

---

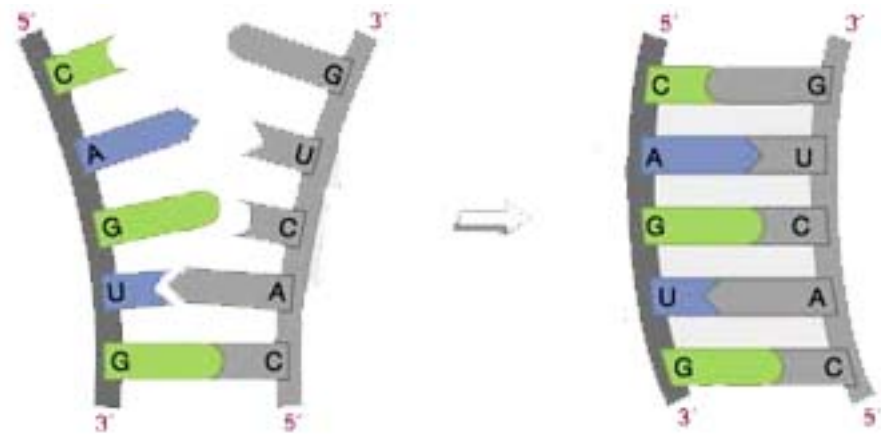
# Lecture 4: RNA folding

Chapter 6 – Problem 6.51 in Jones and Pevzner  
and the *Turner model*

Spring 2020  
February 4, 2020

# RNA Basics

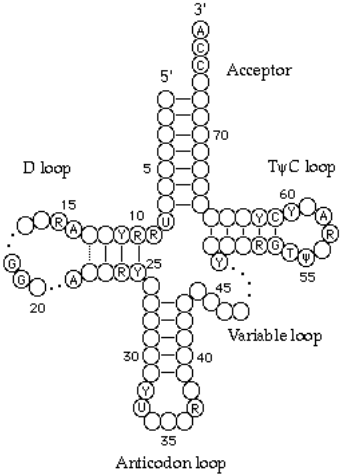
- RNA bases A,C,G,U
- Canonical Base Pairs
  - A-U
  - G-C
  - G-U “wobble” pairing
  - Bases can only pair with **one** other base.



