

# CSE 428

# Computational Biology Capstone

A Quick Tour of RNA: Function &  
Secondary Structure Prediction

# The Message

Cells make lots of RNA ~~noncoding~~ RNA

Functionally important, functionally diverse

Structurally complex

New tools required

alignment, discovery, search, scoring, etc.

# RNA

DNA: DeoxyriboNucleic Acid

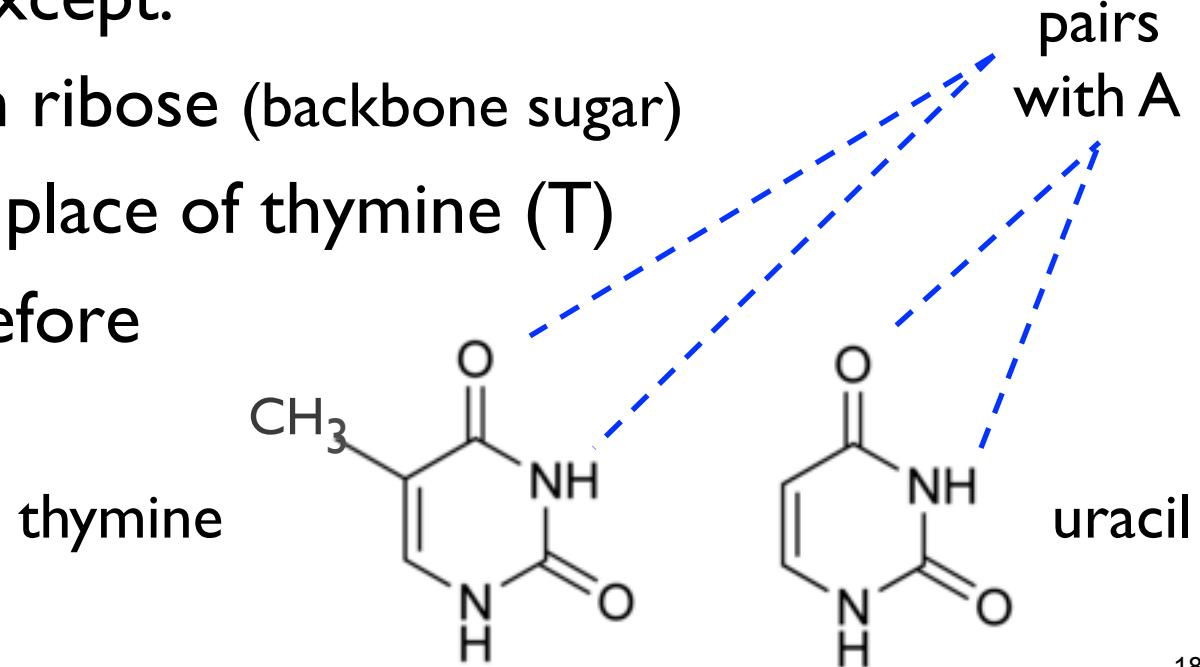
RNA: RiboNucleic Acid

Like DNA, except:

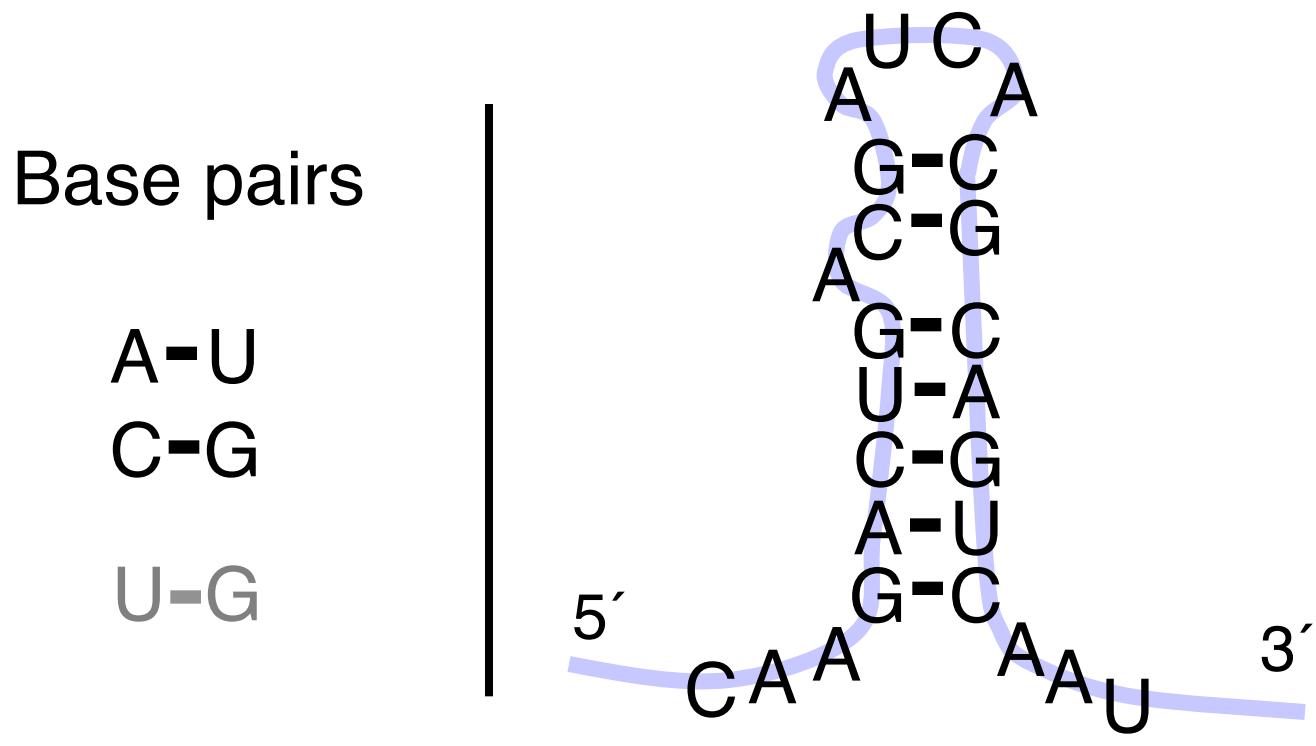
Lacks OH on ribose (backbone sugar)

Uracil (U) in place of thymine (T)

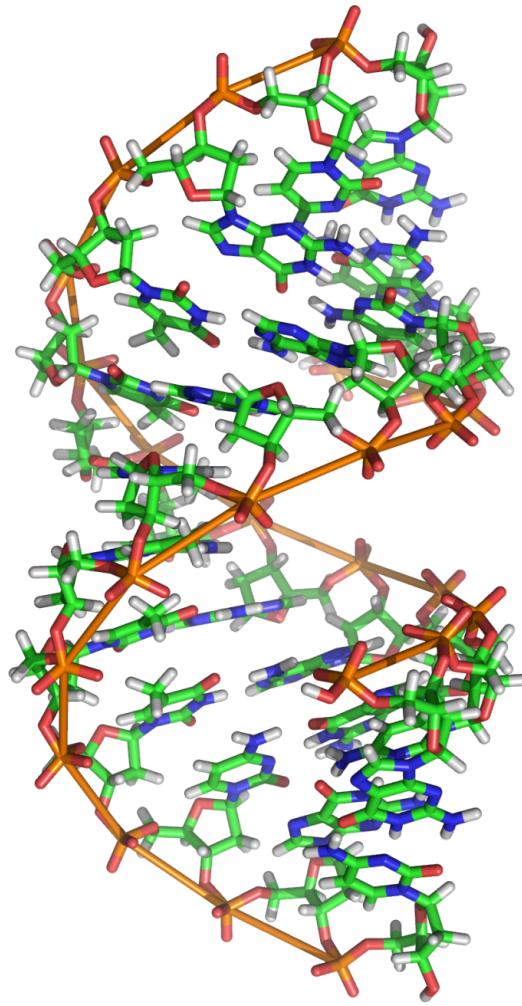
A, G, C as before



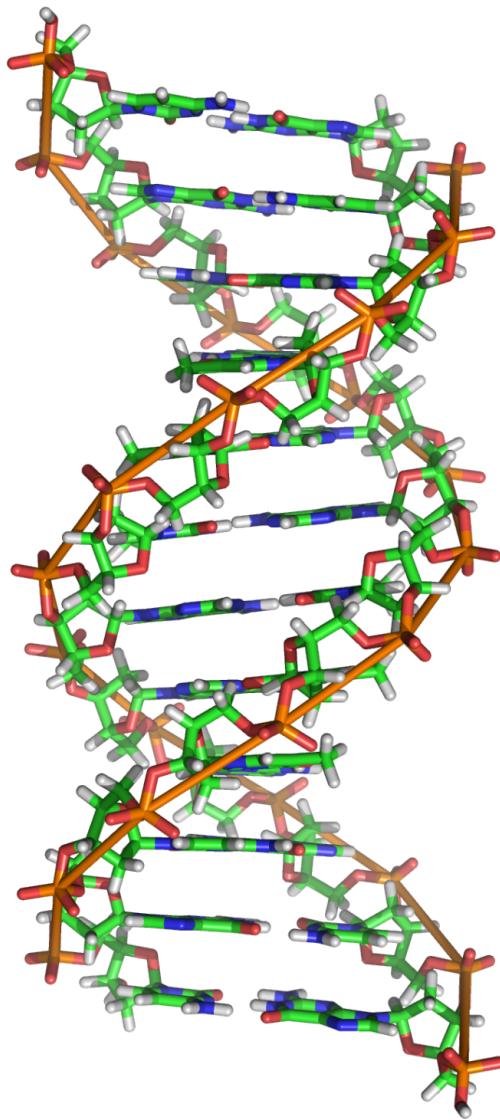
# RNA Secondary Structure: RNA makes helices too



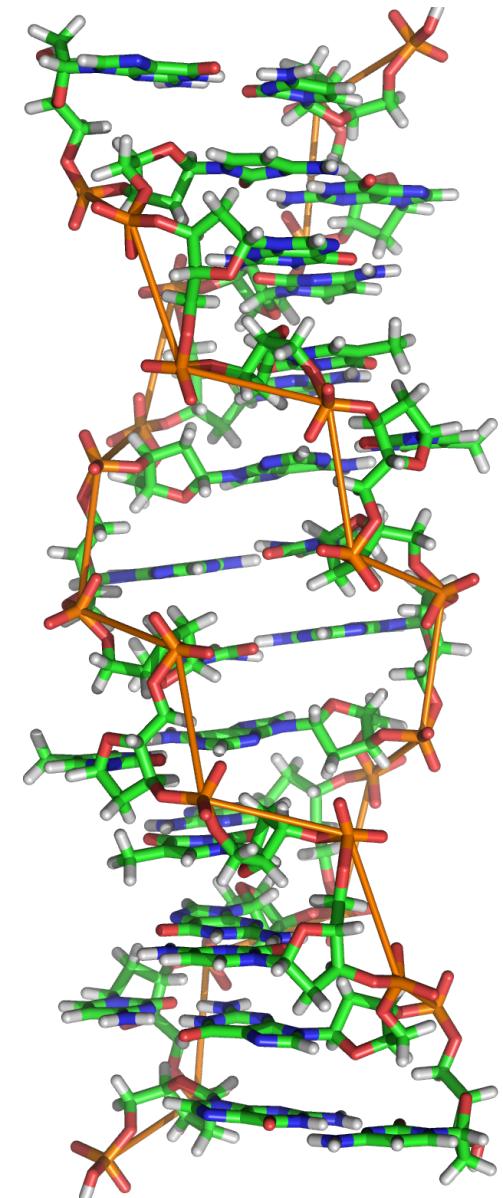
Usually *single* stranded



**A**  
(norm for RNA)



**B**  
(norm for DNA)



**Z**

# Central Dogma of Molecular Biology

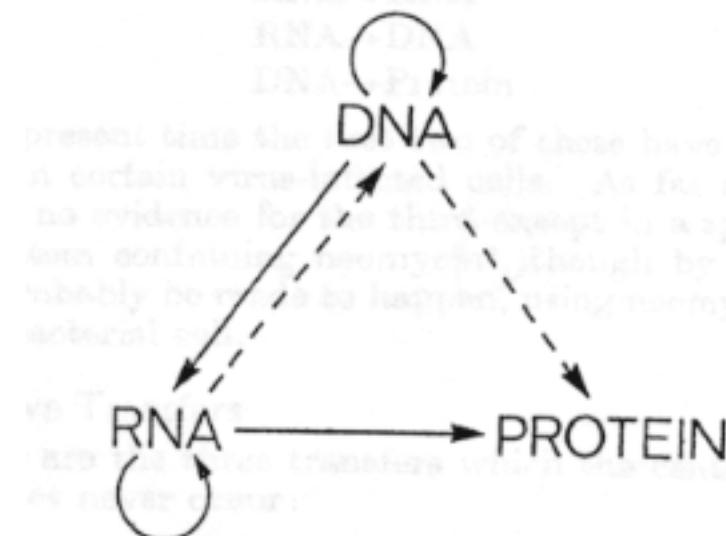
by

FRANCIS CRICK  
MRC Laboratory  
Hills Road,  
Cambridge CB2 2QH

The central dogma of molecular biology deals with the detailed residue-by-residue transfer of sequential information. It states that such information cannot be transferred from protein to either protein or nucleic acid.

