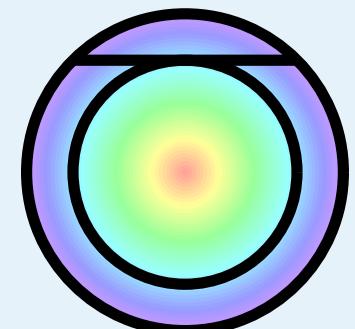
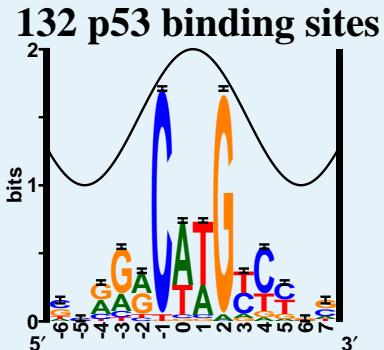




# Why is the Genetic Code Degenerate?

Thomas D. Schneider, Ph.D.

Molecular Information Theory Group  
Center for Cancer Research  
Gene Regulation and Chromosome Biology Laboratory  
National Cancer Institute  
National Institutes of Health  
Frederick, MD



# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
L	Leu	Ser	och	opa	A
A	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
A	Leu	Pro	His	Arg	C
G	Leu	Pro	Gln	Arg	A
G	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
A	Ile	Thr	Asn	Ser	C
A	Ile	Thr	Lys	Arg	A
M	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
G	Val	Ala	Asp	Gly	C
V	Val	Ala	Glu	Gly	A
V	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
Leu	Ser	och	opa		A
Leu	Ser	amb	Trp		G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
A	Leu	Ser	och	opa	A
G	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
L	Leu	Ser	och	opa	A
E	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
M	Met	Thr	Lys	Arg	G
V	Val	Ala	Asp	Gly	U
E	Val	Ala	Asp	Gly	C
V	Val	Ala	Glu	Gly	A
A	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
Leu	Ser	och	opa		A
Leu	Ser	amb		Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
A	Leu	Ser	och	opa	A
G	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

$4 \times 4 \times 4 = 4^3 = 64$  codons  
BUT only 20 amino acids

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
A	Leu	Ser	och	opa	A
G	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

$4 \times 4 \times 4 = 4^3 = 64$  codons  
BUT only 20 amino acids

Where we are going:

The Genetic Code  
is degenerate  
because it has  
distinct states.

# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
A	Leu	Ser	och	opa	A
G	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

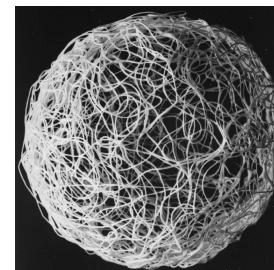
The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

$4 \times 4 \times 4 = 4^3 = 64$  codons  
BUT only 20 amino acids

Where we are going:

The Genetic Code  
is degenerate  
because it has  
distinct states.



# The Genetic Code is Degenerate

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
A	Leu	Ser	och	opa	A
G	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

Third base in codon

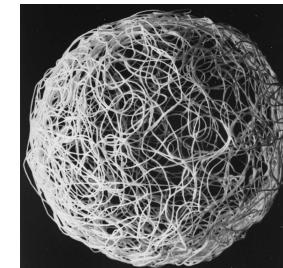
The Genetic Code translates:

3 nucleotides in RNA  
(a codon)  
to one amino acid in a protein

$4 \times 4 \times 4 = 4^3 = 64$  codons  
BUT only 20 amino acids

Where we are going:

The Genetic Code is degenerate because it has distinct states.

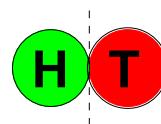


# Information Theory: One-Minute Lesson

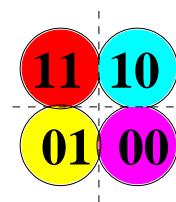
number of symbols	number of bits	example
-------------------	----------------	---------

M	B
---	---

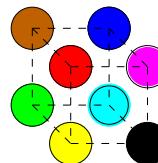
2	1
---	---



4	2
---	---

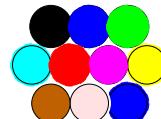


8	3
---	---



$$M=2^B$$

$$B=\log_2 M$$

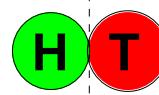


# Information Theory: One-Minute Lesson

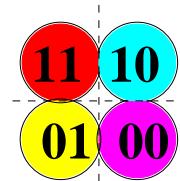
number of symbols	number of bits	example
-------------------	----------------	---------