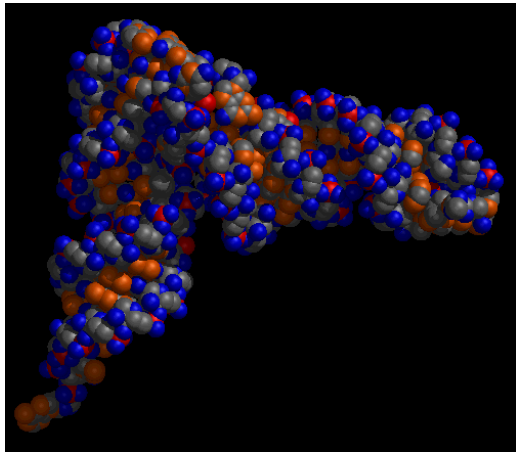
# RNA Structural Levels

**AAUCG...CUUCUCCA**

Primary

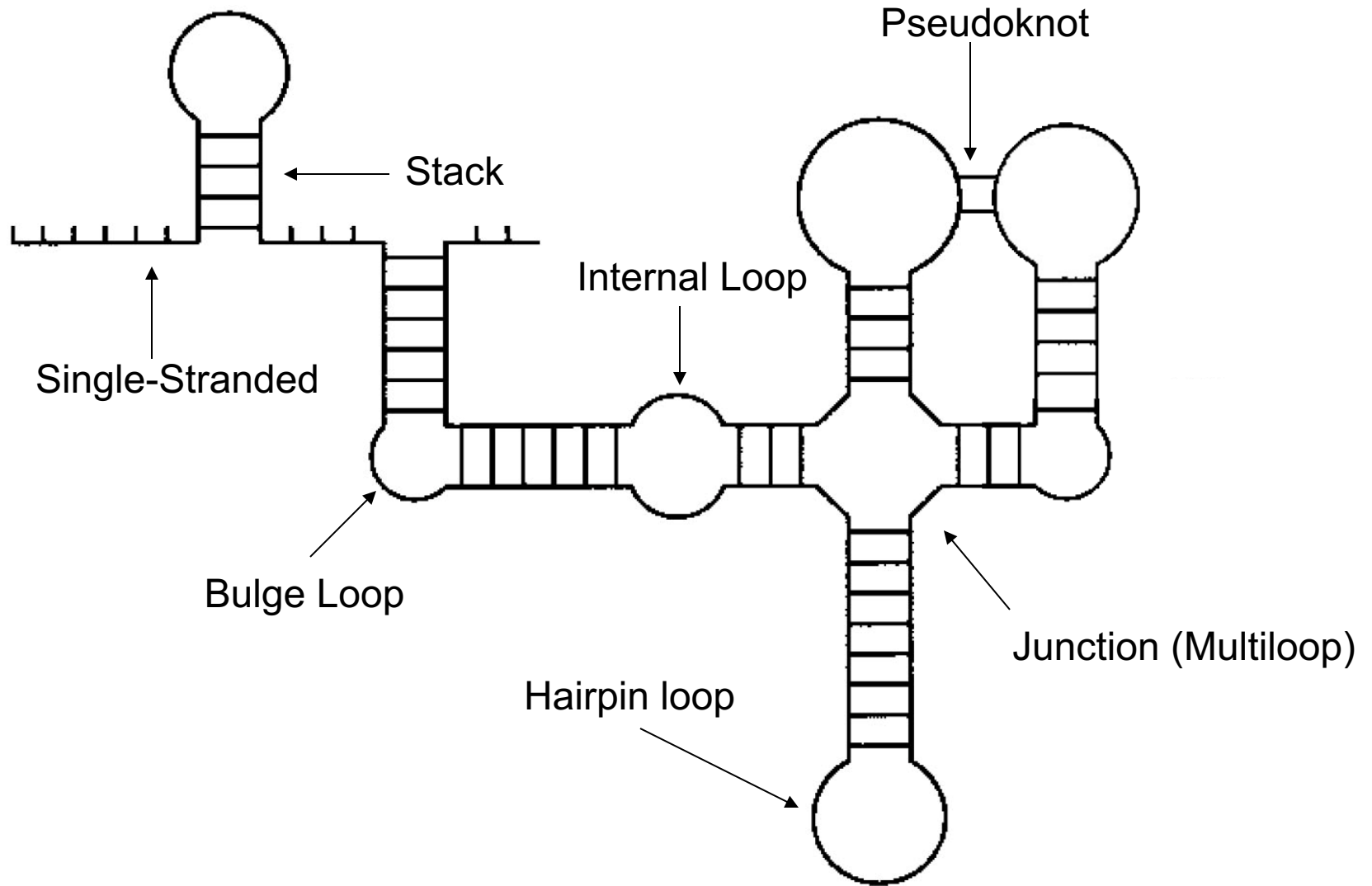


Secondary

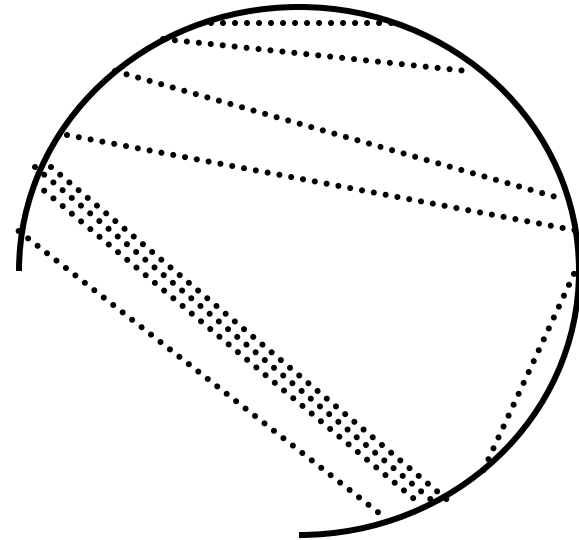
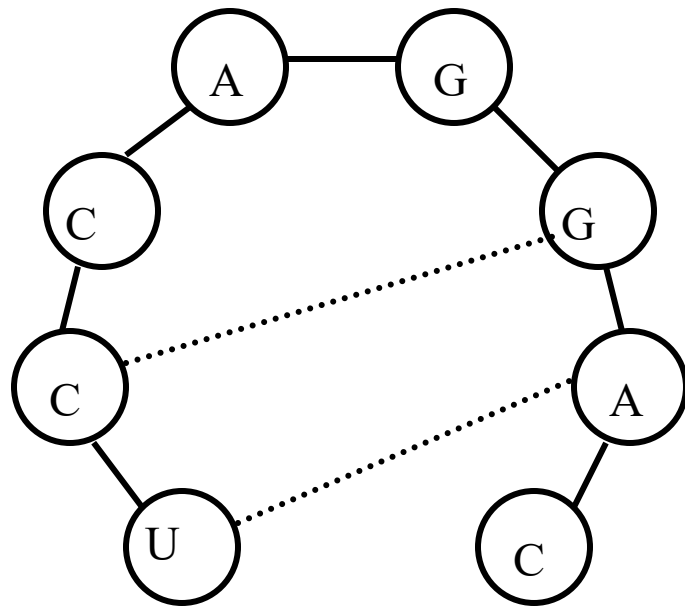


Tertiary

# RNA Secondary Structure



# Base Pair Maximization



# Base Pair Maximization – Dynamic Programming Algorithm

Simple Example:  
Maximizing Base Pairing

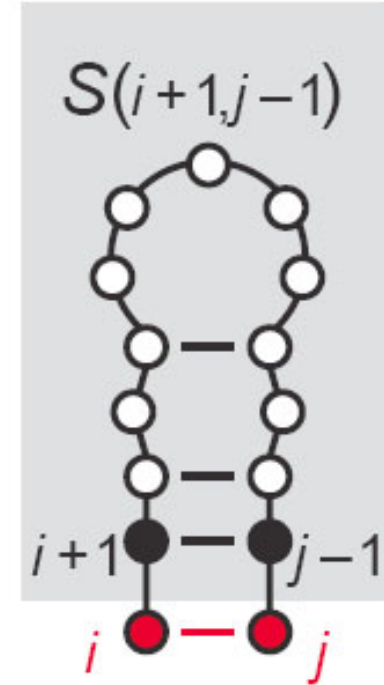
# Base Pair Maximization – Dynamic Programming Algorithm

$S(i,j)$  is the folding of the subsequence of the RNA strand from index  $i$  to index  $j$  which results in the highest number of base pairs

$$S(i,j) = \max \begin{cases} S(i+1, j-1) + 1 & [\text{if } i,j \text{ base pair}] \\ S(i+1, j) \\ S(i, j-1) \\ \max_{i < k < j} S(i, k) + S(k+1, j) \end{cases}$$