"The central dogma, enunciated by Crick in 1958 and the keystone of molecular biology ever since, is likely to prove a considerable over-simplification."

Fig. 2. The arrows show the situation as it seemed in 1958. Solid arrows represent probable transfers, dotted arrows possible transfers. The absent arrows (compare Fig. 1) represent the impossible transfers postulated by the central dogma. They are the three possible arrows starting from protein.



# Ribosomes

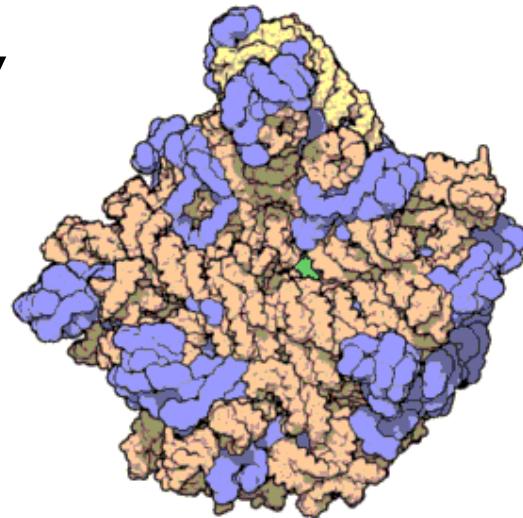
1974 Nobel prize to Romanian biologist George Palade (1912-2008) for discovery in mid 50's

50-80 proteins

3-4 RNAs (half the mass)

Catalytic core is RNA

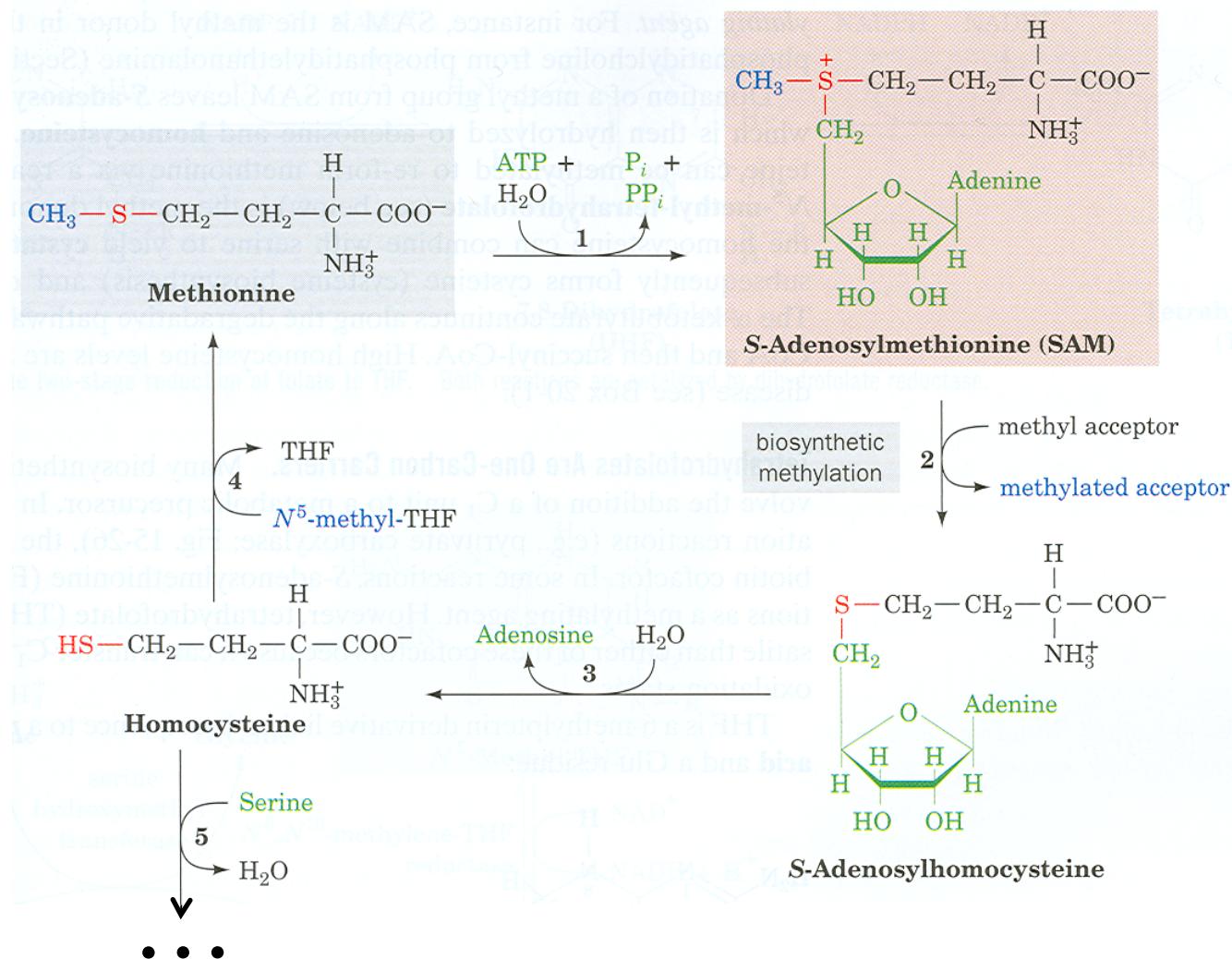
Of course, mRNAs and tRNAs (messenger & transfer RNAs) are critical too



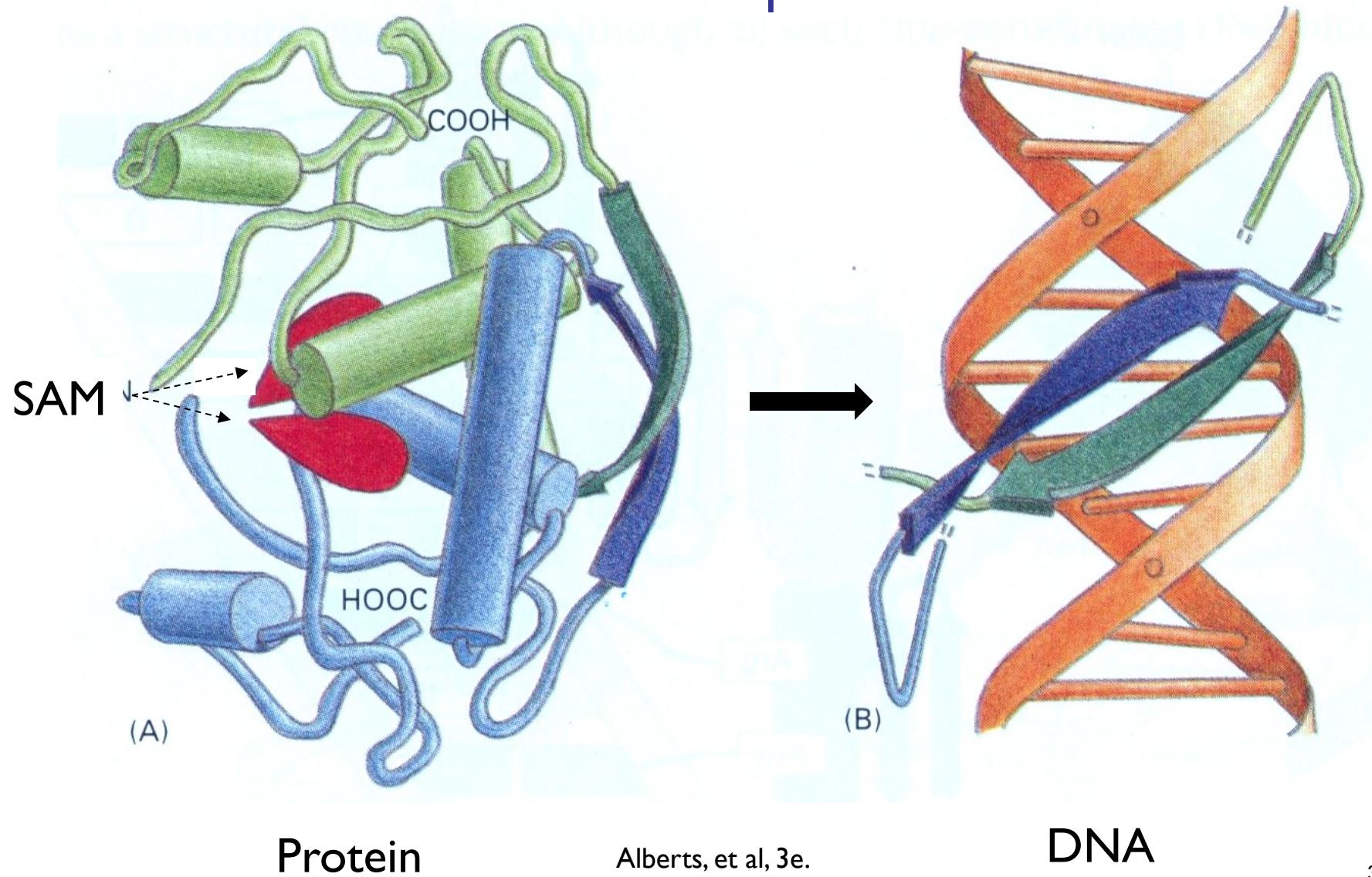
Atomic structure of the 50S Subunit from *Haloarcula marismortui*. Proteins are shown in blue and the two RNA strands in orange and yellow. The small patch of green in the center of the subunit is the active site.

