

# **Folding funnels in energy landscapes**

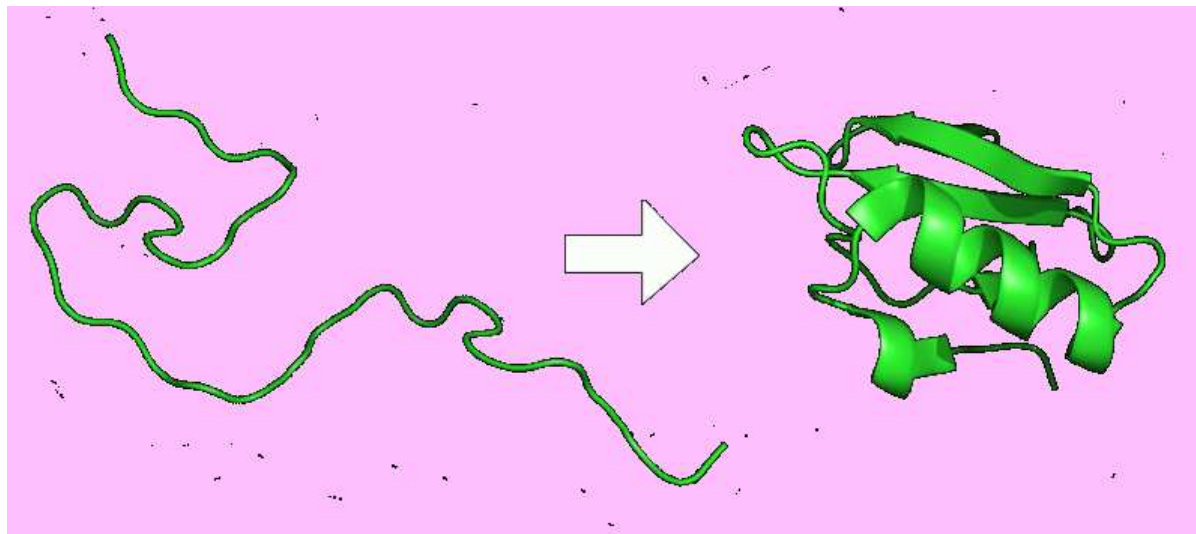
