy Landscape



# Computational RNA folding

Sequence  $\Rightarrow$  Structure



$$G = -kT \ln(Z) \quad Z = \sum_{S \in \Omega} e^{\frac{-E(S)}{kT}} \quad P(S) = \frac{e^{\frac{-E(S)}{kT}}}{Z}$$

# Computational RNA design

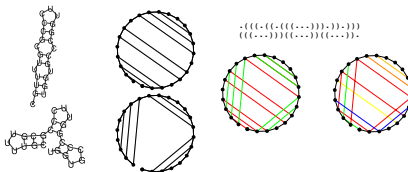
Structure  $\Rightarrow$  Sequence (inverse of RNA folding problem)

Simplest case: Find a sequence that forms a predefined structure

- $\Rightarrow$  structure is the MFE of the designed sequence
- $\Rightarrow$  maximize probability of the desired structure
- $\Rightarrow$  sequence must be biologically reasonable (GC content)

Even harder: Find a sequence that forms **two** predefined structures

- $\Rightarrow$  sequence must be bi-stable (like a Prion)

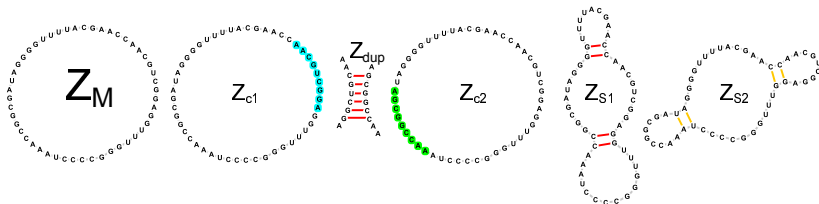


# Computational Prion design

- `switch.pl` with two conformations and HIV-Dis loop  
....(((((((...((((...((((...))))))...))))))...))))))  
(((((((...))))))...((((...))))).  
NNNNNNNAACCGACGANNNNNNNNNNNNNNNNNNNNNAACGUCGGANNNNNNNN
- Generate lots of sequences (128 different results)
- Select candidate with required prion features

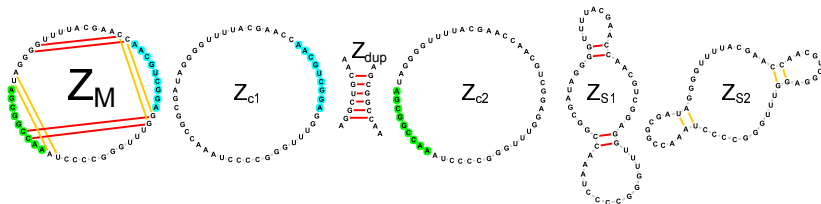


# Evaluation of prion-like behavior



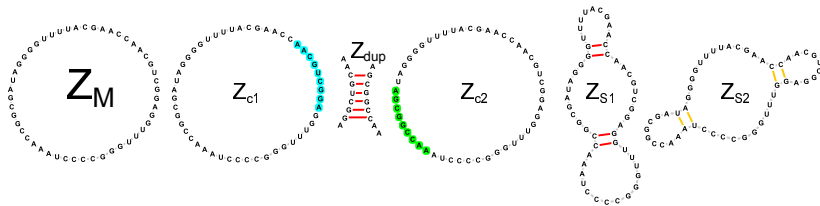
- $Z_M$  ... Partition function of the Monomer
- $Z_{c1}$  ... Partition function constrained that  $c1$  (cyan) is unpaired
- $Z_{c2}$  ... Partition function constrained that  $c2$  (green) is unpaired
- $Z_{S1}$  ... Partition function constrained that  $S1$  can form
- $Z_{S2}$  ... Partition function constrained that  $S2$  can form
- $Z_{dup}$  ... Partition function constrained that duplex can form

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# Evaluation of prion-like behavior