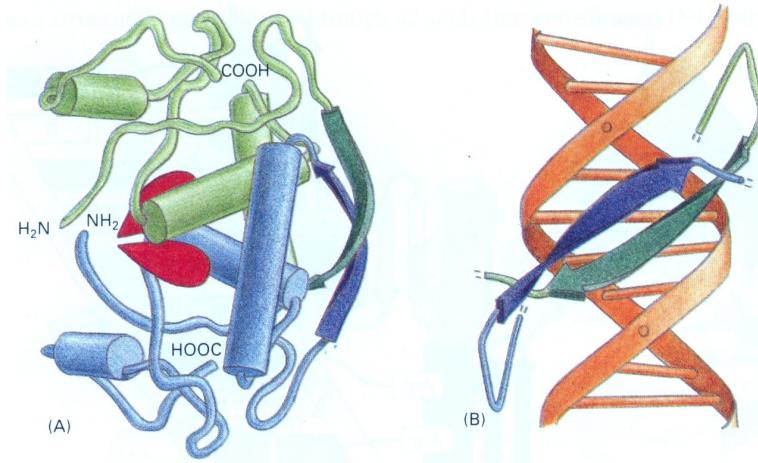
- Wikipedia

# Proteins Catalyze Biochemistry: Met Pathways



# Proteins Regulate Biochemistry: The MET Repressor

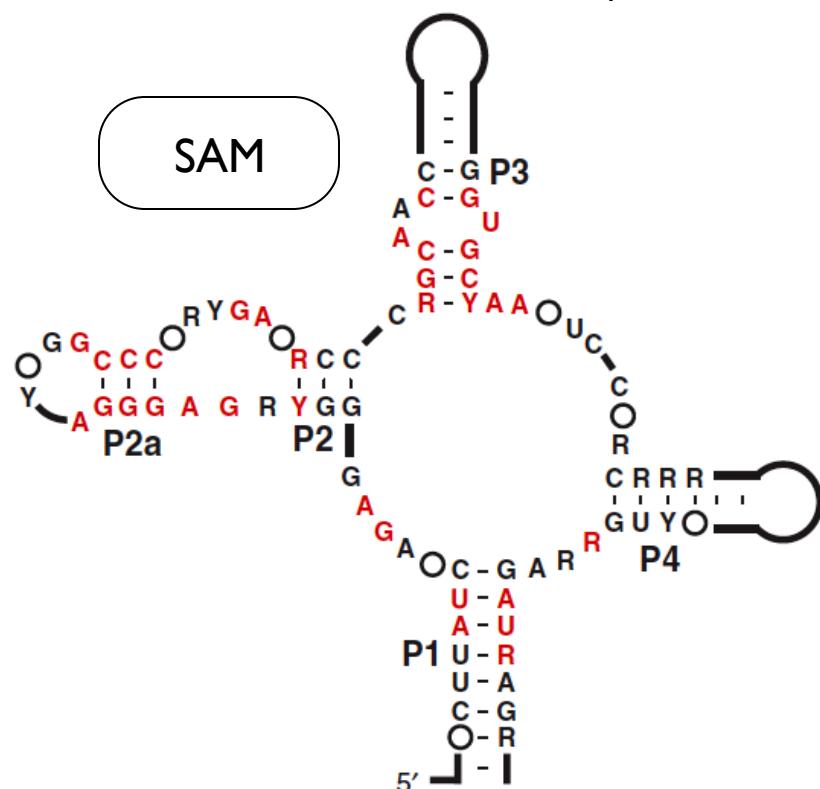




Not the only way!

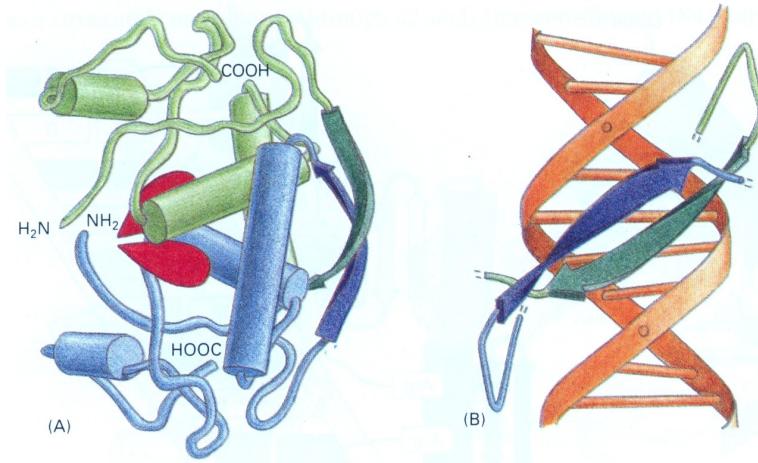
Protein  
way

Riboswitch  
alternative



Grundy & Henkin, Mol. Microbiol 1998  
Epshtein, et al., PNAS 2003  
Winkler et al., Nat. Struct. Biol. 2003

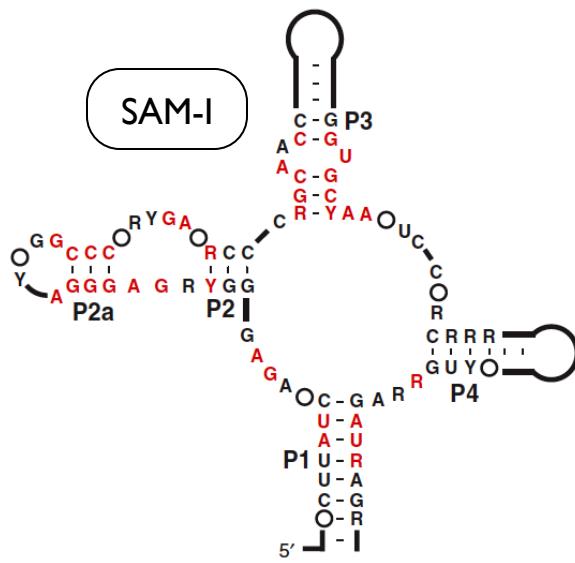
Alberts, et al, 3e.



# Not the only way!

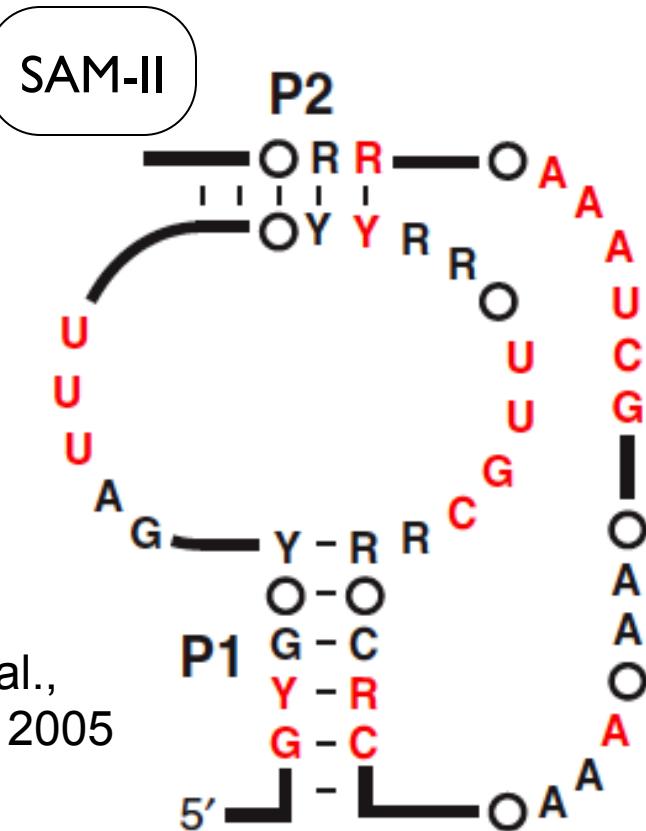
Protein  
way

Riboswitch  
alternatives

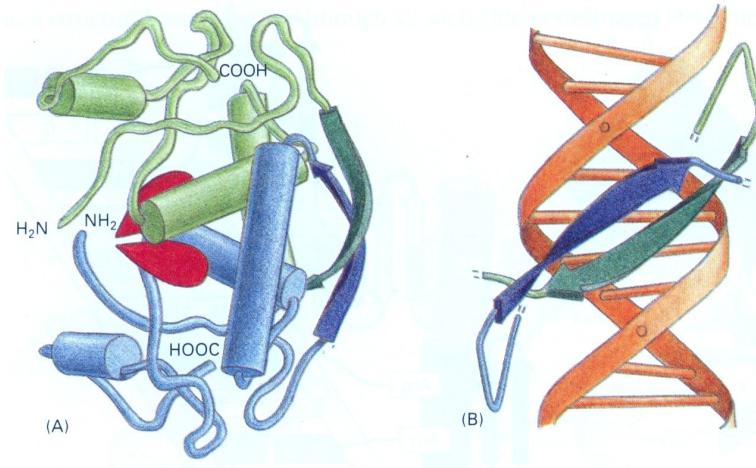


Grundy, Epshteyn, Winkler  
et al., 1998, 2003

Corbino et al.,  
Genome Biol. 2005



Alberts, et al, 3e.



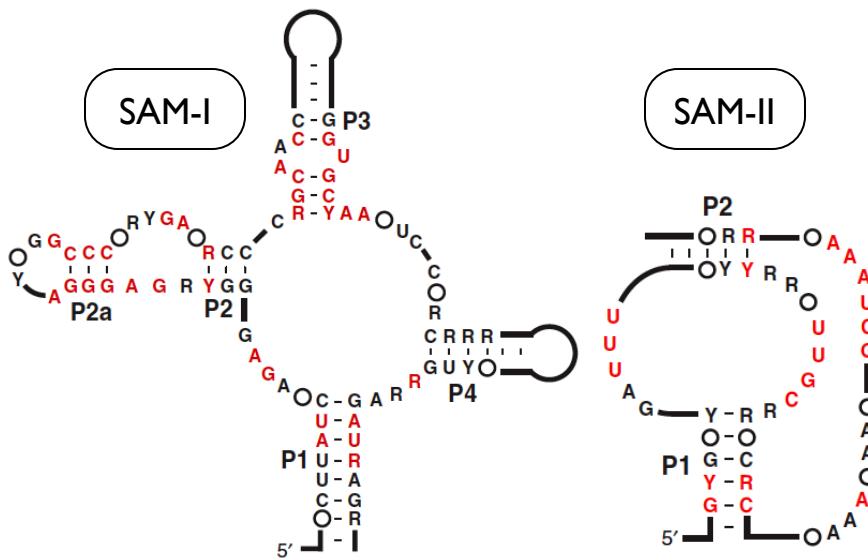
# Not the only way!