M	B	
---	---	--

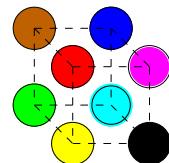
2	1	
---	---	--



4	2	
---	---	--



8	3	
---	---	--



$$M=2^B$$

$$B=\log_2 M$$

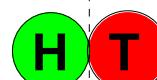


# Information Theory: One-Minute Lesson

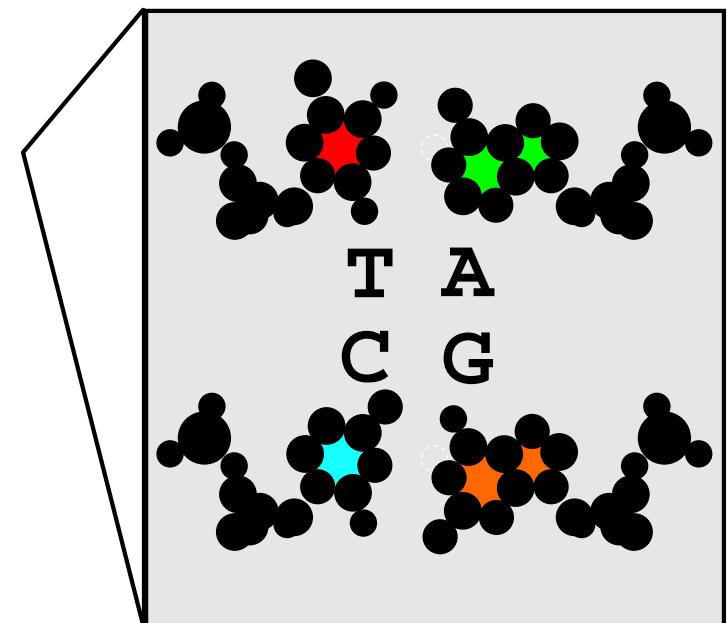
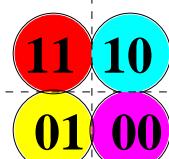
number of symbols	number of bits	example
-------------------	----------------	---------

M	B
---	---

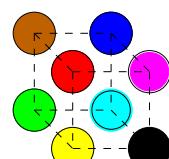
2	1
---	---



4	2
---	---

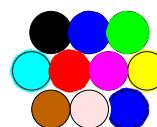


8	3
---	---



$$M=2^B$$

$$B=\log_2 M$$

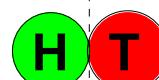


# Information Theory: One-Minute Lesson

number of symbols	number of bits	example
-------------------	----------------	---------

M	B	
---	---	--

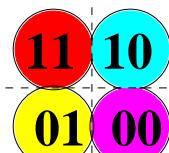
2	1	
---	---	--



H T

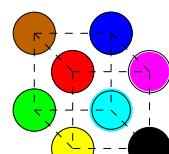


4	2	
---	---	--



11 10  
01 00

8	3	
---	---	--

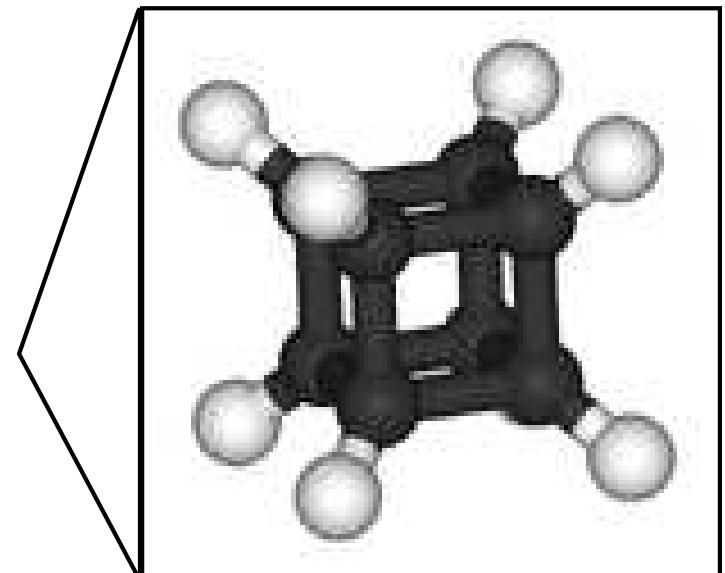


11 10  
01 00  
11 10  
01 00

$$M=2^B \quad B=\log_2 M$$



11 10  
01 00  
11 10  
01 00

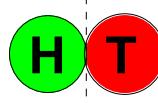


# Information Theory: One-Minute Lesson

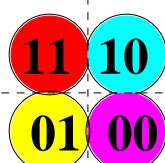
number of symbols	number of bits	example
-------------------	----------------	---------

