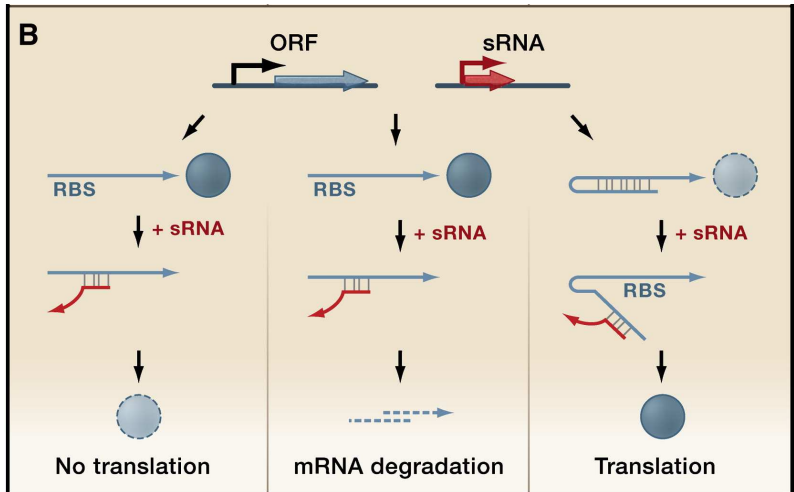


# Prediction of RNA-RNA Interaction

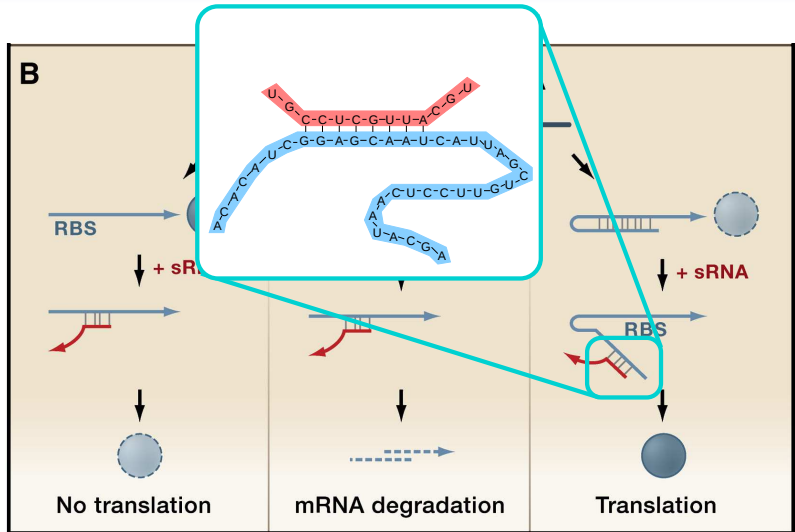
slides by Mathias Möhl and Rolf Backofen

# RNA-RNA interaction



(Waters and Storz, Cell 2009)

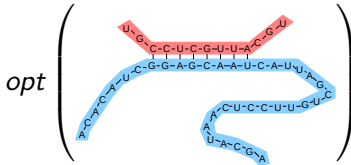
# RNA-RNA interaction



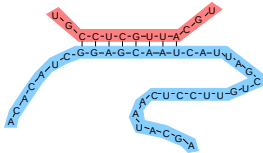
(Waters and Storz, Cell 2009)

# How is a mRNA-target recognized?

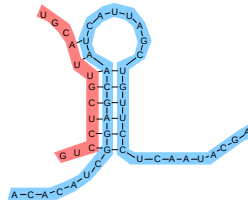
- idea 1: only hybridization energy counts



- many approaches build on that: RNAhybrid, RNAplex, TargetRNA etc.
- problem: structure



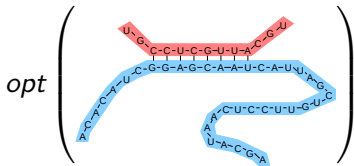
versus



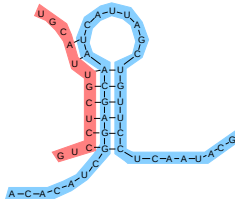
- hence: additional information in **accessibility** of site  
remark: accessibility = single-strandedness

# Approaches to Target Detection

**approach 1:** maximize duplex energy (RNAhybrid, RNAplex, etc.)



problem:



**approach 2:** common structure by concatenation:  
(RNAcofold, PairFold)

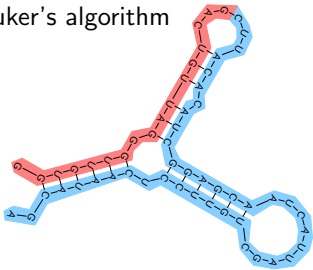
- given: two sequences
- concatenate them
- use Zuker's algorithm