Protein  
way

Riboswitch  
alternatives



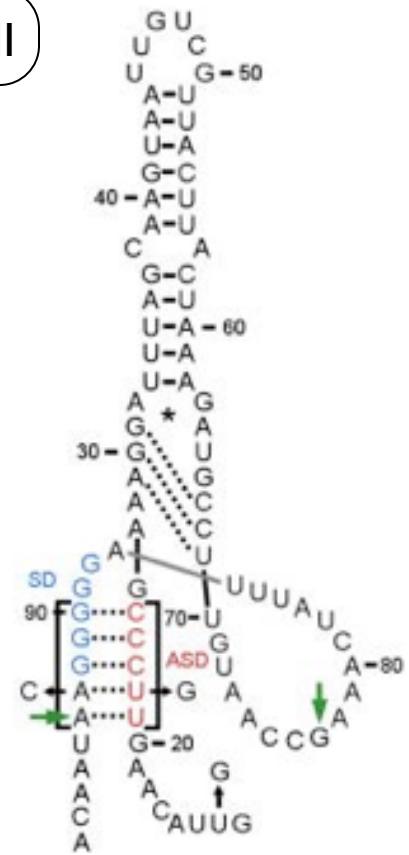
SAM-III

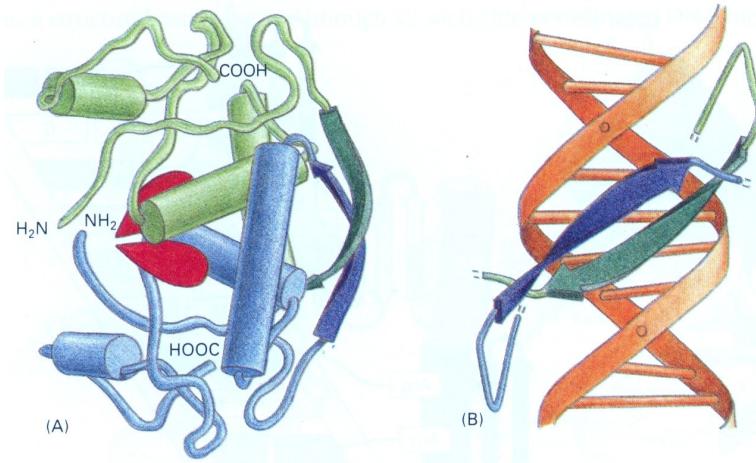


Grundy, Epshteyn, Winkler  
et al., 1998, 2003

Corbino et al.,  
Genome Biol. 2005

Fuchs et al.,  
NSMB 2006

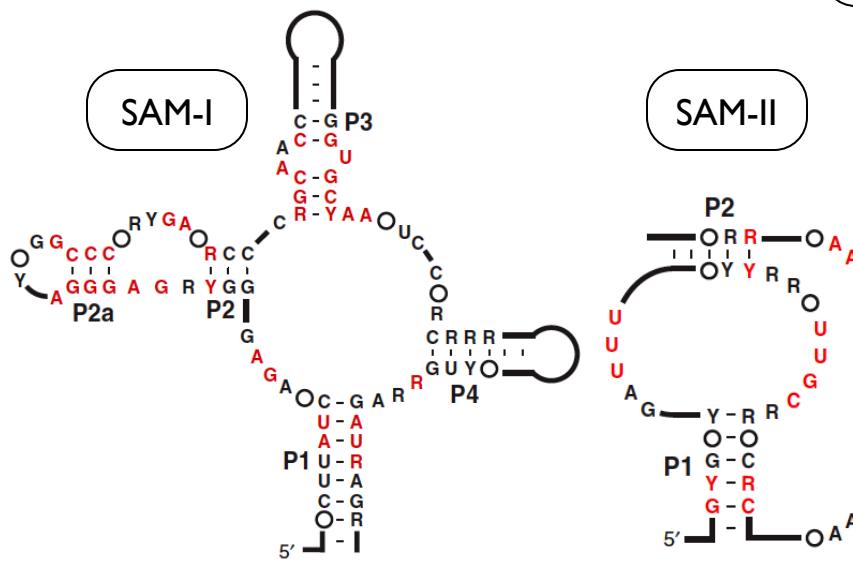




# Not the only way!

Protein  
way

Riboswitch  
alternatives

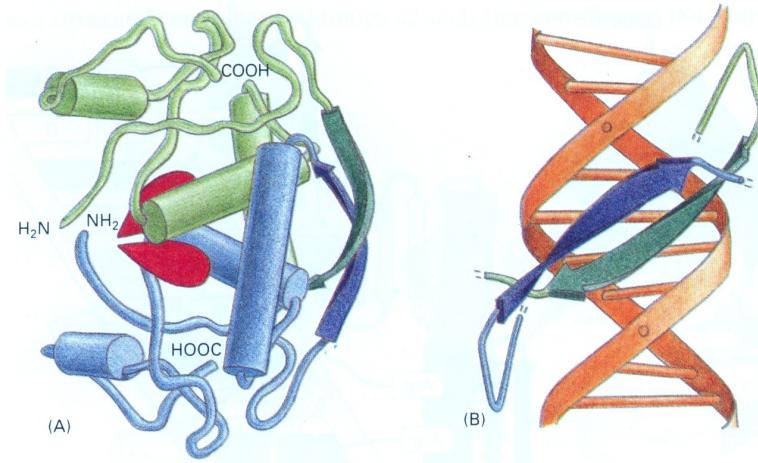


Grundy, Epshtein, Winkler  
et al., 1998, 2003

Corbino et al.,  
Genome Biol. 2005

Fuchs et al.,  
NSMB 2006

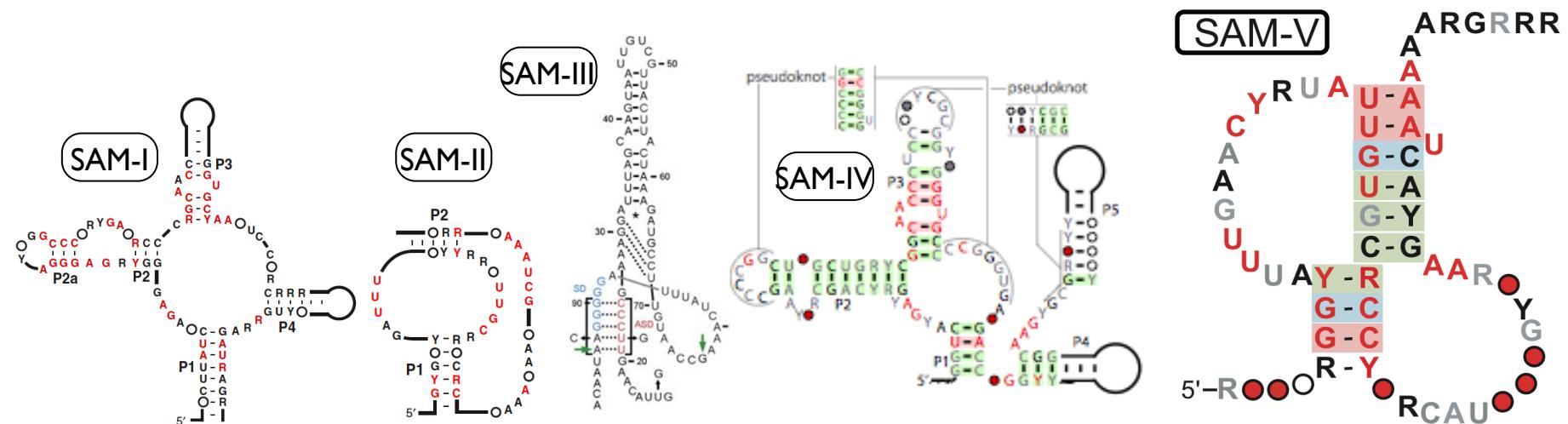
Weinberg et al.,  
RNA 2008



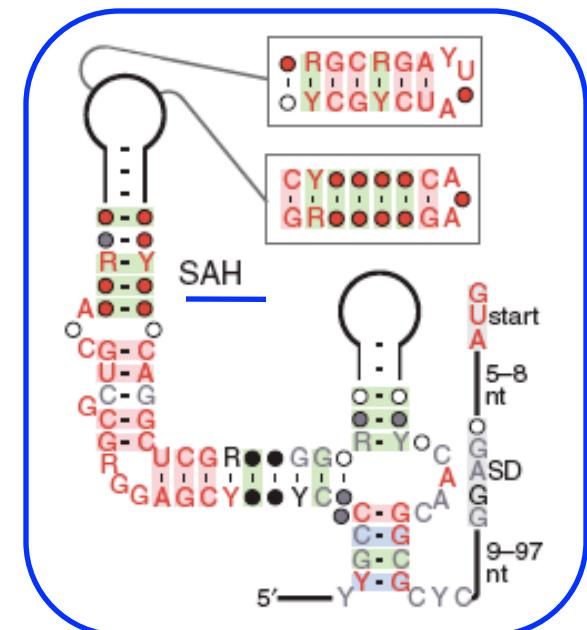
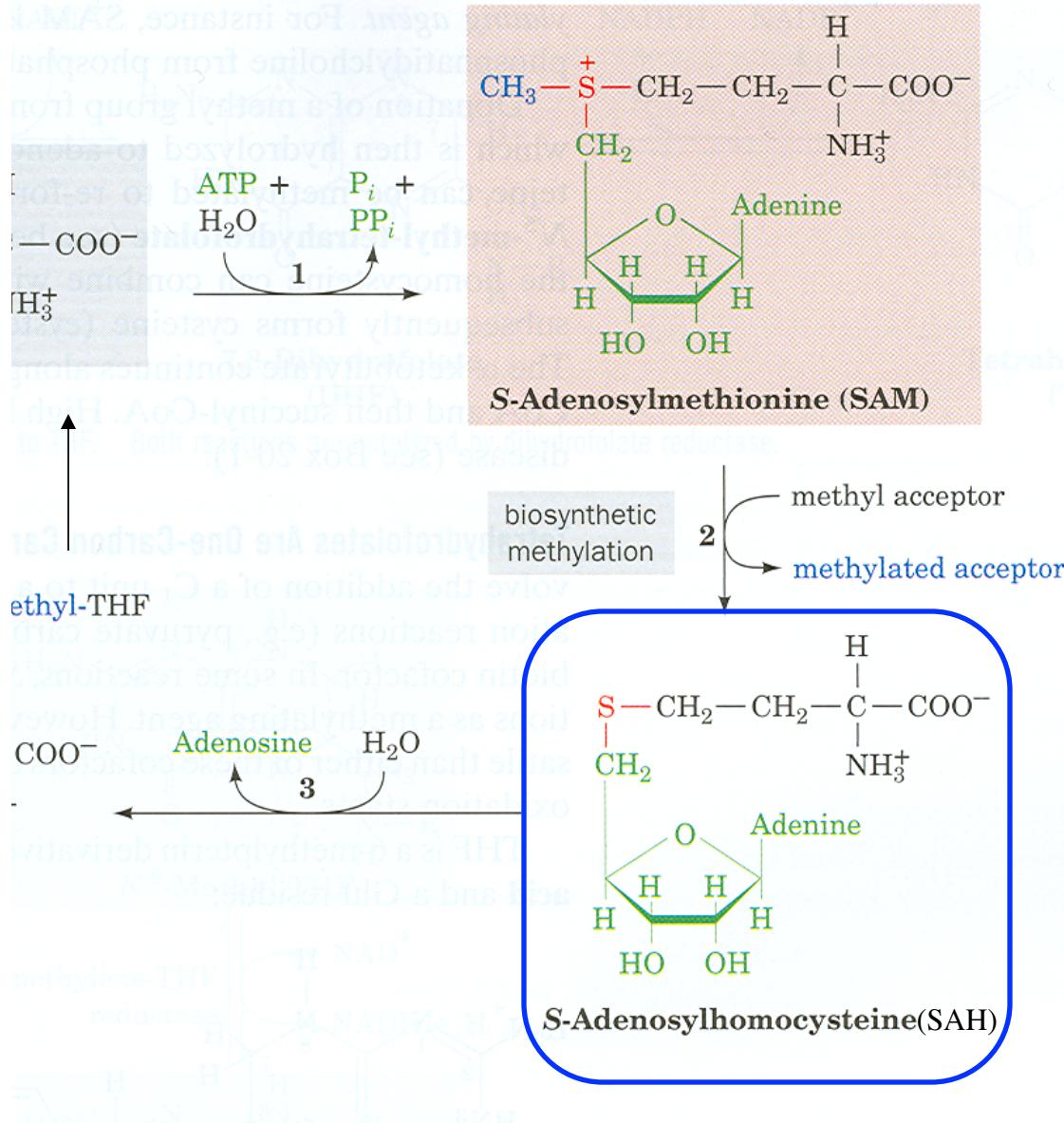
# Not the only way!

Protein  
way

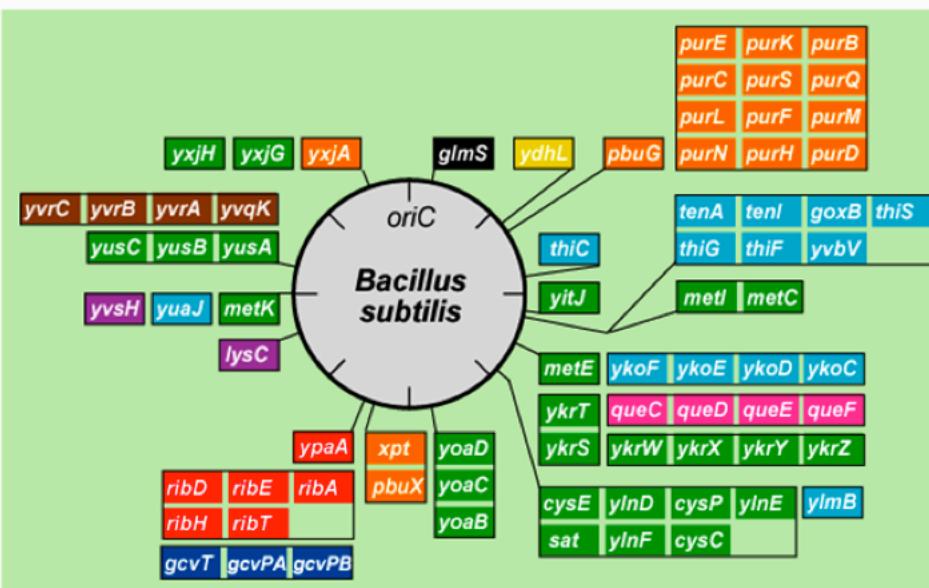
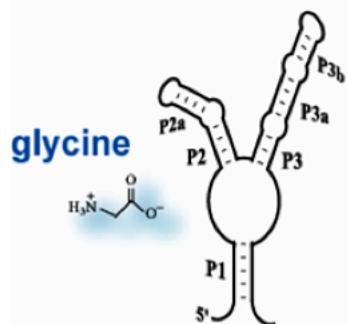
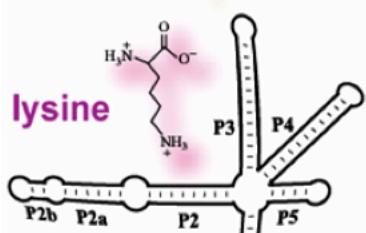
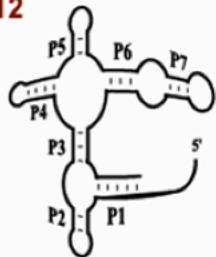
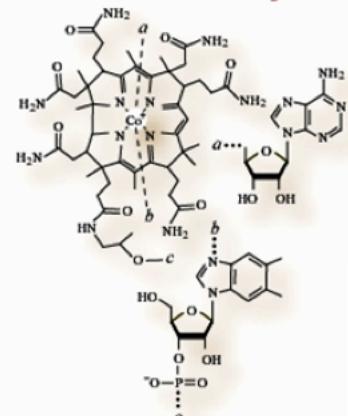
Riboswitch  
alternatives