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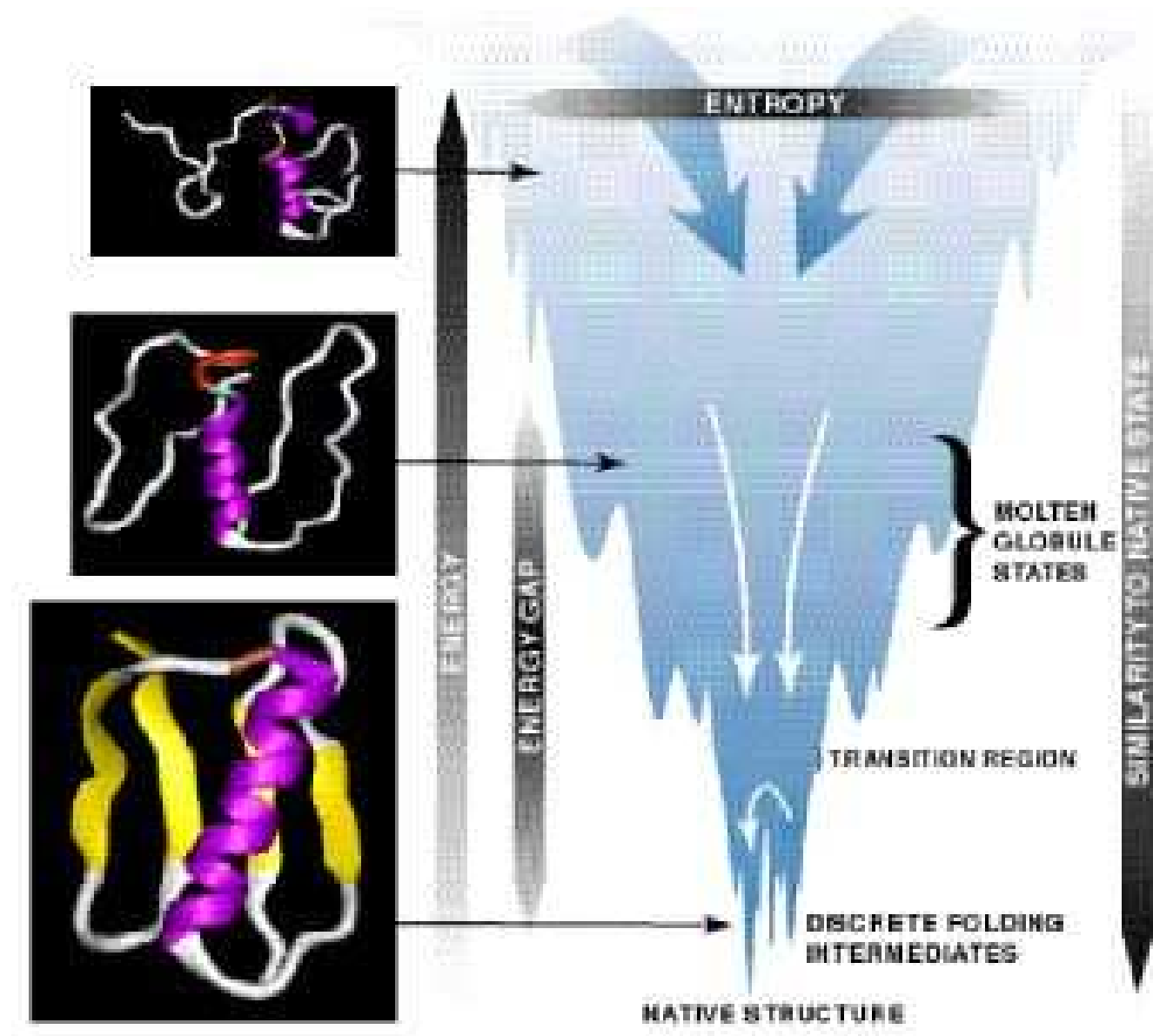
Universities of Leipzig and Vienna

