# Combinatorial approaches to RNA folding Part I: Basics

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Math 4500, Fall 2016

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

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(5' end) ATCGATTGAGCTCTAGCG (3' end)

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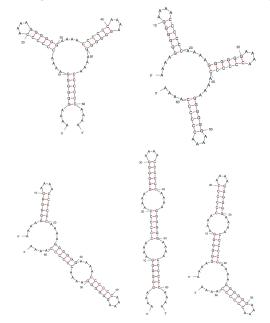
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# How does RNA fold? [image from C. Heitsch; Georgia Tech]



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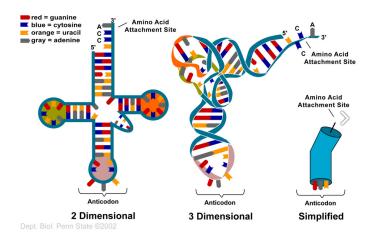
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- *Primary structure*: The raw sequence of nucleotides.
- Secondary structure: The bonding between nucleotides on a single strand.
- *Tertiary structure*: Embedding (e.g., twisting, knotting, etc.) of the strand in 3-dimensional space.





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

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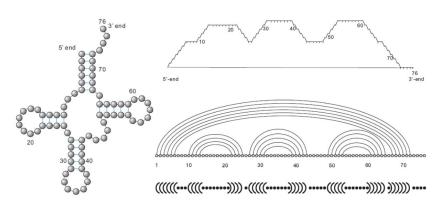
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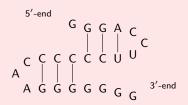
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#### Exercise

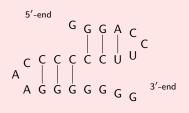
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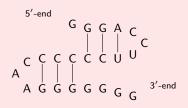


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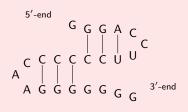
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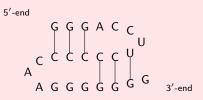
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### **Pseudoknots**

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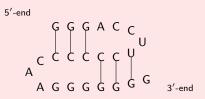
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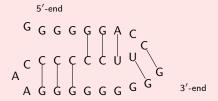
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An arc diagram is k-noncrossing if there is no set of k mutually crossing arcs.

### **Pseudoknots**

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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.

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## Mathematical questions

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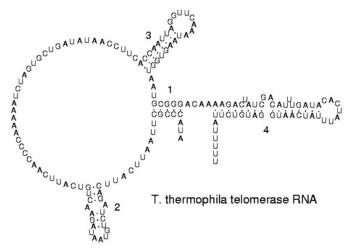
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## Loop types

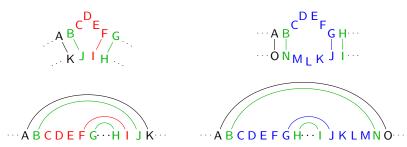
- 0. The vertices not accessible from any arcs form the unique 0-loop, or null loop  $L_0$ .
- 1. A 1-loop is called a hairpin loop
- 2. There are three types of 2-loops: bulge loops, interior loops, and stacked pairs.
- 3. A k-loop for  $k \ge 3$  is called a multiloop.

## 2-loops

Suppose (i',j') is the unique accessible base pair from (i,j). Then the resulting 2-loop is:

- 2a. a stacked pair if i i' = j' j = 1;
- 2b. a bulge loop if exactly one of i i' and j' j is > 1;
- 2c. an interior loop if both i i' and j' 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.)