# Base Pair Maximization – Dynamic Programming Algorithm

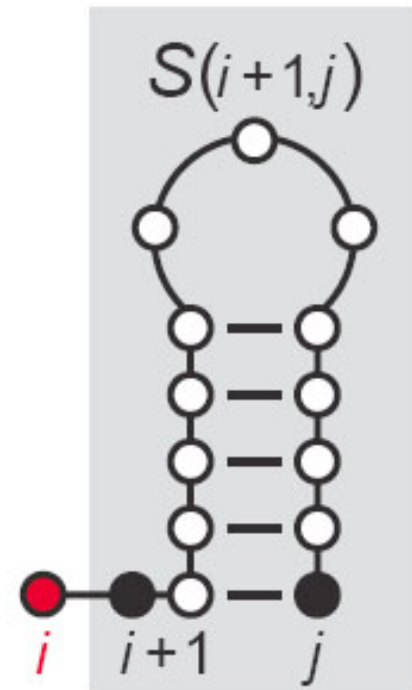
$$S(i,j) = \max \begin{cases} S(i+1,j-1) + 1 & \text{[if } i,j \text{ base pair]} \\ S(i+1,j) \\ S(i,j-1) \\ \max_{i < k < j} S(i,k) + S(k+1,j) \end{cases}$$





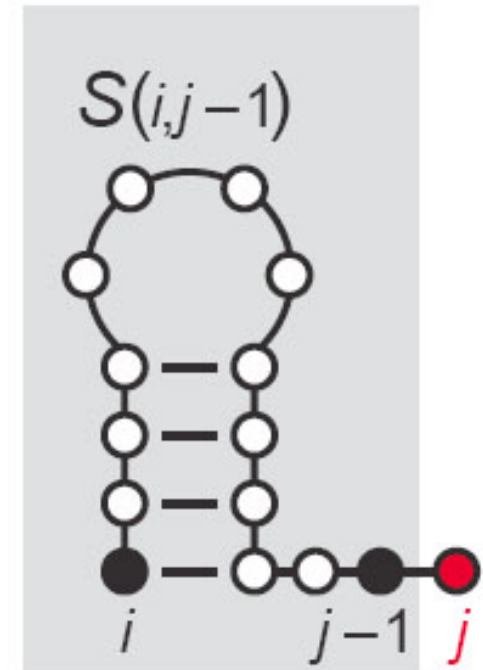
# Base Pair Maximization – Dynamic Programming Algorithm

$$S(i,j) = \max \begin{cases} S(i+1, j-1) + 1 & \text{[if } i,j \text{ base pair]} \\ S(i+1, j) \\ S(i, j-1) \\ \max_{i < k < j} S(i, k) + S(k+1, j) \end{cases}$$



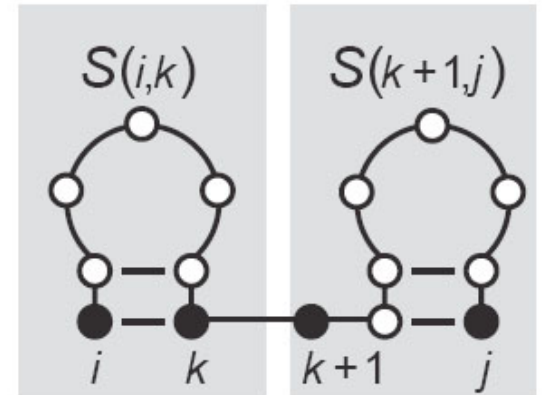
# Base Pair Maximization – Dynamic Programming Algorithm

$$S(i,j) = \max \begin{cases} S(i+1, j-1) + 1 & \text{[if } i, j \text{ base pair]} \\ S(i+1, j) \\ S(i, j-1) \\ \max_{i < k < j} S(i, k) + S(k+1, j) \end{cases}$$