# Protein folding

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- native (target) structure very different from unfolded chain
- huge configuration space, rugged energy landscape: many local minima.
- how does the molecule “find” the global target state?





from National Partnership for Advanced Computational Infrastructure website

## Dynamics on a discrete landscape

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We define an energy landscape over a state space  $X$  by an energy function  $E$  and a move set  $M$

$$E : X \rightarrow \mathbb{R}, M : X \rightarrow \mathcal{P}(X - \{x\})$$

Transition probabilities (Metropolis dynamics)

$$p(y|x) = \frac{1}{|M(y)|} \min\{1, \exp(-\beta(E_y - E_x))\} \quad \text{for } y \in M(x)$$

and

$$p(x|x) = 1 - \sum_{y \in M(x)} p(y|x)$$

## Average time to target

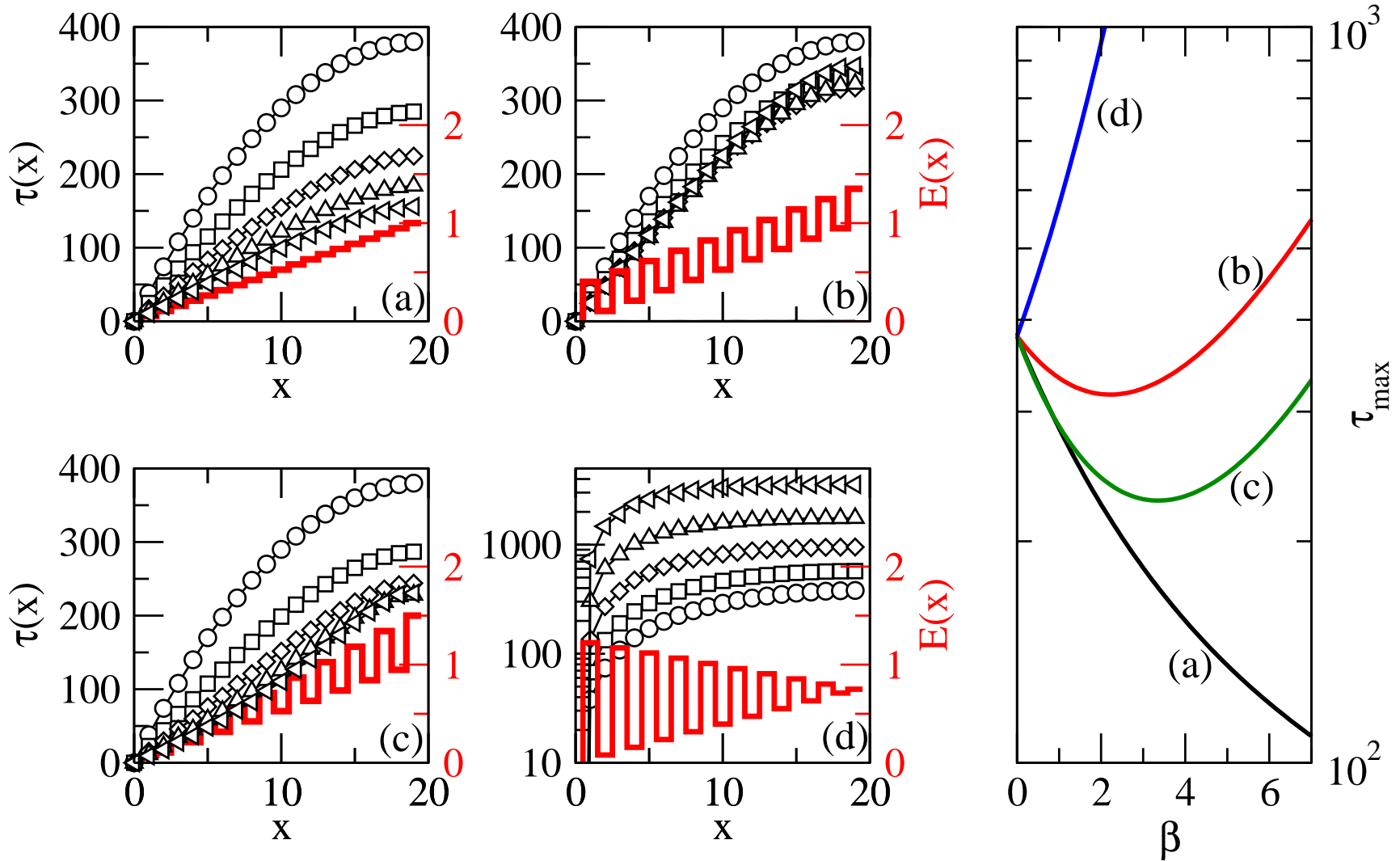
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Expected times  $\tau_x$  it takes to go from a state  $x$  to a target state fulfill

$$\tau_x = \sum_{y \in M(x) \cup \{x\}} p(y|x) \tau_y + 1 .$$

with  $\tau_0 = 0$  (target state).

# Time to target in one dimension



## Intuitive description of a funnel

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- The system leaves the basin of a local minimum via the lowest saddle with the highest probability (neglecting entropy effects).
- Rough deterministic approximation of the dynamics: Jump to the minimum reachable over the lowest saddle. Iterate this.
- **Folding funnel: Set of all starting states (structures) from which the sequence of steps over the lowest saddles eventually leads to the ground state.**