GGUGUUGGGAUUGUCAG

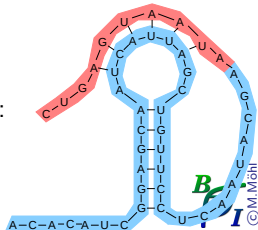
CUUACACAUCGGAGCAAUCAUUAGCUGUUCCUCAAUACGA

GGUGUUGGGAUUGUCAG

CUUACACAUCGGAGCAAUCAUUAGCUGUUCCUCAAUACGA



problem:



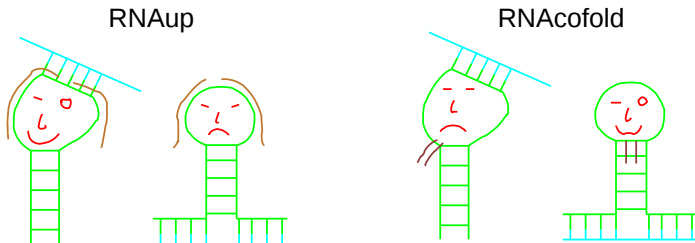
# Approaches to Target Detection

## approach 3: RNAup/IntaRNA:

- determine probability for region i..j being unpaired
- calculate ensemble energy from probability
- hybridize unpaired region with second RNA

## Comparison:

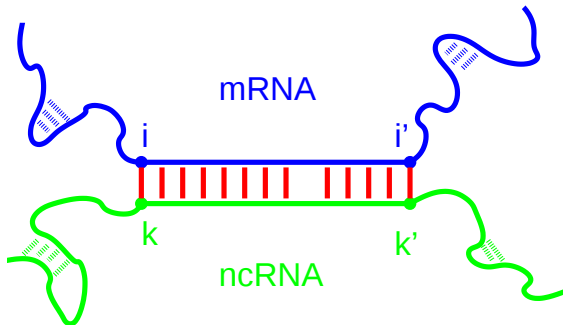
- approach 3: just one interaction possible
- approach 2: more than one interaction possible, but only external interactions (no pseudoknots in concatenated structure)



# The Idea of IntaRNA

**IntaRNA** = **Interacting RNA**

similar to RNAup, but much faster  
(optimized for scanning genomes)



$$E = E^{hybrid} + ED_{i,i'}^{mRNA} + ED_{k,k'}^{ncRNA}$$

as in *RNAhybrid*      *RNAplfold*      *RNAplfold*

# Efficient Unpaired Probabilities (RNAplfold)

Given RNA sequence  $S[1..n]$ , compute probability  $Pr[x..y \text{ unpaired} | S]$  that positions  $x..y$  of  $S$  are unpaired.

Recall matrices of McCaskill:  $Q, Q^b, Q^m, Q^{m1}$ ,  
and introduce “outside” matrices  $\hat{Q}, \hat{Q}^b$

$$Pr[x..y \text{ unpaired} | S] = Q^u(x, y) / Q(1, n)$$

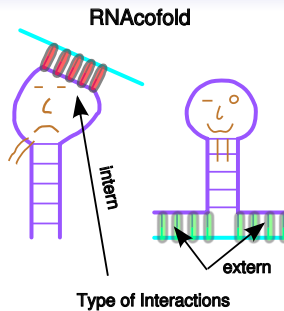
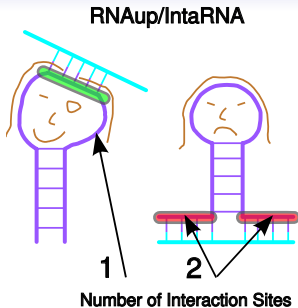
Cases

- I  $x..y$  external,  $O(1)$
- II  $x..y$  in hairpin, closed by  $(i, j)$ , naive  $O(n^2)$
- III  $x..y$  in internal loop, closed by  $(i, j)$ , 5' or 3' of inner base pair  $(k, l)$ ,  $O(1)$  (*internal loop size restricted*)
- IV  $x..y$  in multiloop, closed by  $(i, j)$ , 5', 3', or between inner base pairs, naive  $O(n^3)$

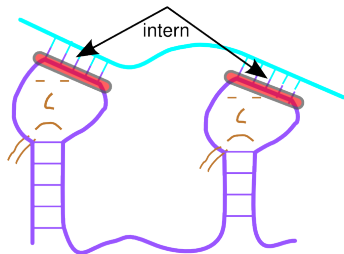


RNA Accessibility in cubic time Stephan H. Bernhart, Ulrike Mückstein, Ivo L. Hofacker. AMB 2011

# Two Parts of One Problem ?

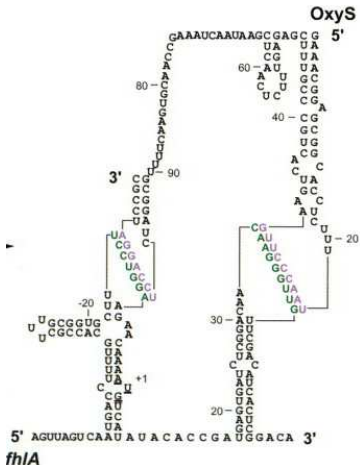


- however: there are more complex structures
  - double kissing hairpins
  - ...