M	B	
---	---	--

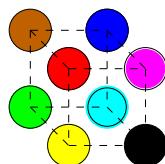
2	1	
---	---	--



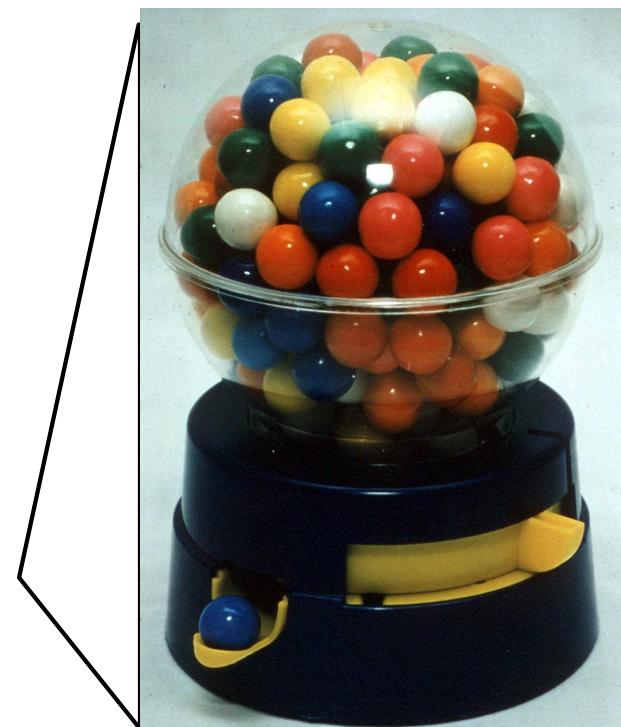
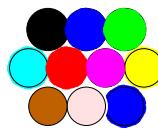
4	2	
---	---	--