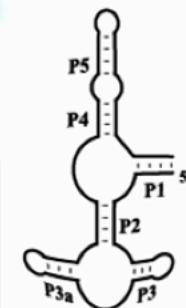
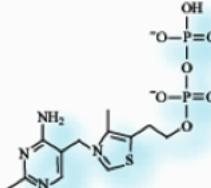
# And in other bacteria, a riboswitch senses SAH



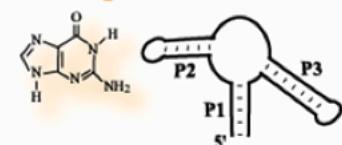
### coenzyme B12



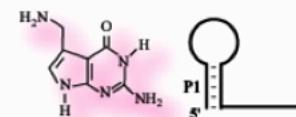
### thiamine pyrophosphate



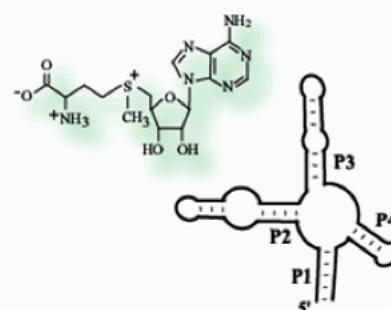
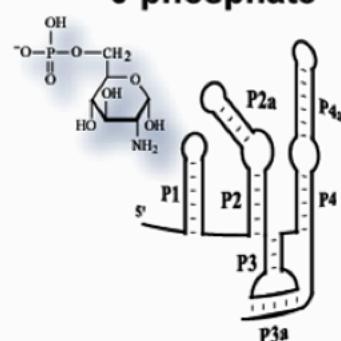
### guanine



### pre-queosine 1



### glucosamine-6-phosphate



### S-adenosyl-methionine

# Antibiotics?

Old drugs, new understanding:

TPP ~ pyrithiamine

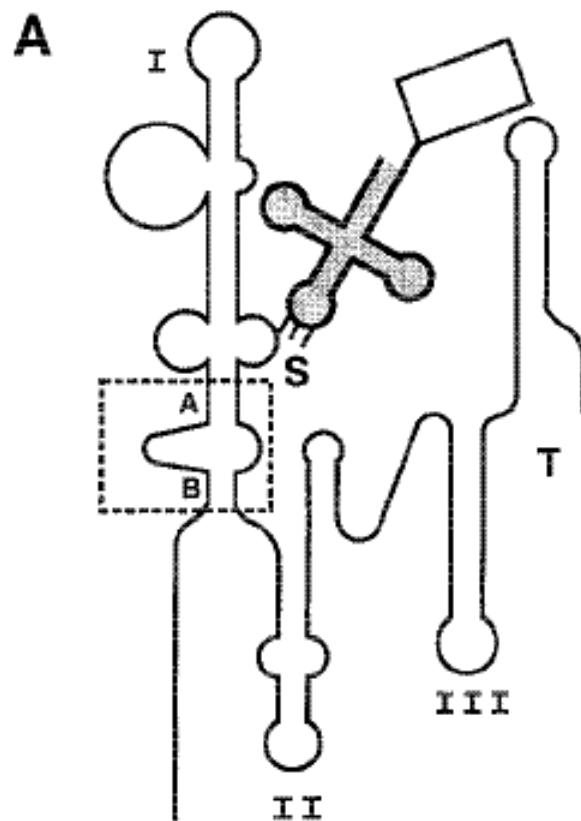
lysine ~ L-aminoethylcysteine, DL-4-oxalysine

FMN ~roseoflavin

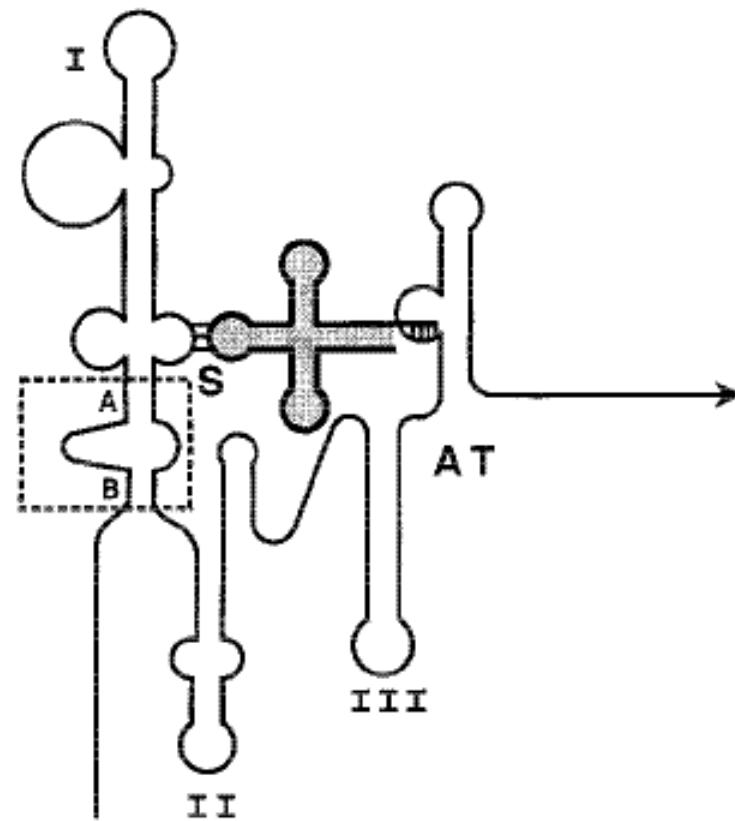
Potential advantages - no (known) human  
riboswitches, but often multiple copies in bacteria