## Geometric definition of a funnel

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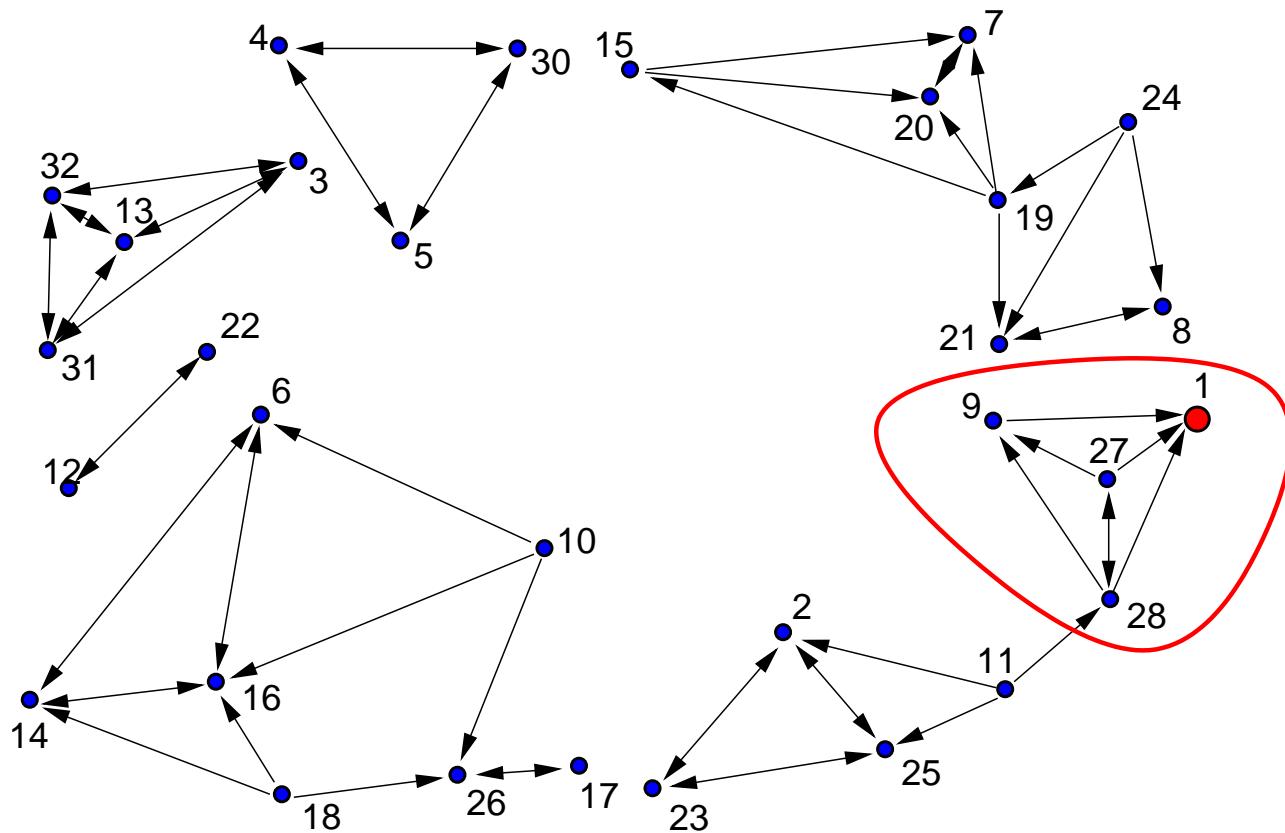
Define *the funnel* recursively as the following set  $F$  of states:

1. (1) The ground state is contained in  $F$ .
2. (2) The local minimum  $x$  belongs to funnel  $F$  if a minimum saddle connects it directly to local minimum in the funnel  $F$ .
3. (3) A state  $z$  belongs to the funnel if it is connected by a gradient descent path to a local minimum in  $F$ .