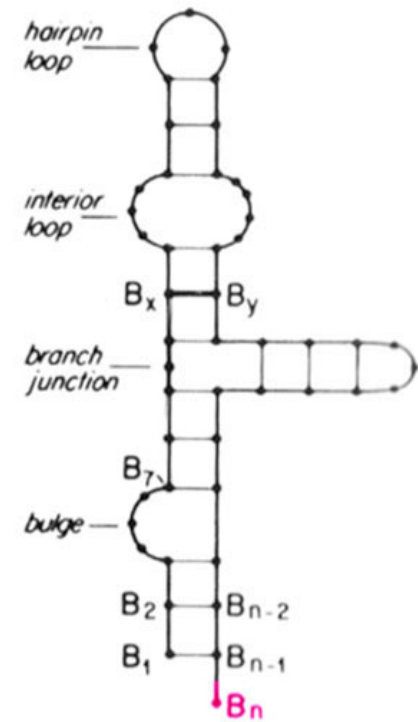
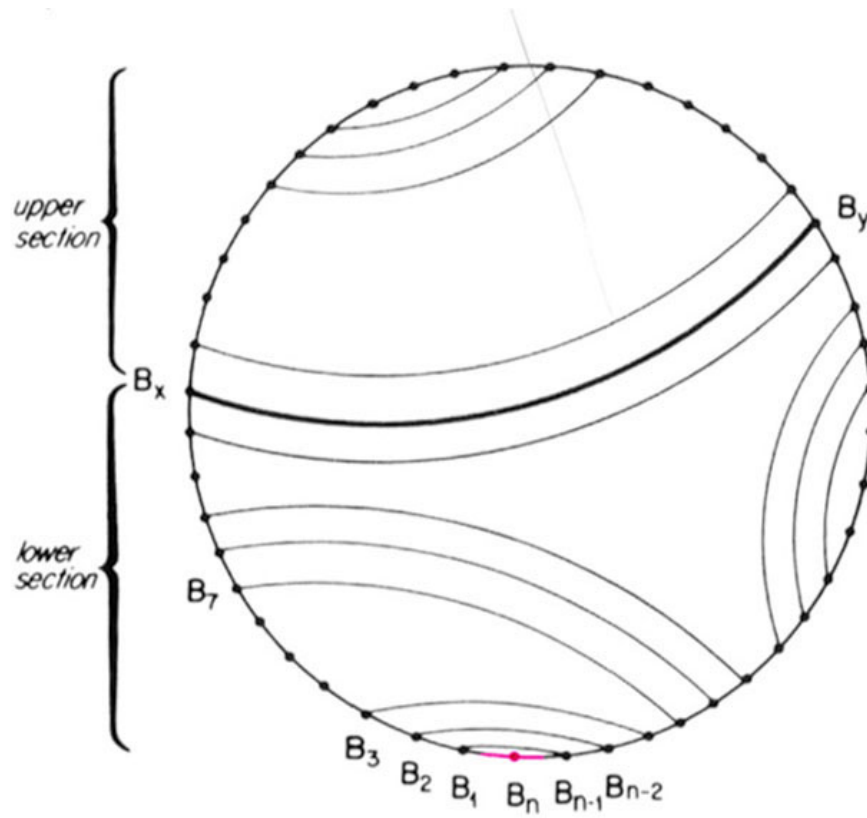


# Base Pair Maximization – Dynamic Programming Algorithm

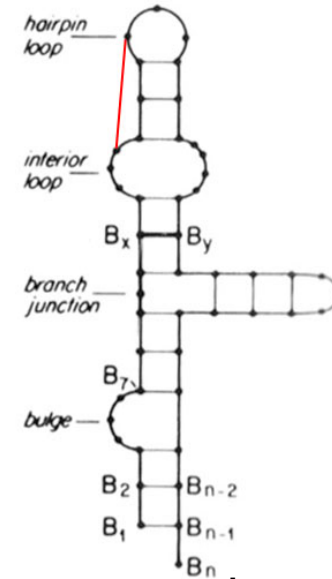
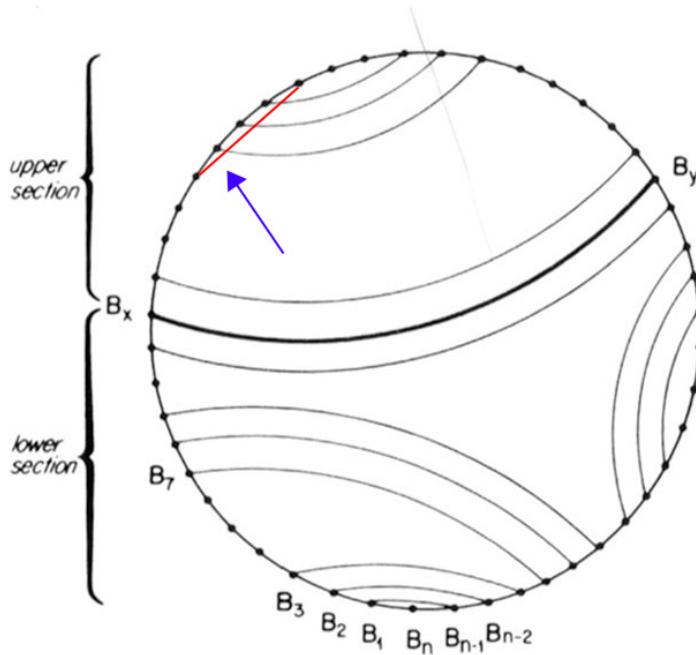
$$S(i,j) = \max \begin{cases} S(i+1, j-1) + 1 & \text{[if } i,j \text{ base pair]} \\ S(i+1, j) \\ S(i, j-1) \\ \max_{i < k < j} S(i, k) + S(k+1, j) \end{cases}$$



# Circular Representation



# Pseudoknots



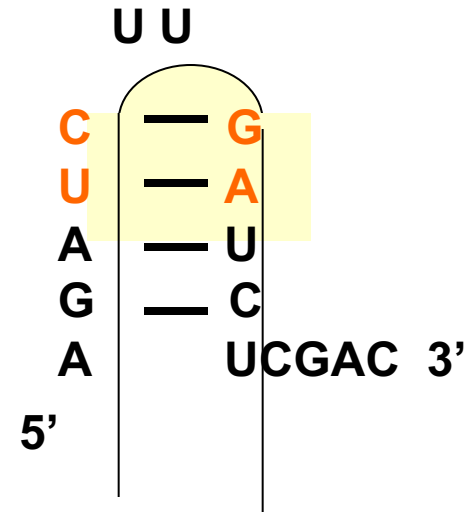
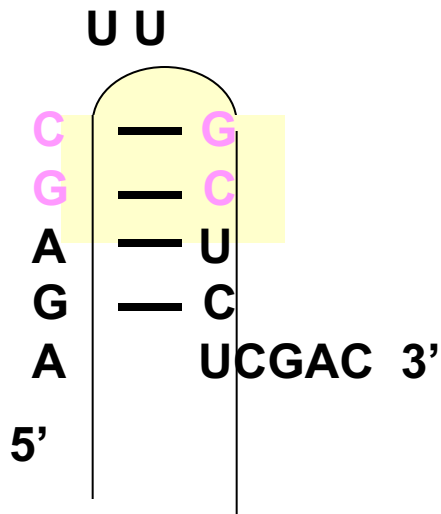
Images – David Mount

- Pseudoknots cause a breakdown in the presented Dynamic Programming Algorithm.
- In order to form a pseudoknot, checks must be made to ensure base is not already paired – this breaks down the divide and conquer recurrence relations.