8	3	
---	---	--

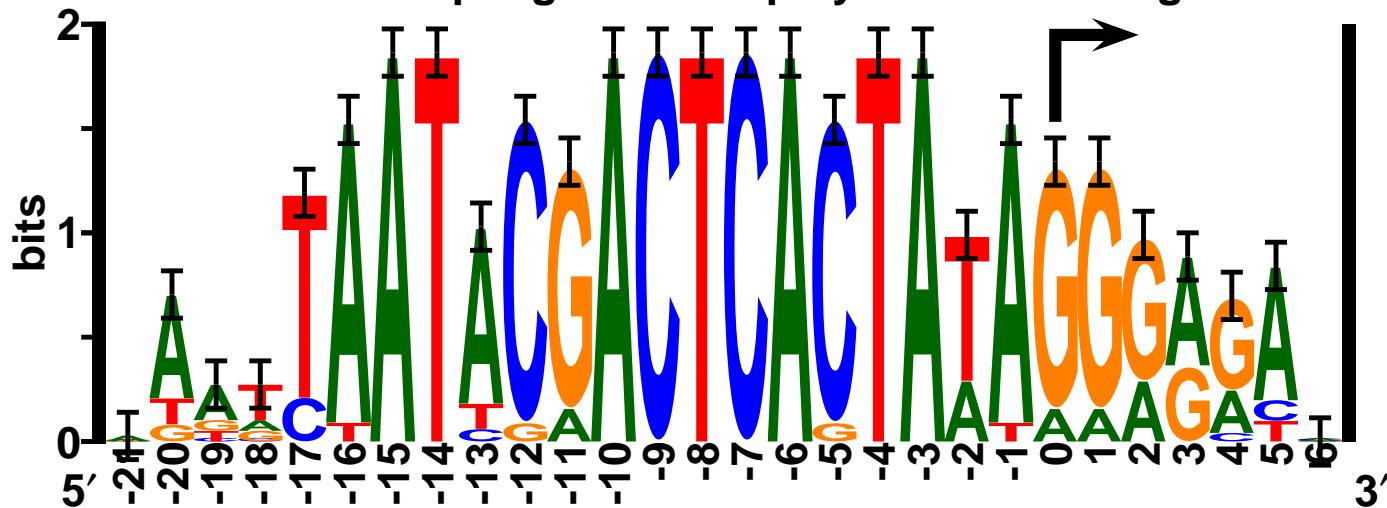


$$M=2^B \quad B=\log_2 M$$



# Sequence Logo

17 Bacteriophage T7 RNA polymerase binding sites



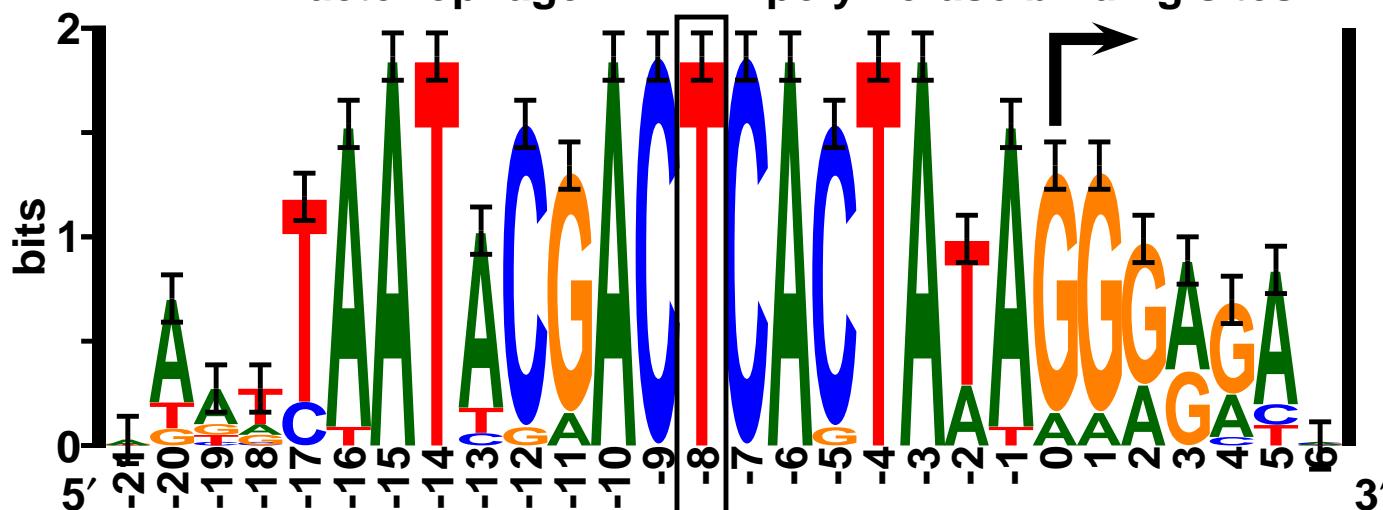
1 ttatttaataacaactcactataaggagag  
2 aaatcaataacgactcactataaggggac  
3 cggtaataacgactcactataaggagaac  
4 gaagtaataacgactcagtatagggacaa  
5 taatttaatttgaactcactaaaggagac  
6 cgcttaataacgactcactaaaggagaca