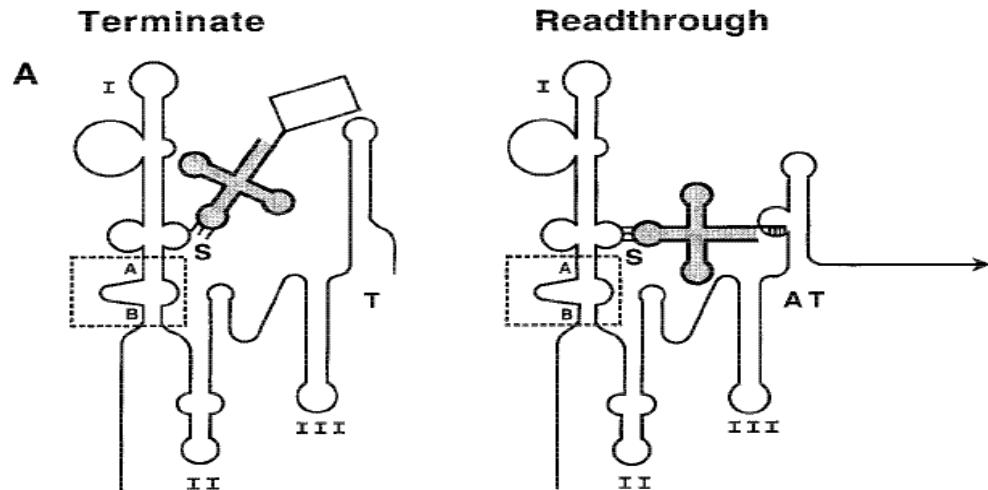
# ncRNA Example: T-boxes

Terminate



Readthrough





NC\_000964.1 AUAUC.CUUACGU..UCCAGAGAGCUGAUGGCCGGUGAAA.AUCAGCACAGACGGAU**AUAU**

NC\_004722.1 CAAAU.GUCGUUUcUUAUAGAGAGAGUCGAUGGUUGGUGGAA.AUCGAUAG..AACAGUUUG

NC\_004193.1 AAAAGUAGAACCG.ACUUAGCGAAUUGAGGAU.GGUGUGAGCUCAGUGC.GGAAAG**C**UUUU

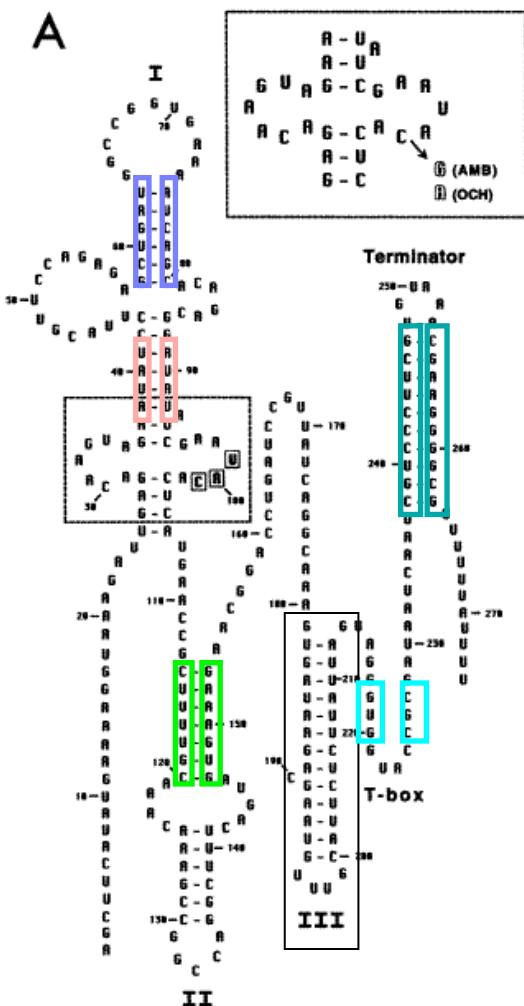
NC\_003997.3 CAAAU.GUCGUUUcUUAUAGAGAGAGUCGAUGGUUGGUGGAA.AUCGAUAG..AACAGUUUG

NC\_000964.1 CGAA..UACACUCAUGAACCG**CUUUUGCAAACAAAGccggccaggcuuucAGUA**.GUGAAAG

NC\_004722.1 UGAA..UCCAUCUGGAAU..**GGAAUGUGGAAU**AUCUuuuggauu.....AGUAAGCAUUCC

NC\_004193.1 AGAAA**AUC.ACUCUUGAGUU**.UUCAUUACGAAA..CA.....AGUAG**GUAAUGGA**

NC\_003997.3 UGAA..UCCAUCUGGAAU..**GGAAUGUGGAAU**AUCUuuugauu.....AGUAAACAUUCC



NC\_000964.1 acggac.CUGAUCCGUUAUCAGGCAAAGUGGUACCGCGAUAAUCAUCGUCCCCUUCGUGUAAaCGAAGGGGCGUUU

NC\_004722.1 .CGGUG.AAGAGCCGUUAUU...UCuAGUGGCAACCGGG..GUUAACUCCCUGUCCCUUUAUuAGGGACGGGAGUU

NC\_004193.1 .CGGUUC**AUC.UCCGUUAUCGAUCUUAGUGGUACCGCGA**....GUCUUCUCGUCCCCUUUU..GGGAUUAGAAGGC

NC\_003997.3 .CGGUG.AAGAGCCGUUAUU...UCuAGUGGCAACCGGG..GUUAACUCCCUGUCCCUUUAUuAGGGACGGGAGUU

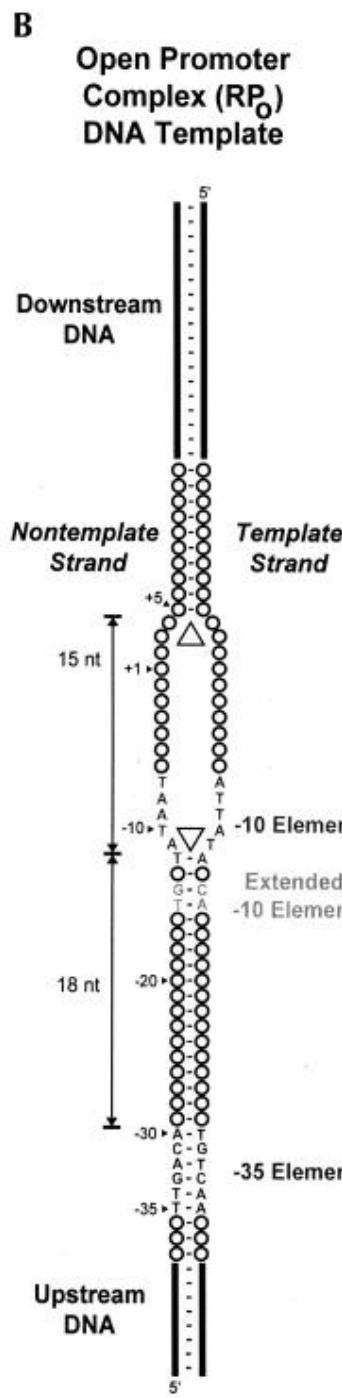
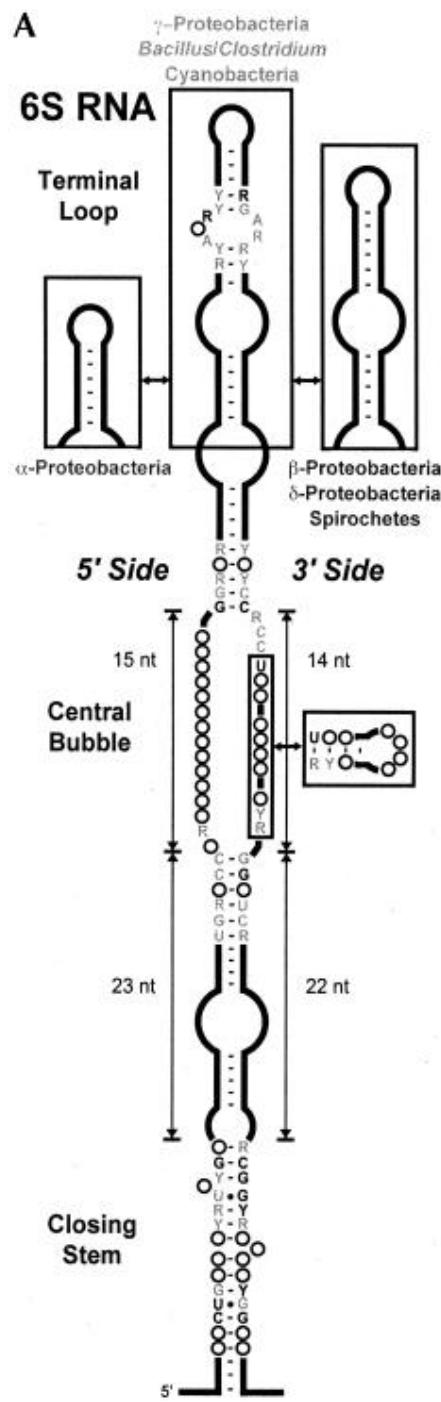
## ncRNA Example: 6S

medium size (175nt)

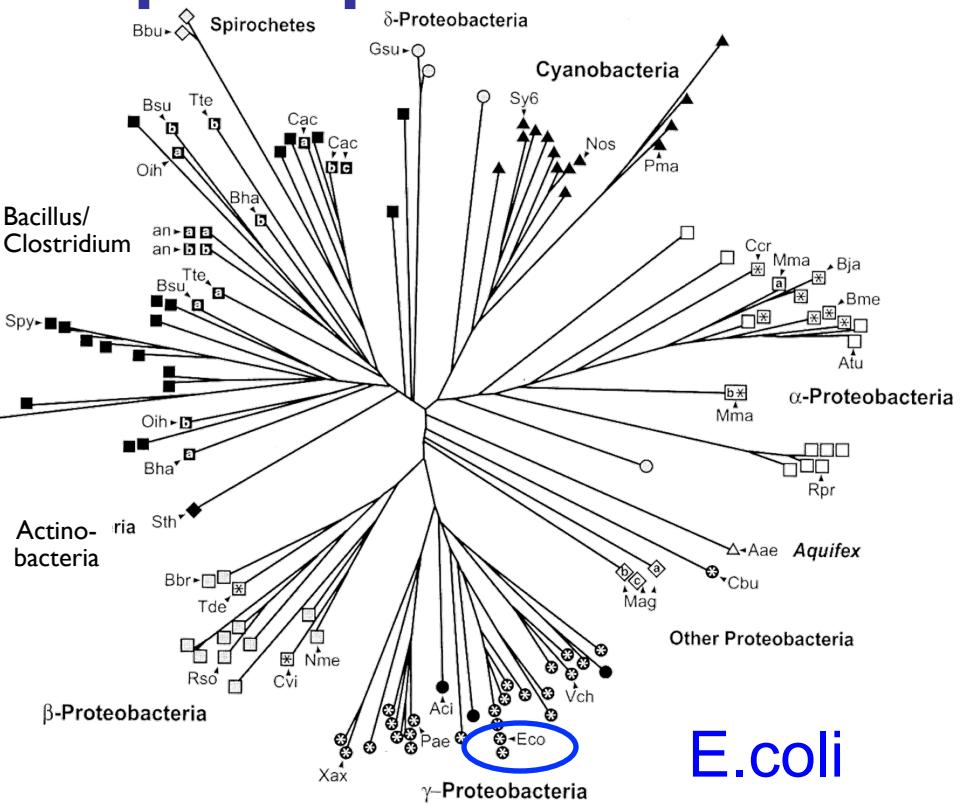
structured

highly expressed in *E. coli* in certain growth conditions

sequenced in 1971; function unknown for 30 years



# 6S mimics an open promoter



E.coli

Barrick et al. *RNA* 2005  
Trottochaud et al. *NSMB* 2005  
Willkomm et al. *NAR* 2005

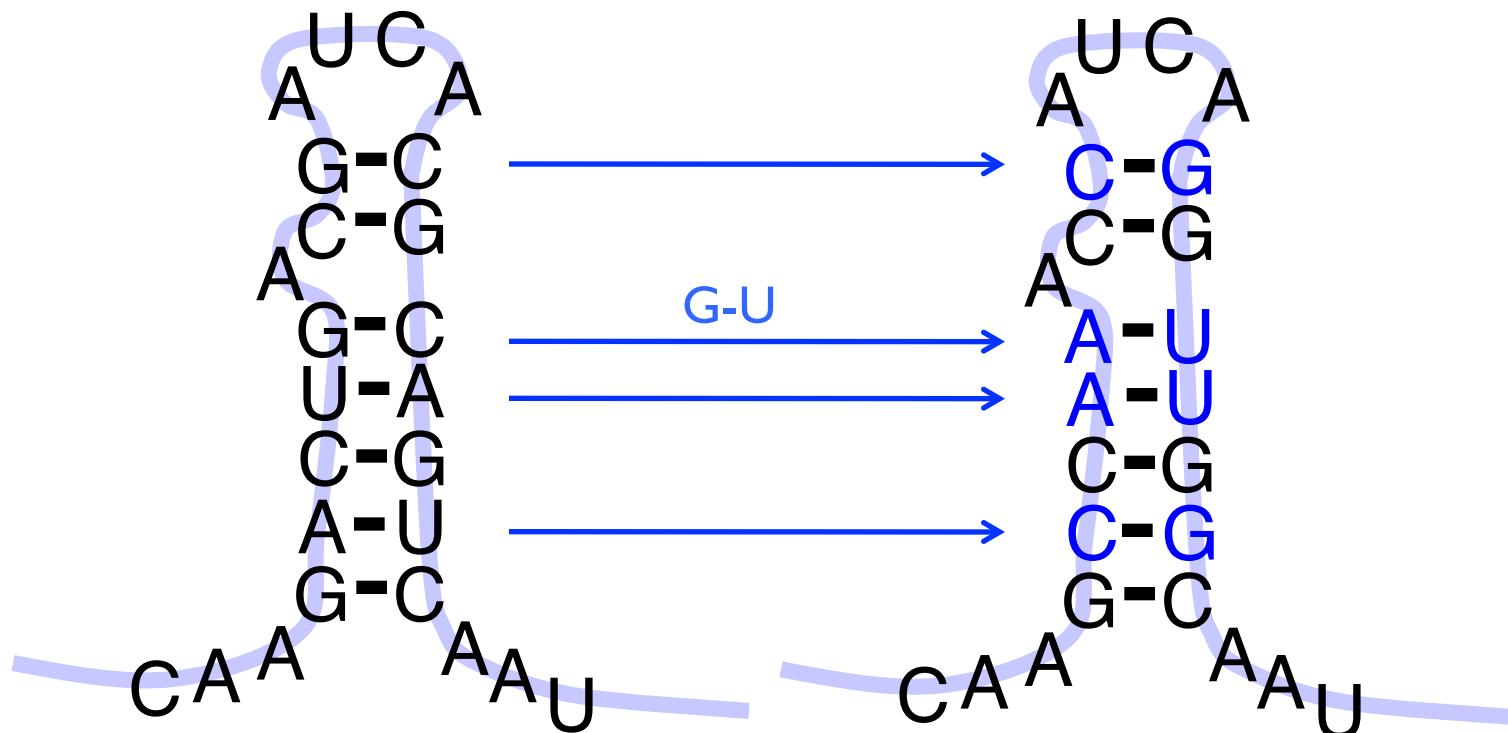
## Bottom line?

A significant number of “one-off” examples  
Extremely widespread ncRNA expression  
At a minimum, a vast evolutionary substrate  
New technology (e.g. RNAseq) exposing  
more

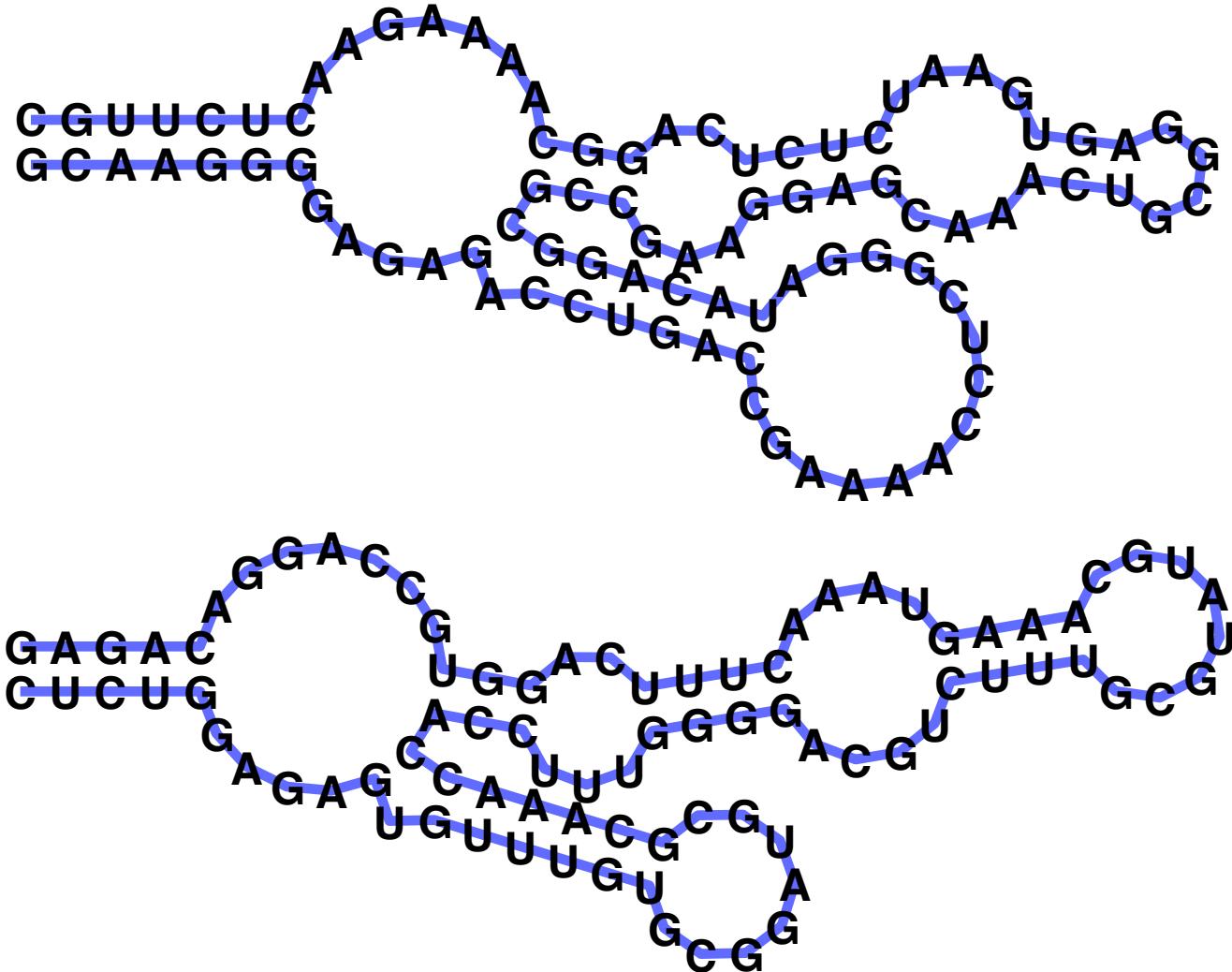
How do you recognize an interesting one?