# Simplifying Assumptions

- RNA folds into one minimum free-energy structure.
- There are no knots (base pairs never cross).
- The energy of a particular base pair in a double stranded region is sequence independent.
  - Neighbors do not influence the energy.
- Was solved by dynamic programming, Zucker and Steigler 1981

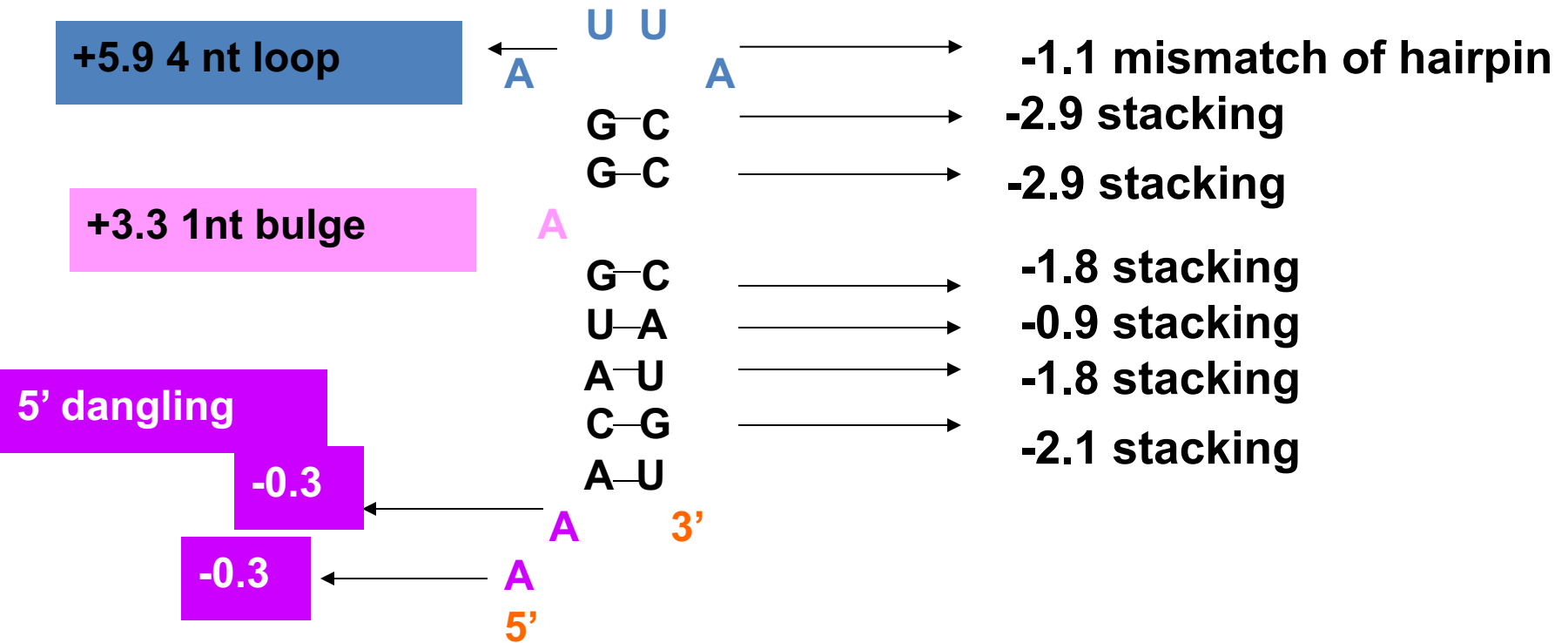
# Sequence Dependent Base Pair Energy Values (Nearest Neighbor Model)



**Example values:**

<b>GC</b>	<b>GC</b>	<b>GC</b>	<b>GC</b>
<b>AU</b>	<b>GC</b>	<b>CG</b>	<b>UA</b>
<b>-2.3</b>	<b>-2.9</b>	<b>-3.4</b>	<b>-2.1</b>