6 of 17 sites

Schneider &  
Stephens  
*Nucl. Acids Res.*  
18: 6097-6100  
1990

# Sequence Logo

17 Bacteriophage T7 RNA polymerase binding sites



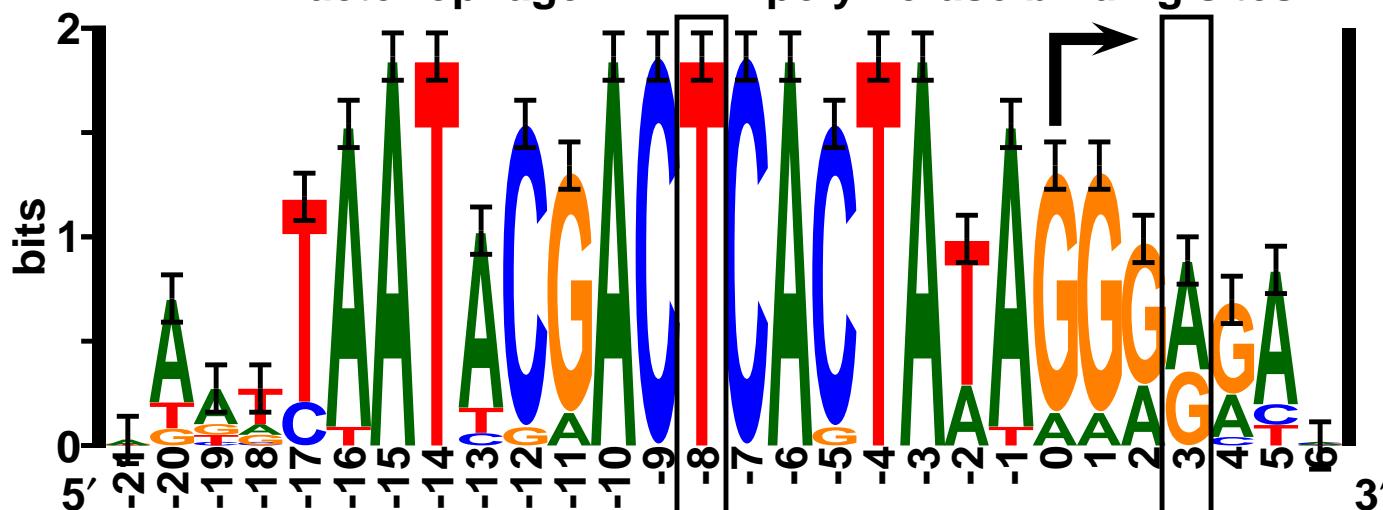
1 ttatttaataacaactcactataaggagag  
2 aaatcaataacgactcactataagggac  
3 cggtaataacgactcactataaggagaac  
4 gaagtaataacgactcagtatagggacaa  
5 taatttaattgaactcactaaaggagac  
6 cgcttaataacgactcactaaaggagaca

