# Combinatorial approaches to RNA folding Part I: Basics 

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## What is RNA?

There are three major macromolecules that are essential to all forms of life:

- RNA (Ribonucleic acid)
- DNA (Deoxyribonucleic acid) $\}$ nucleic acids
- Proteins
\} biochemical compounds
Nucleic acids are biological molecules built from strings of nucleotides.

adenine

guanine

cytosine

thymine

uracil

A and G are purines. $\mathrm{C}, \mathrm{T}$, and U are pyrimidines.
DNA strands consist of A, C, G, and T.
RNA strands consist of $\mathrm{A}, \mathrm{C}, \mathrm{G}$, and U .

## What is RNA?

Combinatorially, an RNA strand is a length- $n$ sequence (of bases, or nucleotides), over the alphabet $\{\mathrm{A}, \mathrm{C}, \mathrm{G}, \mathrm{U}\}$.

Bases can bond: A with U, and C with G. (Watson-Crick base pairs.)


Guanine
Cytosine


Uracil

Additionally, U can bond with G. (Called a wobble-pair).


## Nucleic acid strands

Other bonds are either chemically impossible (GT, AC), or thermodynamically unstable (purine-purine, pyrimidine-pyrimidine) and thus very rare.

Nucleotides are strung together along a sugar-phosphate backbone, called a strand.

Strands of nucleic acid have directionality: a $5^{\prime}$ end "five prime end" and a $3^{\prime}$ end "three prime end."

Single strands of DNA or RNA are written in the $5^{\prime}$-to- $3^{\prime}$ direction.
DNA consists of two strands that bond together, in opposite directions. One strand thus determines the other stand. For example:

```
(5' end) ATCGATTGAGCTCTAGCG (3' end)
    ||||||||||||||||
(3' end) TAGCTAACTCGAGATCGC (5' end)
```

RNA consists of a single strand. It can fold and bond to itself. It is much less structurally constrainted than DNA!

How does RNA fold? [image from C. Heitsch; Georgia Tech]




## RNA folding

The physical structure of a folded RNA strand can be described on several levels.
■ Primary structure: The raw sequence of nucleotides.
■ Secondary structure: The bonding between nucleotides on a single strand.
■ Tertiary structure: Embedding (e.g., twisting, knotting, etc.) of the strand in 3-dimensional space.


## Central questions about RNA folding

## Questions

1. Given an RNA strand, can we predict how it will fold?
2. How does the structure that an RNA strand (or protein) folds into affect its function? ("structure-to-function problem")

Question 2 above is more purely biological.
In contrast, Question 1 can be attacked by mathematicans, computer scientists, engineers, without too much biology knowledge.

Before we proceed, we will need to establish a combinatorial framework for describing RNA strands.

## Combinatorial models of RNA

To each base, we associate a vertex. We use an edge to denote a bond.
The arc diagram of an RNA folding consists of vertices $V=[n]=\{1, \ldots, n\}$ and a collection of edges, or arcs, $E=\{(i, j) \mid i<j\} \subsetneq V \times V$.

There are several natural combinatorial models we can associate with RNA strands:



## Secondary structures

## Exercise

Consider the following fold of the RNA sequence GGGACCUUCCCCCCAAGGGGGGG:

(i) Draw the corresponding arc diagram.
(ii) Write out this secondary structure in point-bracket notation.
(iii) Draw the corresponding Motskin path.

You should notice that your arc diagram has no crossings.
Formally, two arcs $\left(i_{1}, j_{1}\right)$ and $\left(i_{2}, j_{2}\right)$ (with $\left.i_{1}<i_{2}\right)$ are crossing if $i_{1}<i_{2}<j_{1}<j_{2}$. An arc diagram is non-crossing if it has no crossing arcs. Such an RNA structure is (unfortunately) called a secondary structure.

## Pseudoknots

## Exercise

Consider the following fold of the same RNA sequence:

(i) Draw the corresponding arc diagram.
(ii) Write out this secondary structure in point-bracket notation.
(iii) Draw the corresponding Motskin path.

Which of these go wrong, now that there are crossing arcs?

An RNA structure is a pseudoknot if its arc diagram has crossings.
An arc diagram is $k$-noncrossing if there is no set of $k$ mutually crossing arcs.

## Pseudoknots

## Exercise

Consider the following fold of the same RNA sequence:

(i) Draw the corresponding arc diagram. What is the smallest $k$ for which this is $k$-noncrossing .
(ii) What if the first G bonds with the C "directly below" it (vertex 17). Does this change the $k$ from the previous part?
(iii) Draw a picture of a folded RNA strand (like the one above) that is 4-noncrossing but not 3-noncrossing.

## Parameters

The length of an arc $(i, j)$ is $|i-j|$. An arc of length $k$ is called a $k$-arc.
A stack (or stem or helix) is a sequence of nested arcs:

$$
(i, j),(i+1, j-1), \ldots,(i+(\sigma-1), j-(\sigma-1)),
$$

and a maximal such $\sigma$ is its size.
For thermodynnamical reasons, there are several key features of interest to us:
■ The minimum loop size (i.e., arc-length), $\lambda$.

- The minimum stack size, $\sigma$.

It is common to assume that $\sigma=2$ and $\lambda=3$ or $\lambda=4$.

## Mathematical questions

■ How can we enumerate the number of structures with certain parameters? This may require asympotic analysis.
■ How can we uniformly generate an RNA structure?

- What is the distribution of certain motifs (e.g., base-pairs, hairpin loops, etc.) in these structures?

■ What is the topology of one of these structures?

## Loop decomposition

Every secondary structure can be described by its loops, which come in different types.


## Loop decomposition

Given a basepair $(i, j)$ with $i<v<j$, say that $v$ is accessible from $(i, j)$ if there is no basepair $\left(i^{\prime}, j^{\prime}\right)$ such that $i<i^{\prime}<v<j^{\prime}<j$.

Loosely speaking, $v$ is accessible from $(i, j)$ if it can "look up and see the arc $(i, j)$." A basepair $(v, w)$ is accessible from $(i, j)$ if both $v$ and $w$ are accessible.

The $k$-loop closed by $(i, j)$ is the set of $(k-1)$ basepairs and the isolated bases that are accessible from $(i, j)$.

We do NOT include either $i$ or $j$ in the $k$-loop closed by $(i, j)$.
The size of a loop is the number of isolated bases in it

## Loop types

0 . The vertices not accessible from any arcs form the unique 0 -loop, or null loop $L_{0}$.

1. A 1-loop is called a hairpin loop
2. There are three types of 2-loops: bulge loops, interior loops, and stacked pairs.
3. A $k$-loop for $k \geq 3$ is called a multiloop.

## Loop decomposition

## 2-loops

Suppose $\left(i^{\prime}, j^{\prime}\right)$ is the unique accessible base pair from $(i, j)$. Then the resulting 2-loop is:
2a. a stacked pair if $i-i^{\prime}=j^{\prime}-j=1$;
2b. a bulge loop if exactly one of $i-i^{\prime}$ and $j^{\prime}-j$ is $>1$;
2c. an interior loop if both $i-i^{\prime}$ and $j^{\prime}-j$ are $>1$;

Two 2-loops: a bulge loop (left) and an interior loop (right). Each secondary structure also contains two 2-loops that are stacked pairs.


Loop decomposition with pseudoknotting
Things get a little more complicated when the diagram contains a pseudoknot, but there is is still a well-defined decomposition. (We won't go into details.)
stem