Conserved secondary structure

# RNA Secondary Structure: can be fixed while sequence evolves



# Why is RNA hard to deal with?



A: *Structure often more important than sequence*<sub>103</sub>

# Structure Prediction

# RNA Structure

Primary Structure: Sequence

Secondary Structure: Pairing

Tertiary Structure: 3D shape

# RNA Pairing

## Watson-Crick Pairing

C - G

~ 3 kcal/mole

A - U

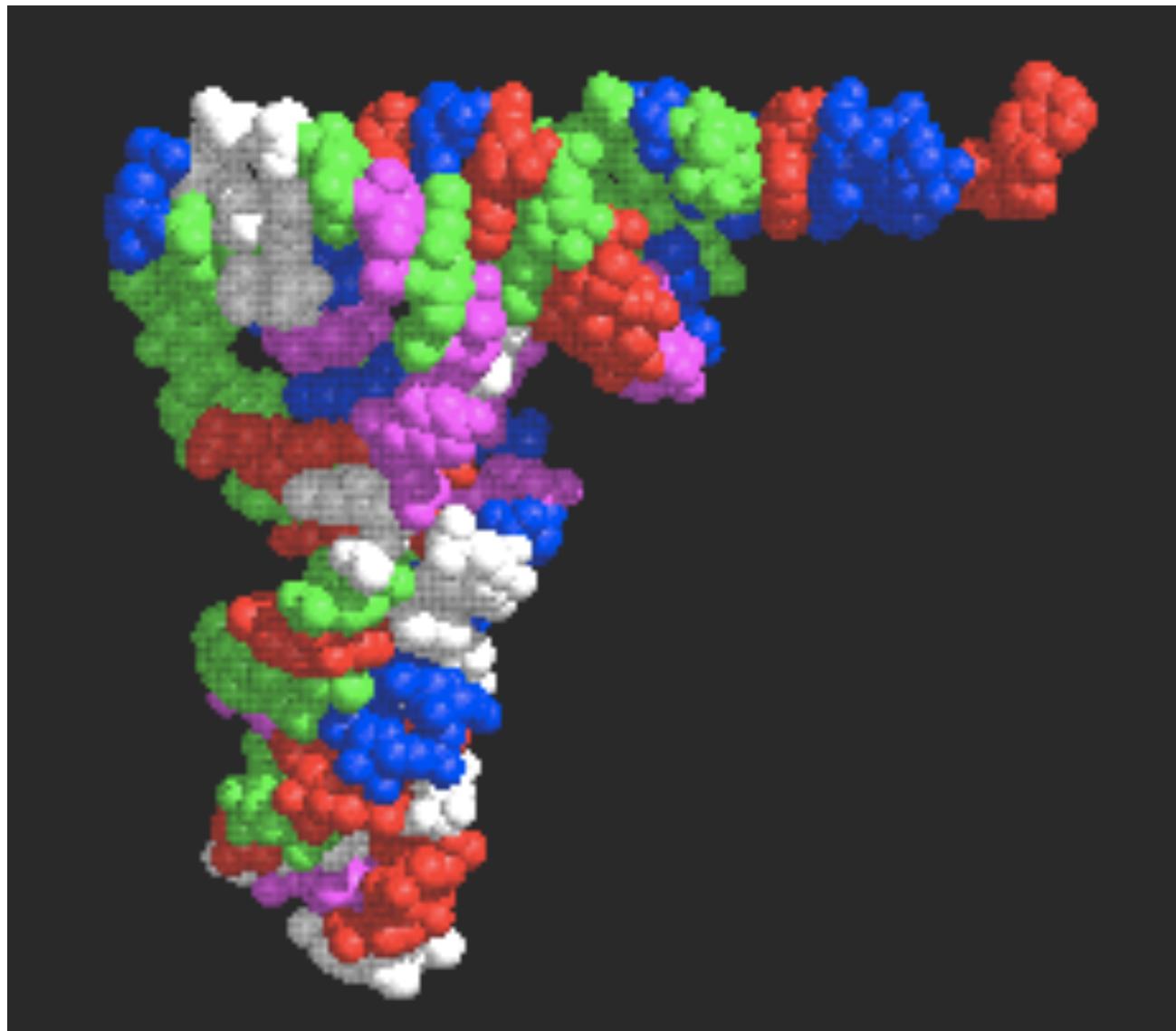
~ 2 kcal/mole

“Wobble Pair” G - U

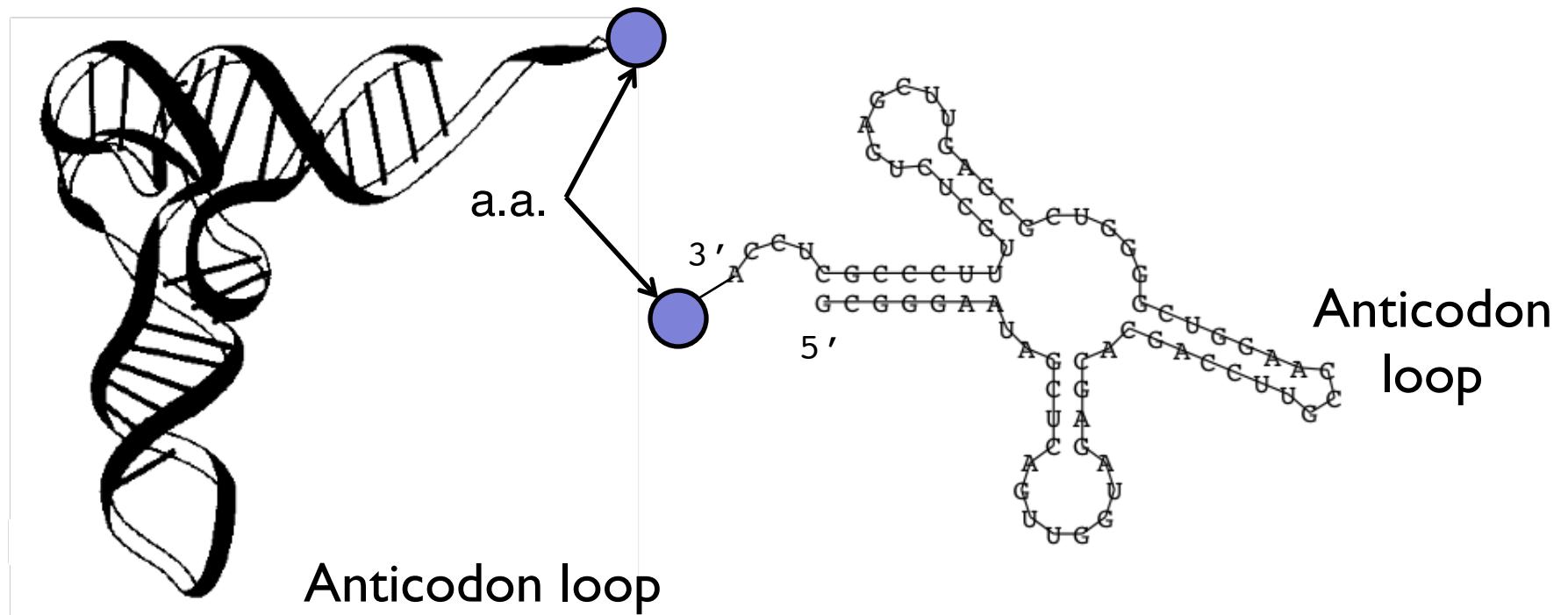
~ 1 kcal/mole

Non-canonical Pairs (esp. if modified)

# tRNA 3d Structure



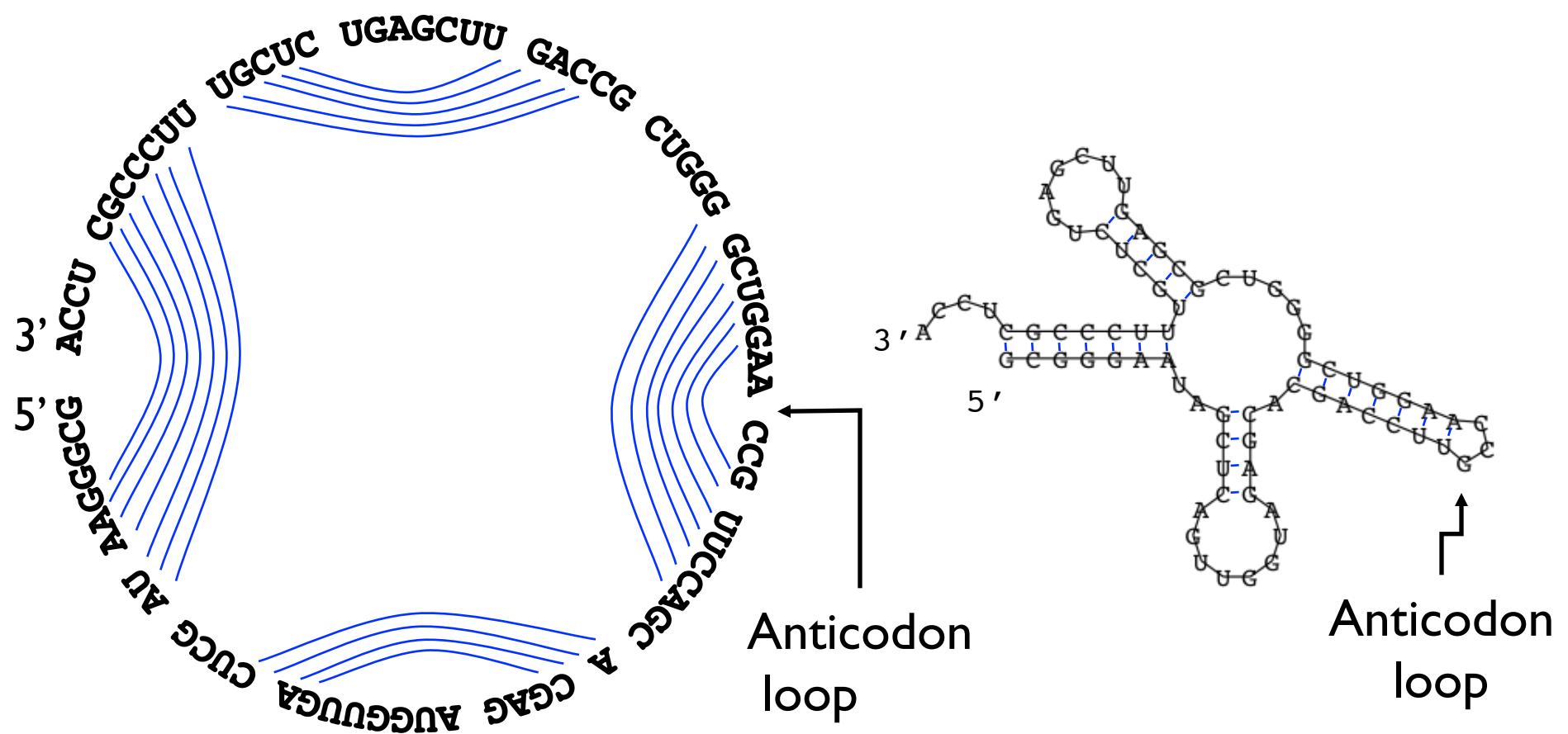
# tRNA - Alt. Representations



**Figure 1:** a) The spatial structure of the phenylalanine tRNA form yeast

b) The secondary structure extracts the most important information about the structure, namely the pattern of base pairings.