6 of 17 sites

Schneider &  
Stephens  
*Nucl. Acids Res.*  
18: 6097-6100  
1990

# Sequence Logo

17 Bacteriophage T7 RNA polymerase binding sites



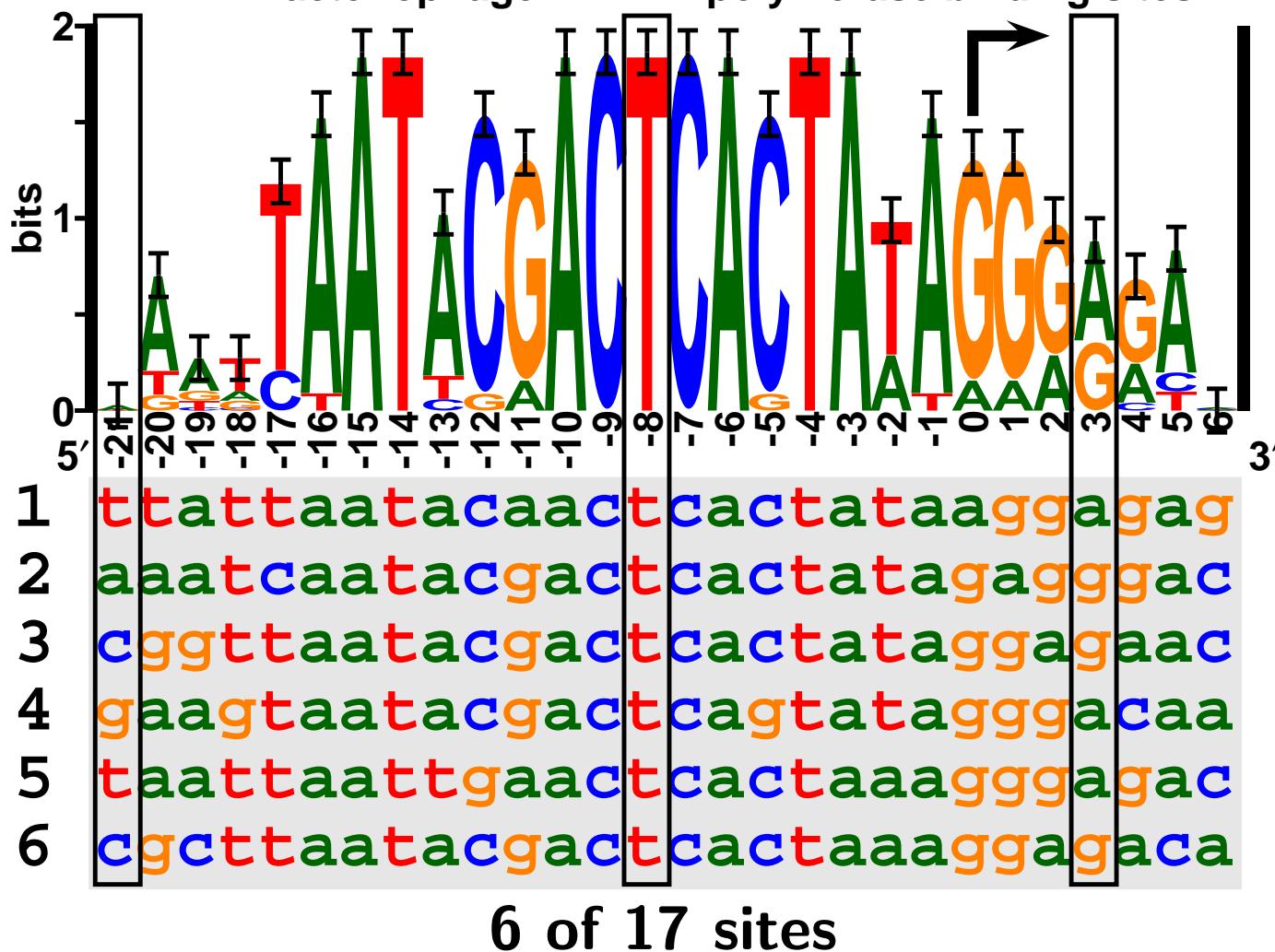
1 ttatttaataacaactcactataaggagag  
2 aaatcaataacgactcactataggggac  
3 cggtaataacgactcactataaggagaac  
4 gaagtaataacgactcagtatagggacaa  
5 taatttaattgaactcactaaaggagac  
6 cgcttaataacgactcactaaaggagaca