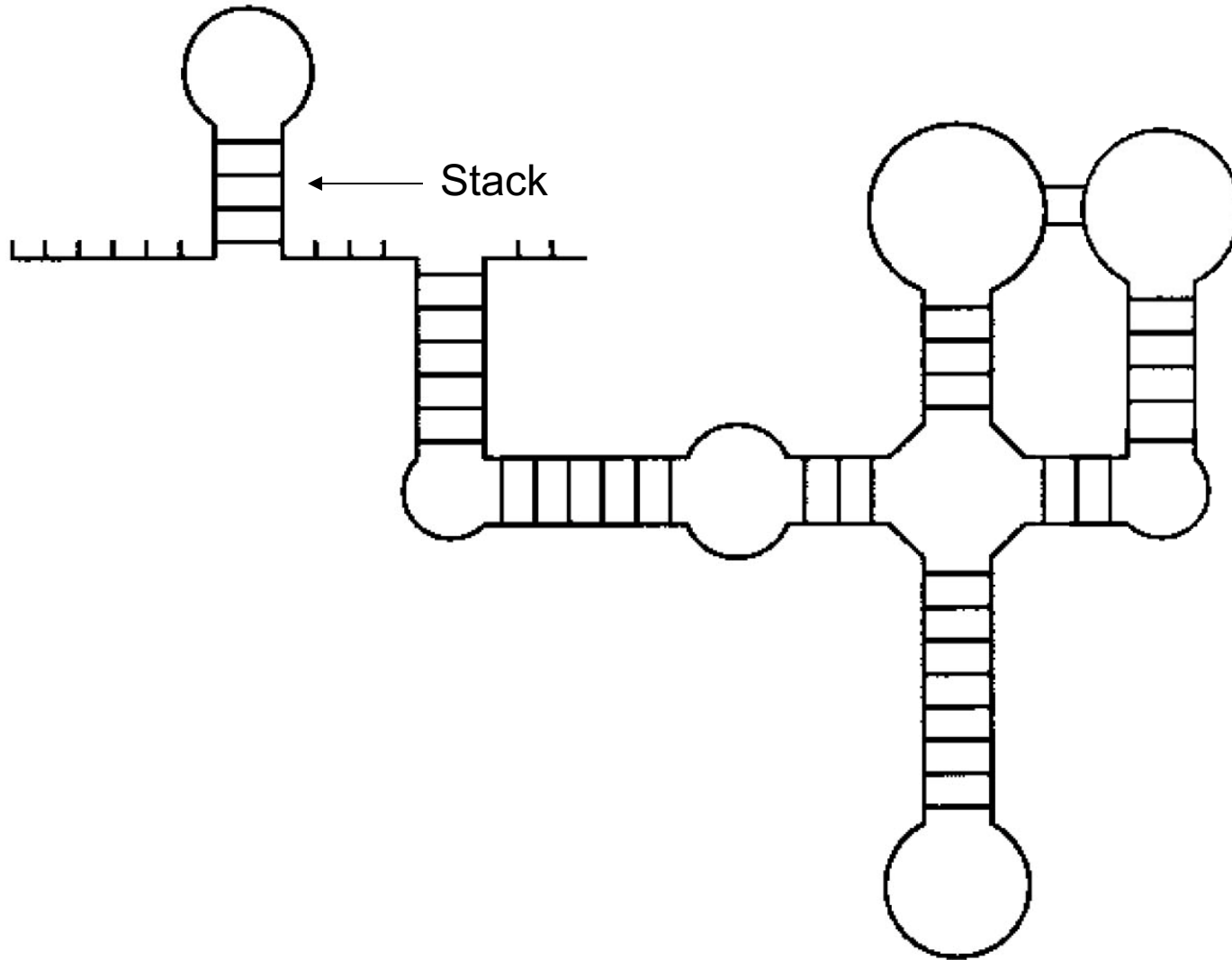
# Free Energy Computation (Nearest Neighbor Model)