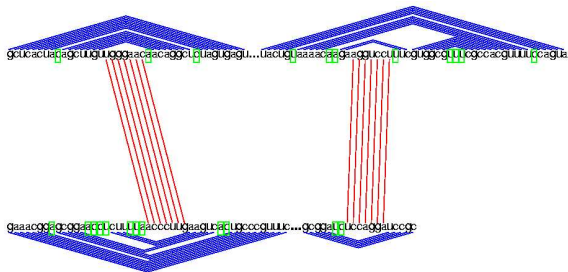


# Example

- more than one internal interaction site
- example: OxyS-fhlA interaction



(Argamana and Altuvia: JMB 2000)

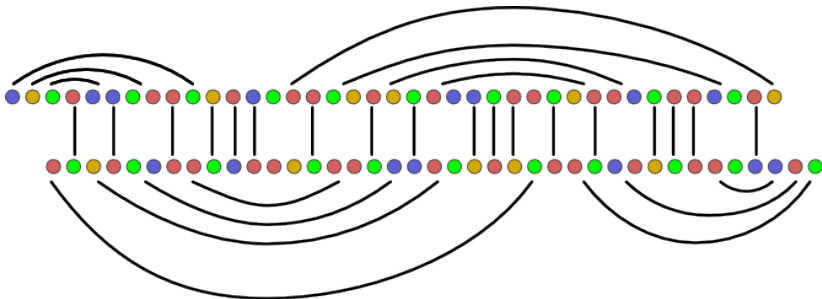


predicted complex [Alkan et al: JCB 2006]

# Generalized Problem

**approach 4:** predict joint mfe structure of two sequences

- like Zuker on two sequences at the same time, including loops between the sequences
- no pseudoknots, no crossing interaction
- proven to be NP-complete
- NP-completeness because of ZIG-ZAG structure
- without ZIG-ZAGs polynomial algorithm





# Efficient Base Pair Maximization without Zig-Zag

Given sequences  $R$  and  $S$ , compute the maximal number of intramolecular and intermolecular base pairs

Fragments/subproblems  $R[i..j], S[k..l]$

Decomposition cases

- I unpaired base at either end of one sequence
- II closed structure at either end of one sequence
- III base pair enclosing either sequence
- IV interaction between left or right ends of sequences
- V decomposition at  $i \leq i' \leq j, k \leq k' \leq l$  into two subproblems  $R[i..i'], S[k..k']$  and  $R[i' + 1..j], S[k' + 1..l]$

Complexity  $O(n^6)$  time /  $O(n^4)$  space. Why no zig-zags?

# RNA-RNA interaction: literature 1/2

approach 1:



Hakim Tafer, Ivo L. Hofacker, RNAPlex: a fast tool for RNA-RNA interaction search, Bioinformatics 2008

approach 2:



Stephan H. Bernhart, Hakim Tafer, Ulrike Mückstein, Christoph Flamm, Peter F. Stadler, Ivo L. Hofacker, Partition function and base pairing probabilities of RNA heterodimers, Algorithms Mol Biol 2006

# RNA-RNA interaction: literature 2/2

## approach 3:

-  Ulrike Mückstein, Hakim Tafer, Jorg Hackermuller, Stephan H. Bernhart, Peter F. Stadler, Ivo L. Hofacker, Thermodynamics of RNA-RNA binding, Bioinformatics 2006
-  Anke Busch, Andreas S. Richter, Rolf Backofen, IntaRNA: efficient prediction of bacterial sRNA targets incorporating target site accessibility and seed regions

## approach 4:

-  Hamidreza Chitsaz, Raheleh Salari, S. Cenk Sahinalp, Rolf Backofen, A partition function algorithm for interacting nucleic acid strands, Bioinformatics 2009
-  Raheleh Salari, Mathias Möhl, Sebastian Will, S. Cenk Sahinalp, Rolf Backofen, Time and space efficient RNA-RNA interaction prediction via sparse folding, RECOMB 2010