Partition function of the Dimer:

$$Z_D = Z_{c1} * Z_{c2} * Z_{dup} \quad (1)$$

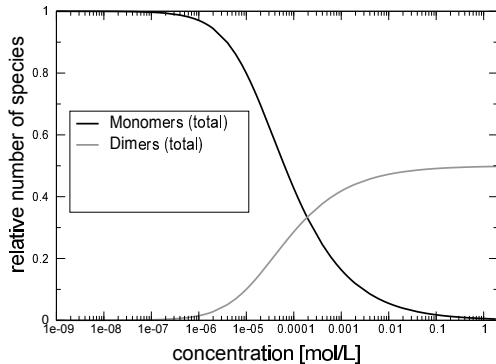
Partition function of all Structures that are neither S1 nor S2:

$$Z_{!S1 \& !S2} = Z_M - Z_{S1} - Z_{S2}$$

Equilibrium Constant for Dimerization:  $[M] + [M] \rightleftharpoons [D]$

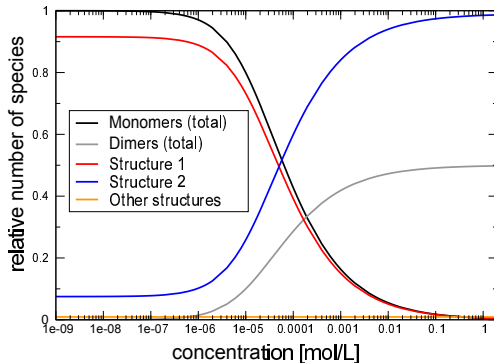
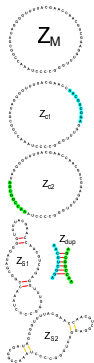
$$K = \frac{[D]}{[M]^2} = \frac{Z_D}{Z_M^2}$$

# Evaluation of prion-like behavior



$$K[D] = [M] * [M]$$

# Evaluation of prion-like behavior

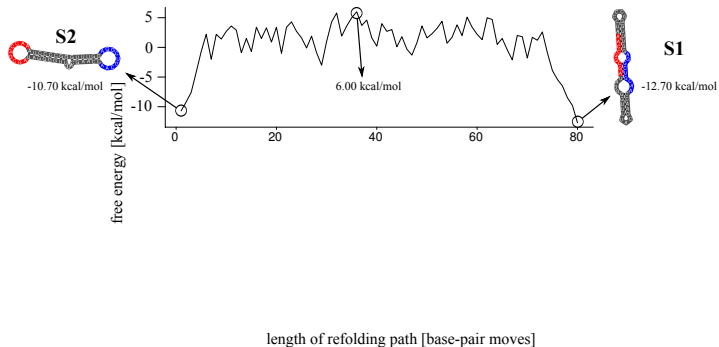


$$[S1] = \frac{Z_{S1}}{Z_M} \cdot [M] + \left( \frac{Z_{S1+c1}}{Z_{c1}} + \frac{Z_{S1+c2}}{Z_{c2}} \right) \cdot [D] \quad (2)$$

$$[S2] = \frac{Z_{S2}}{Z_M} \cdot [M] + \left( \frac{Z_{S2+c1}}{Z_{c1}} + \frac{Z_{S2+c2}}{Z_{c2}} \right) \cdot [D]$$

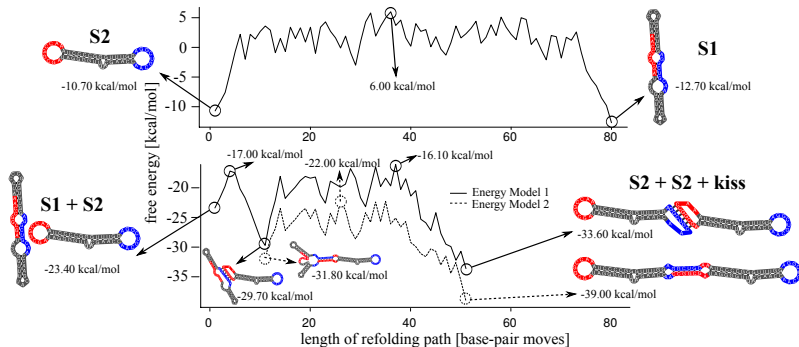
# Evaluation of prion-like behavior

S1 and S2 are separated by a high energy barrier:



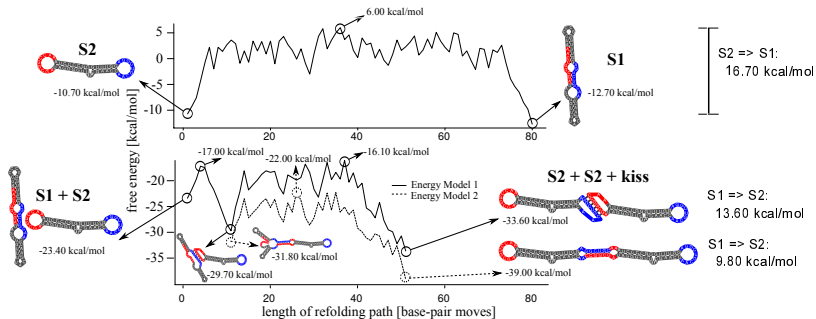
# Evaluation of prion-like behavior

S2 catalyzes reaction from S1 to S2:



# Evaluation of prion-like behavior

S2 catalyzes reaction from S1 to S2:





# Summary

- RNAprions are a form of conformational self-replication
- Computational RNA folding and design
- HIV-Dis loops can be used to favor the infectious conformation for dimers
- Different energy models for refolding pathways all show that S2 can act as a catalyst

# thanks to



## **This work:**

Ivo L. Hofacker  
Christoph Flamm

## **General:**

Sabine Müller  
Peter F. Stadler  
the TBI group

Flamm et al. (2001) **Design of multi-stable RNA Molecules**

Weixlbaumer et al. (2004) **Determination of Thermodynamic Parameters for HIV-1  
DIS Type Loop-Loop Kissing Complexes**

Lorenz et al. (2011) **ViennaRNA Package 2.0**



universität  
wien

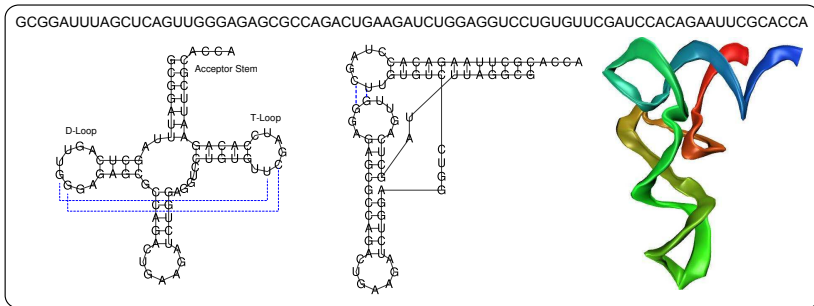


FWF

Der Wissenschaftsfonds.

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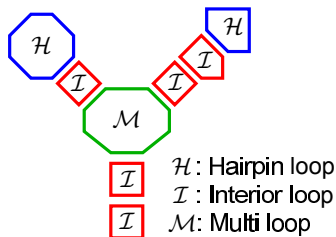
# Computational RNA folding



A secondary structure is a list of base pairs  $(i, j)$ , where:

- A base may participate in at most one base pair.
- Base pairs must not cross, i.e., no two pairs  $(i, j)$  and  $(k, l)$  may have  $i < k < j < l$ .
- Only isosteric base-pairs GC, CG, AU, UA, GU, UG are allowed.
- Hairpin loops have at least length 3 ( $|j - i| > 3$ )

# Computational RNA folding



$$E(\mathcal{S}) = \sum_{I \in \mathcal{S}} E(I)$$

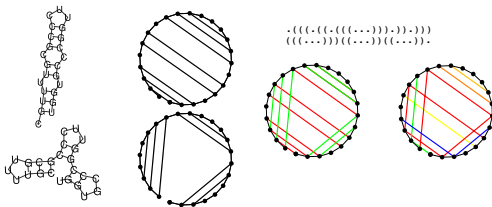
Nearest Neighbor Energy Model: The free energy  $E$  of a secondary structure  $\mathcal{S}$  is the sum of the energies of its loops  $I$

- Energies depend on loop type and size, with some sequence dependence.
- Most relevant parameters are measured experimentally.

# Computational RNA design

switch.pl in a nutshell:

- build a dependency graph
- mutate an initial sequence guided by dependency graph
- accept/reject mutations according to a cost function



Cost Function:

$$\Rightarrow E(x, S_1) + E(x, S_2) - 2G(x) + \xi(E(x, S_1) - (E(x, S_2) + \epsilon))^2$$