# tRNA - Alt. Representations



# Definitions

Sequence  $5' r_1 r_2 r_3 \dots r_n 3'$  in {A, C, G, T/U}

A Secondary Structure is a set of pairs  $i \bullet j$  s.t.

$i < j-4$ , and

}

no sharp turns

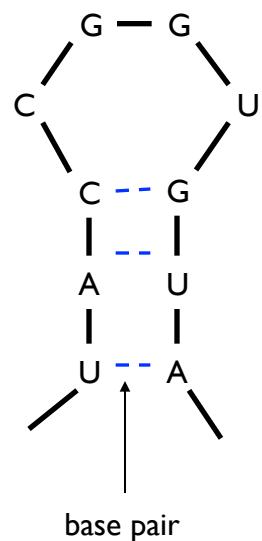
if  $i \bullet j$  &  $i' \bullet j'$  are two different pairs with  $i \leq i'$ , then

$j < i'$ , or

$i < i' < j' < j$

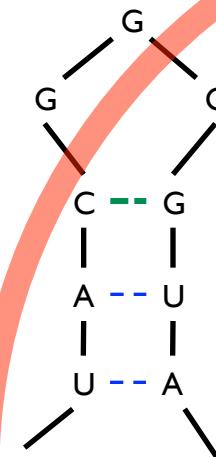
} 2nd pair follows 1st, or is  
nested within it;  
no “pseudoknots.”

# RNA Secondary Structure: Examples



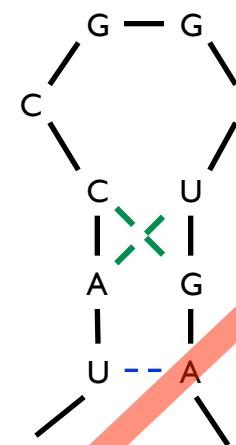
U A C C G G U G U A

ok

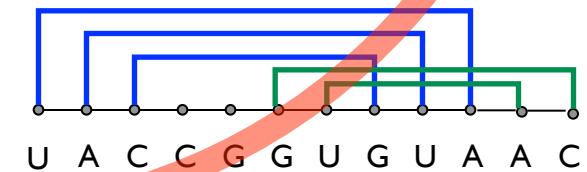


U A C G G G G U A

sharp turn



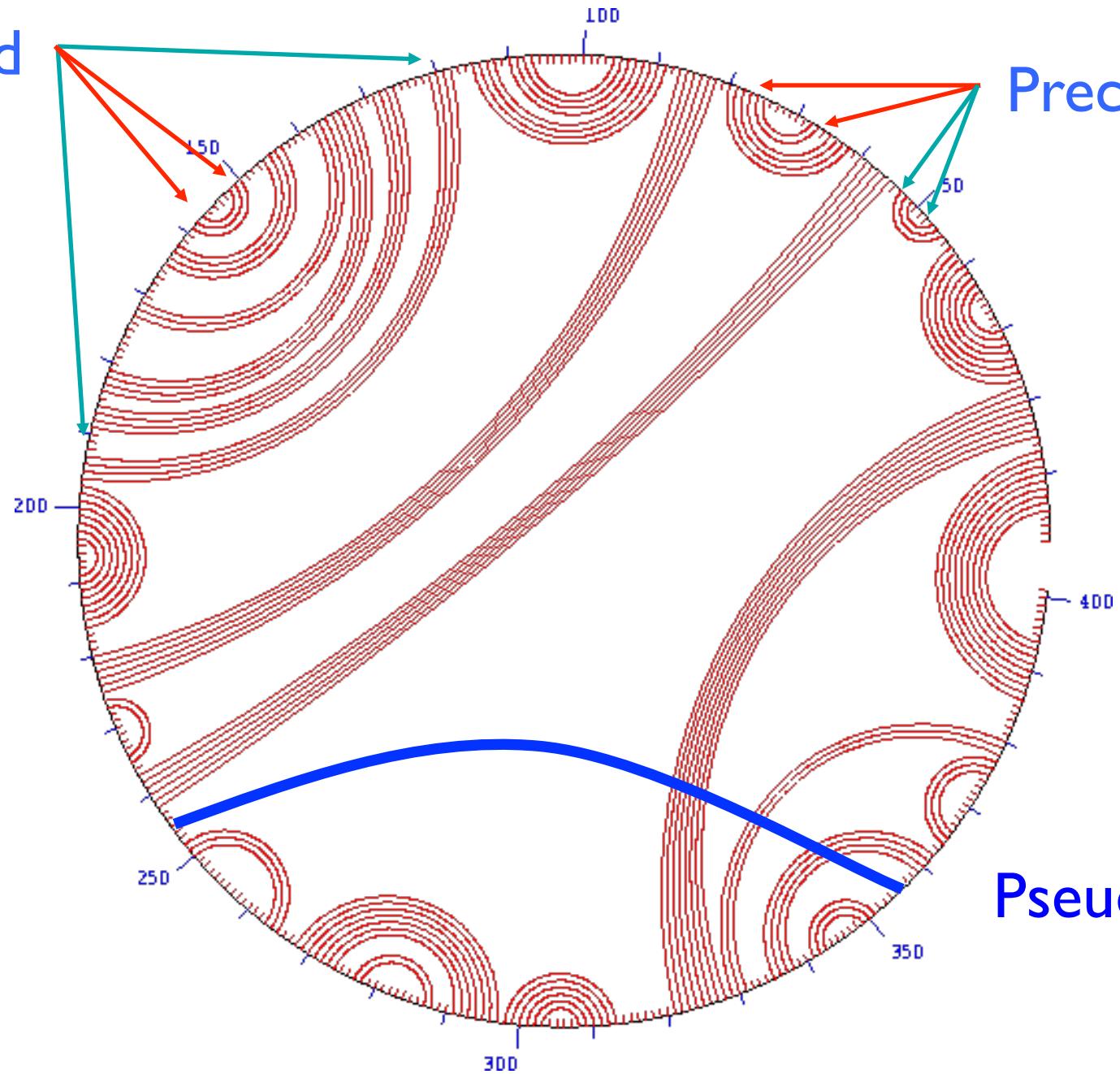
U A C C G G U U G A



U A C C G G U G U A A C

Nested

Precedes



Pseudoknot

# Approaches to Structure Prediction

## Maximum Pairing

- + works on single sequences
- + simple
- too inaccurate

## Minimum Energy

- + works on single sequences
- ignores pseudoknots
- only finds “optimal” fold

## Partition Function

- + finds all folds
- ignores pseudoknots

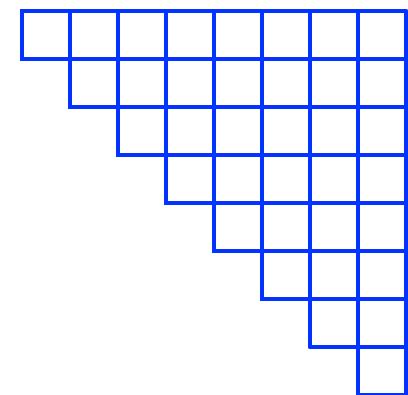
# Nussinov: Max Pairing

$B(i,j) = \# \text{ pairs in optimal pairing of } r_i \dots r_j$

$B(i,j) = 0$  for all  $i, j$  with  $i \geq j-4$ ; otherwise

$B(i,j) = \max \text{ of:}$

$$\left\{ \begin{array}{l} B(i,j-1) \\ \max \{ B(i,k-1) + 1 + B(k+1,j-1) \mid \\ i \leq k < j-4 \text{ and } r_k - r_j \text{ may pair} \} \end{array} \right.$$

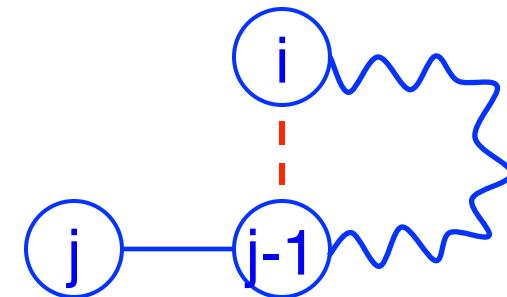


# “Optimal pairing of $r_i \dots r_j$ ”

## Two possibilities

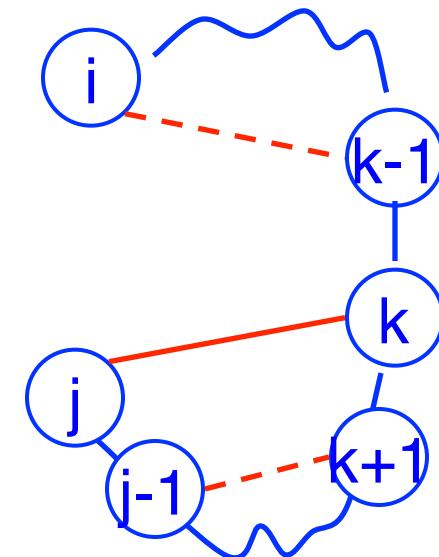
$j$  Unpaired:

Find best pairing of  $r_i \dots r_{j-1}$



$j$  Paired (with some  $k$ ):

Find best  $r_i \dots r_{k-1}$  +  
best  $r_{k+1} \dots r_{j-1}$  plus 1



Why is it slow?

Why do pseudoknots matter?

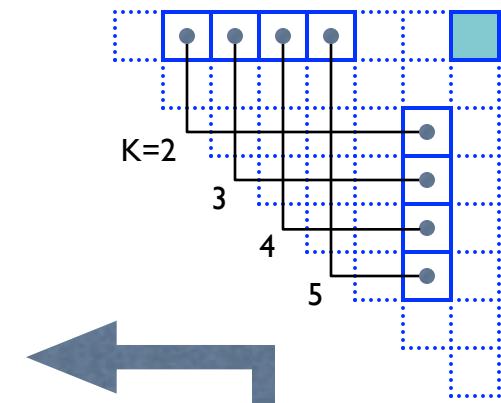
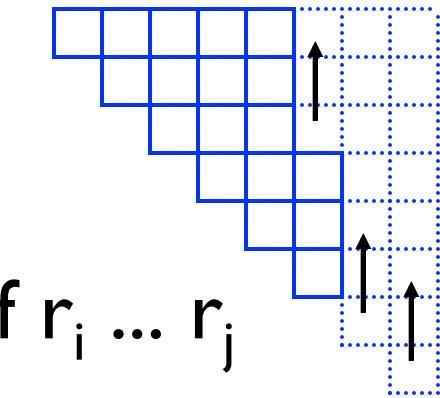
# Nussinov: A Computation Order

$B(i,j) = \# \text{ pairs in optimal pairing of } r_i \dots r_j$

$B(i,j) = 0$  for all  $i, j$  with  $i \geq j-4$ ; otherwise

$B(i,j) = \max \text{ of:}$

$$\begin{cases} B(i,j-1) \\ \max \{ B(i,k-1) + 1 + B(k+1,j-1) \mid \\ i \leq k < j-4 \text{ and } r_k - r_j \text{ may pair} \} \end{cases}$$



Time:  $O(n^3)$

# Summary

RNA has important roles beyond mRNA

Many unexpected recent discoveries

Structure is critical to function

True of proteins, too, but they're easier to find from sequence alone due, e.g., to codon structure, which RNAs lack

RNA secondary structure can be predicted (to useful accuracy) by dynamic programming

Next: RNA “motifs” (seq + 2-ary struct) well-captured by “covariance models”