6 of 17 sites

Schneider &  
Stephens  
*Nucl. Acids Res.*  
18: 6097-6100  
1990

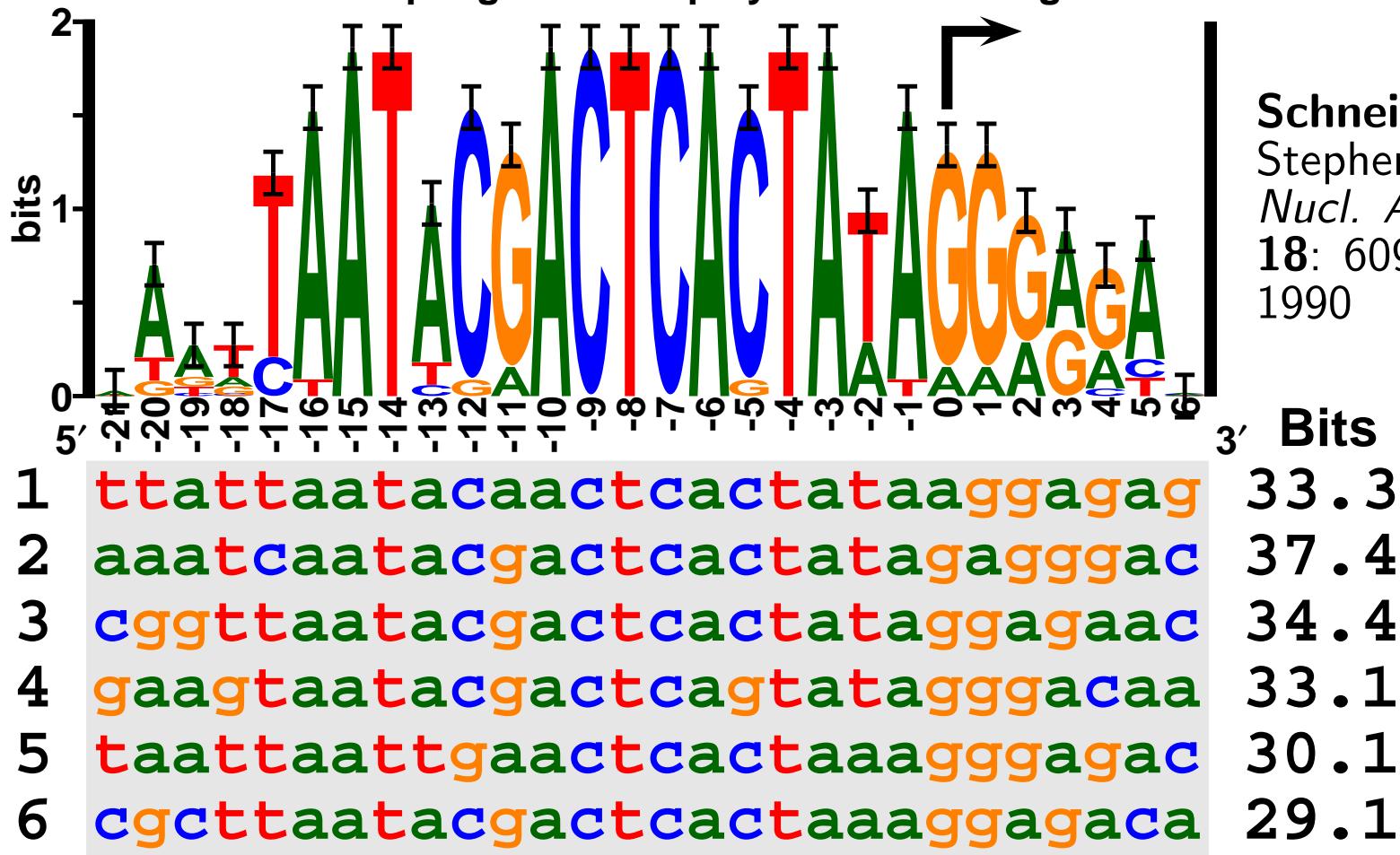
# Sequence Logo

17 Bacteriophage T7 RNA polymerase binding sites



# Sequence Logo and Sequence Walker

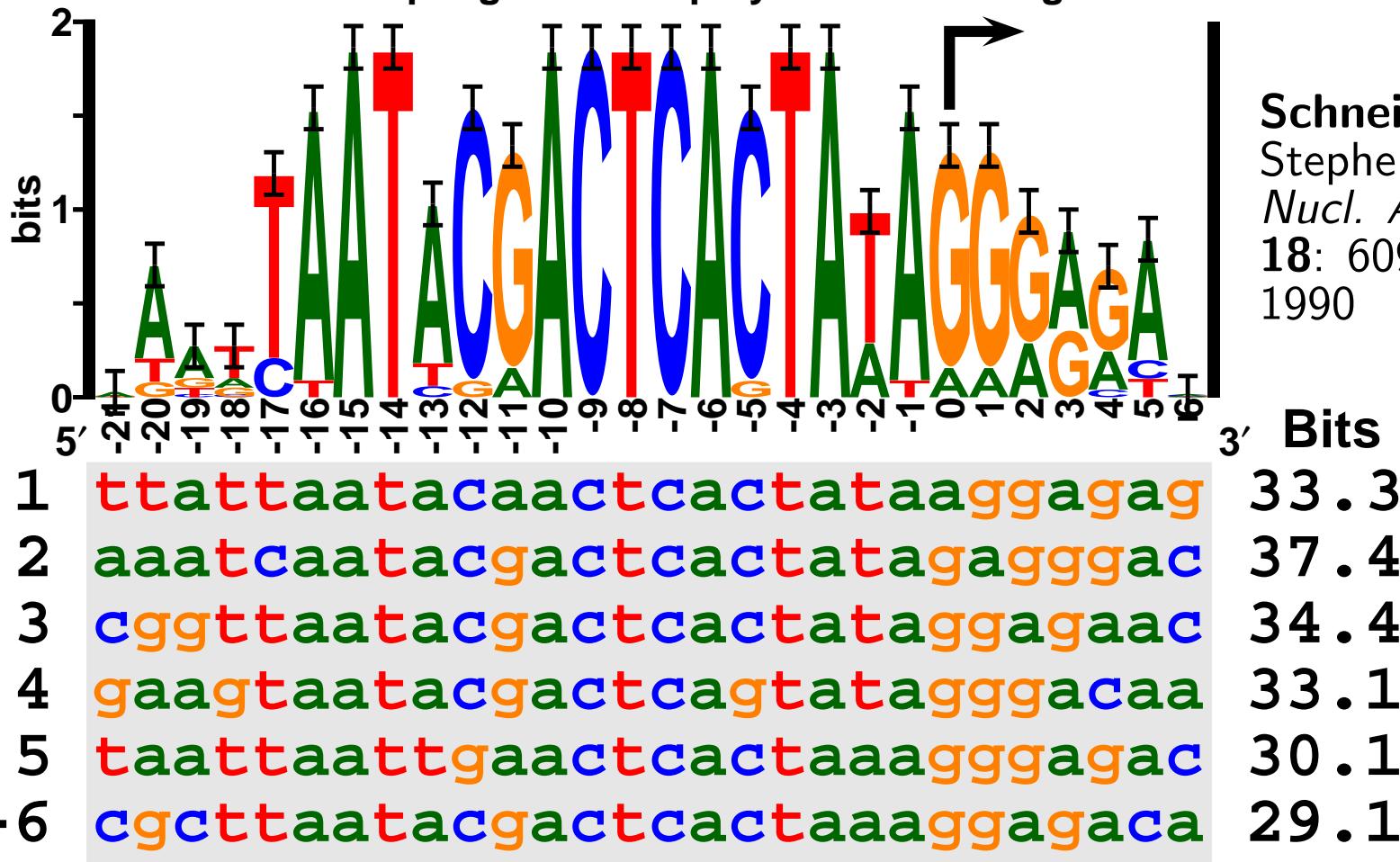
17 Bacteriophage T7 RNA polymerase binding sites