$$\Delta G = -4.9 \text{ kcal/mol}$$



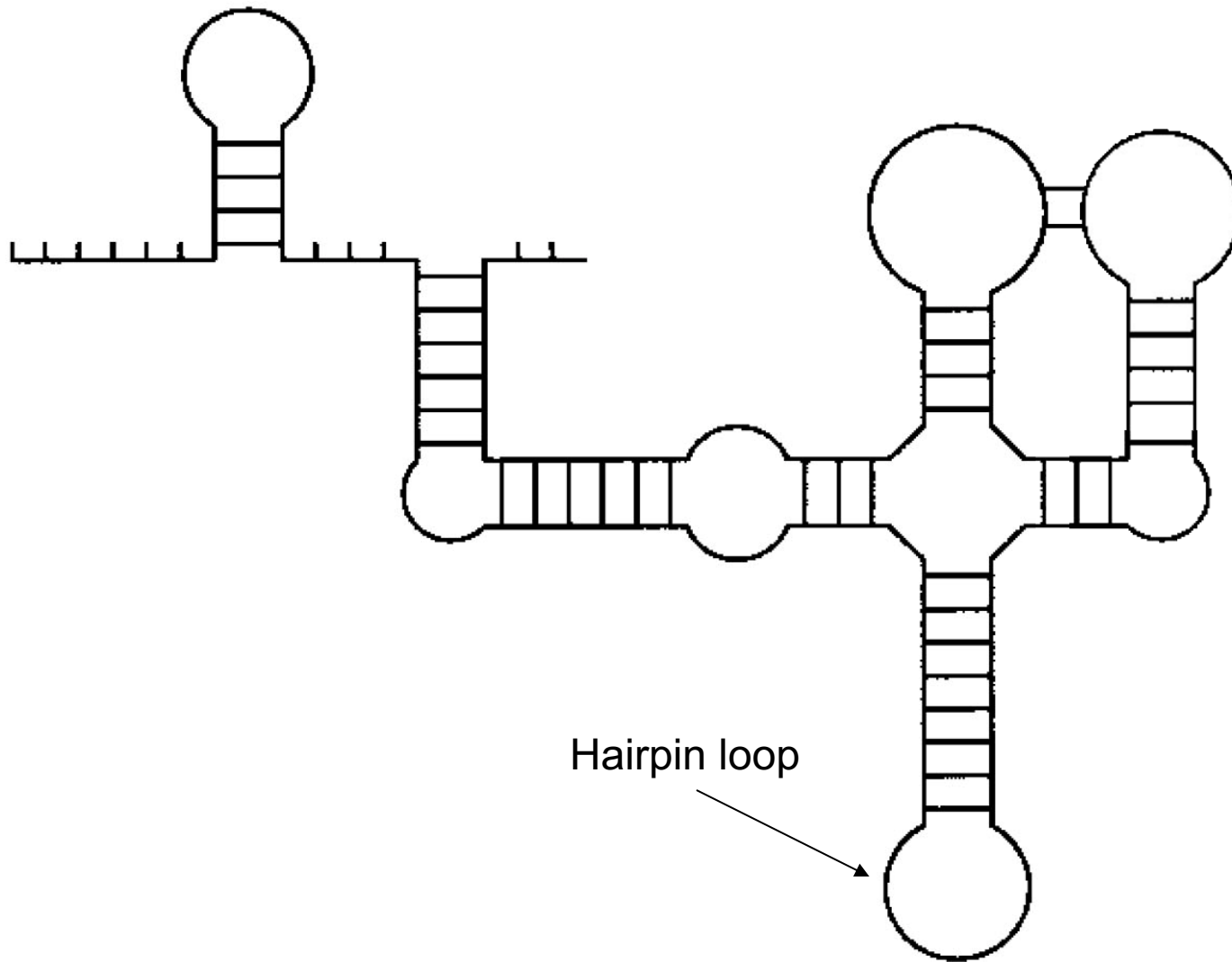
# RNA Secondary Structure



# Nearest Neighbor Model

- Stacking energy - assign negative energies to these *between base pair* regions.
  - Energy is influenced by the nearest closing base pair
  - These energies are estimated experimentally from small synthetic RNAs.
- Positive energy - added for low entropy regions such as bulges, loops, etc.

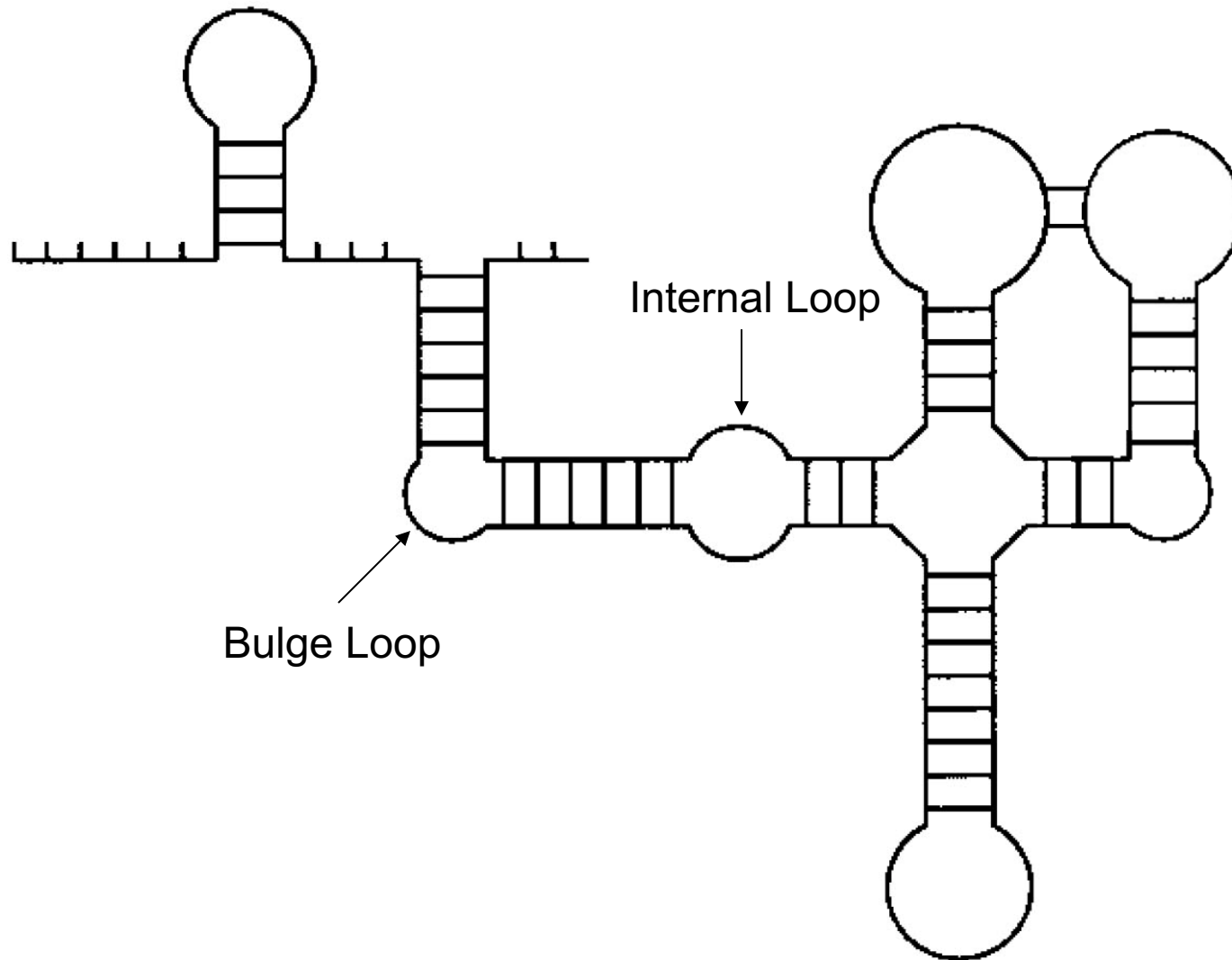
# RNA Secondary Structure



# Nearest Neighbor Model

- Hairpin energy:
  - Experimentally measured for hairpins of length 5, 6, 7, 8, ... up to a maximum. Extrapolation above the maximum.
  - The closing pair affects the energy. Distinguish between A-U and C-G.