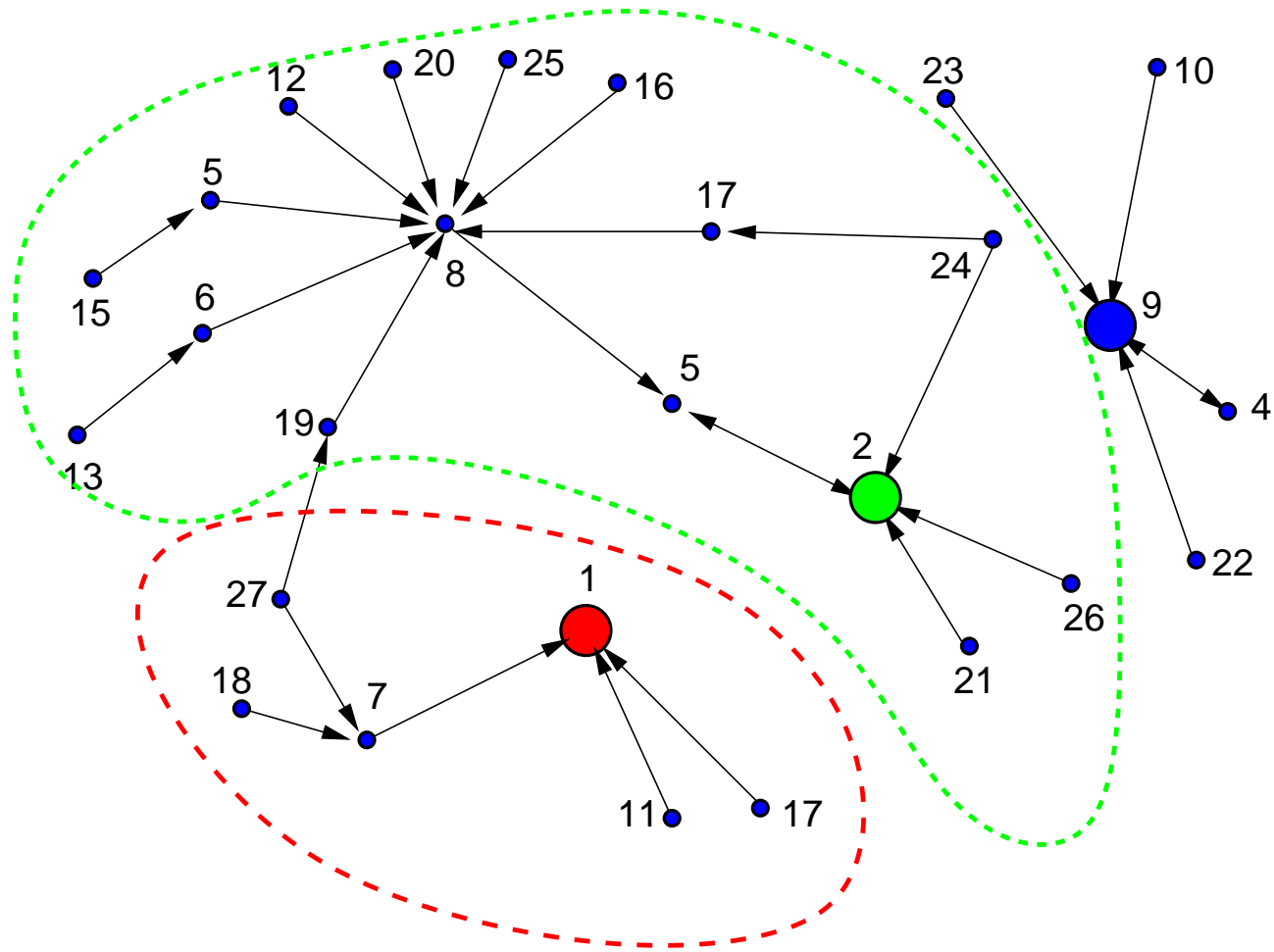
# Funnel in a rugged random landscape

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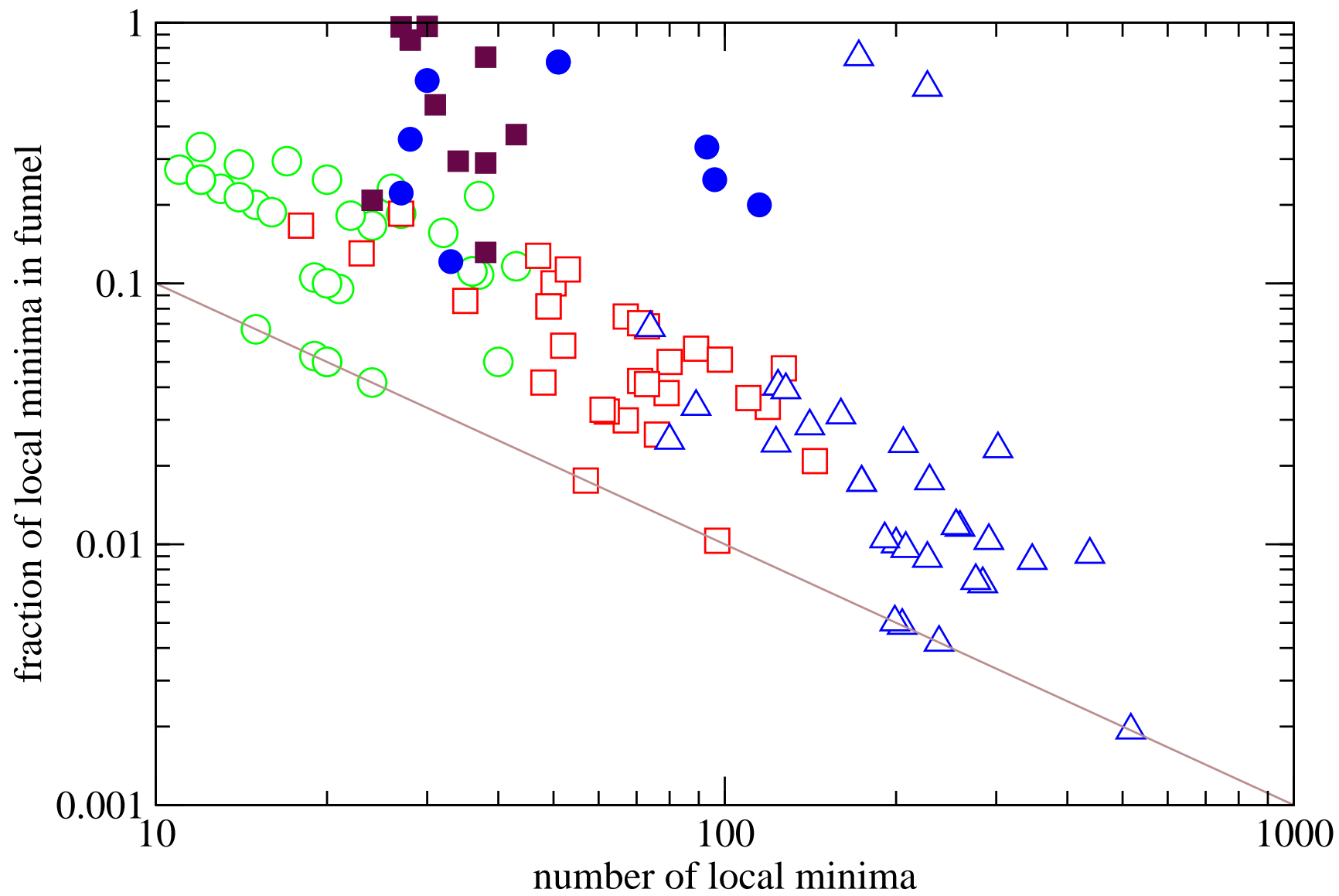


Random instance of the number partitioning problem of size 8.

# Funnels of a bistable RNA molecule



xbix sequence: CUGCGGCUUUGGCUCUAGCC



## Summary

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- Rigorous and simple definition of *funnel* in arbitrary energy landscape.
- Energy landscapes of well-folding RNA sequences have large ground state funnels.
- Next step: examine funnels of protein folding landscapes