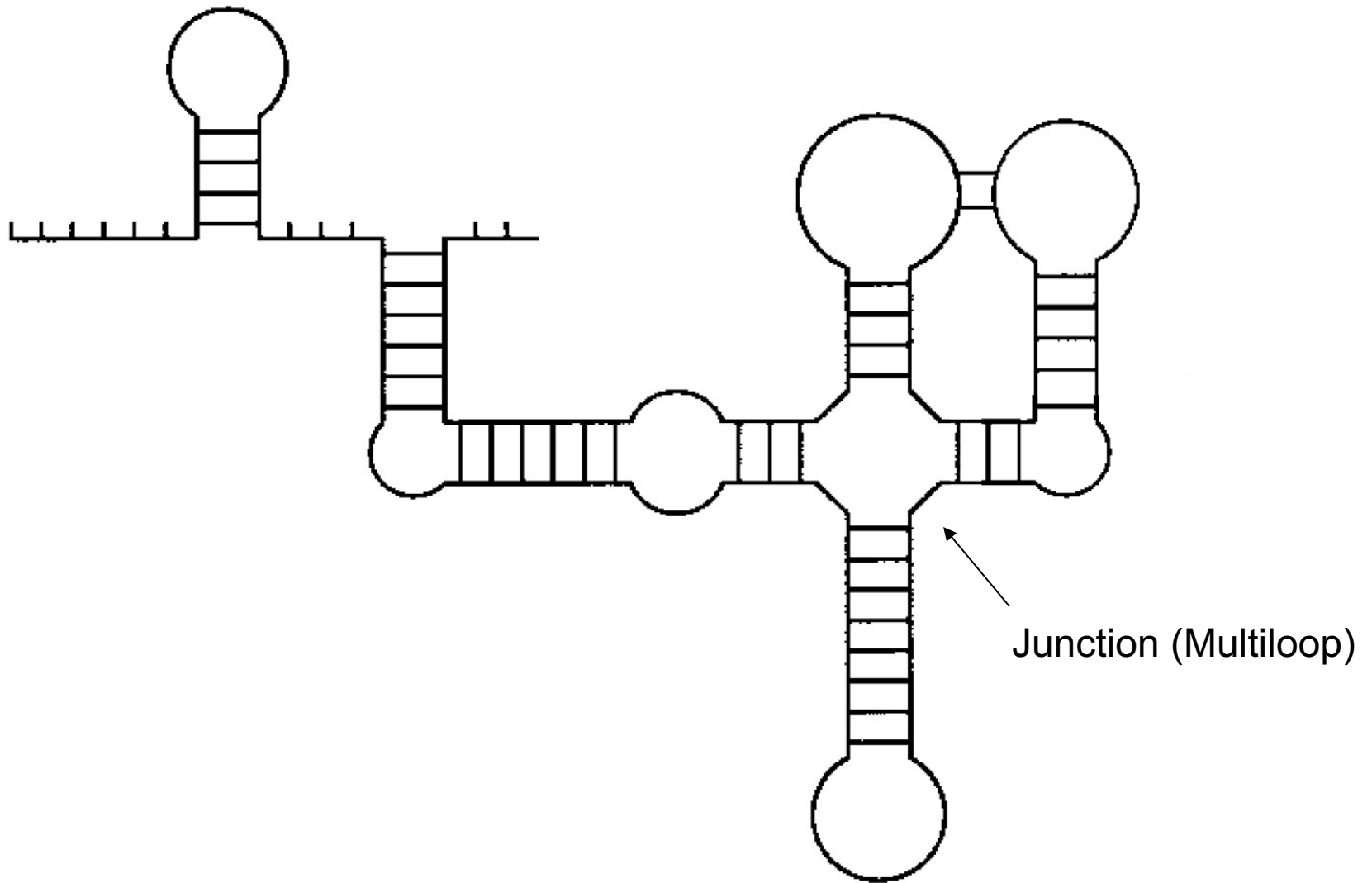
# RNA Secondary Structure



# Nearest Neighbor Model

- Bulge/Internal energy:
  - Let  $L_1$ ,  $L_2$  denote the lengths of the two sides of the bulge/internal loop.
  - Experimentally measured for different values of  $L_1$ ,  $L_2$ .
  - In practice for computational convenience, the energy is given as function of  $L_1 + L_2$  by a lookup table and extrapolation.

# RNA Secondary Structure



# Nearest Neighbor Model

- Multiloop energy:
  - Let  $U$  denote the number of unpaired bases.
  - Let  $P$  denote the number of base pairs.
  - The free energy is an affine function of  $U$  and  $P$ :

$$a_1 + a_2 U + a_3 P.$$

- This is the least accurate component of the NN model.