Schneider &  
Stephens  
*Nucl. Acids Res.*  
18: 6097-6100  
1990

# Sequence Logo and Sequence Walker

## 17 Bacteriophage T7 RNA polymerase binding sites



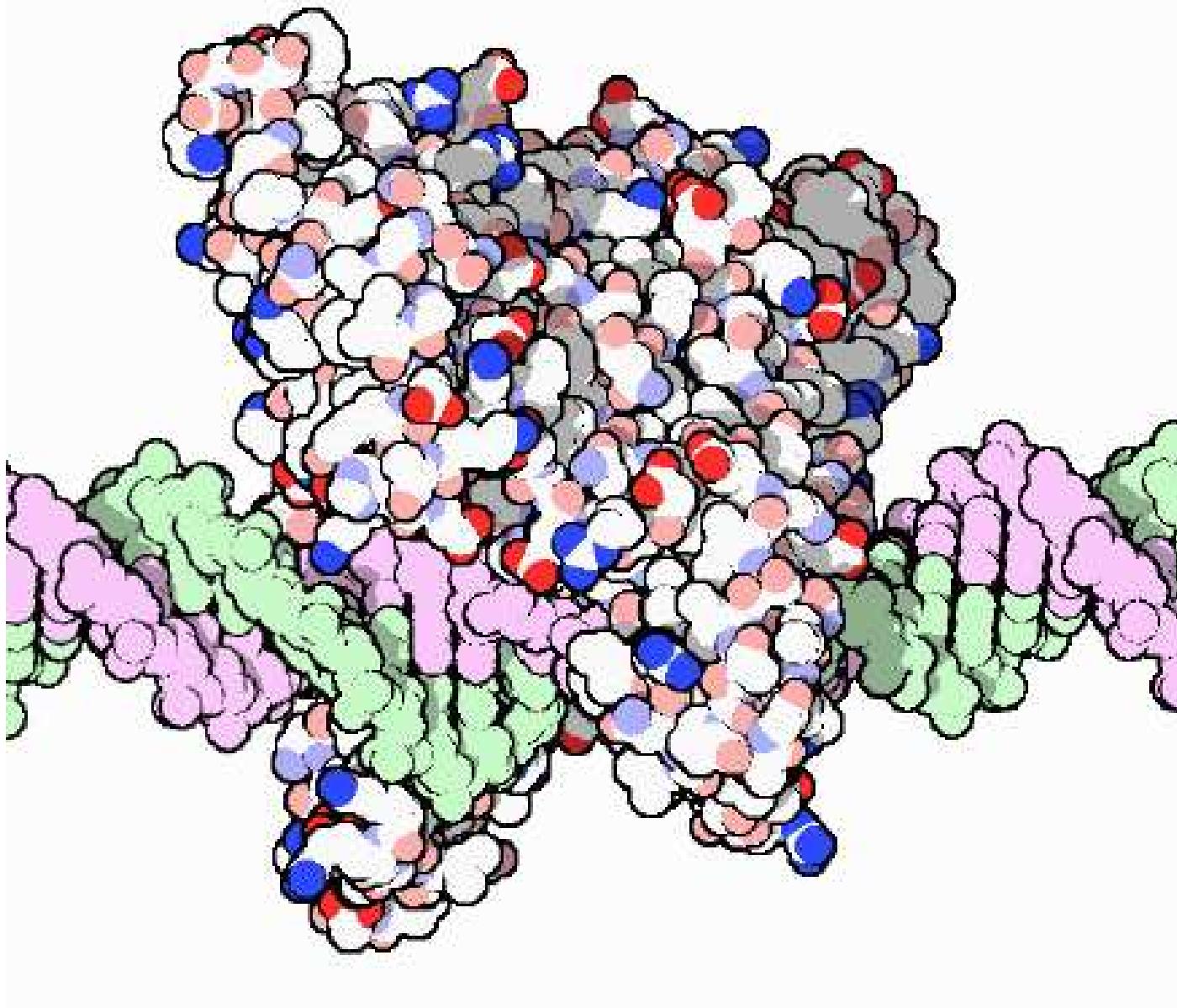
Sequence Walker Patent 5,867,402

29.1 bits

Schneider & Stephens  
*Nucl. Acids Res.*  
18: 6097-6100  
1990

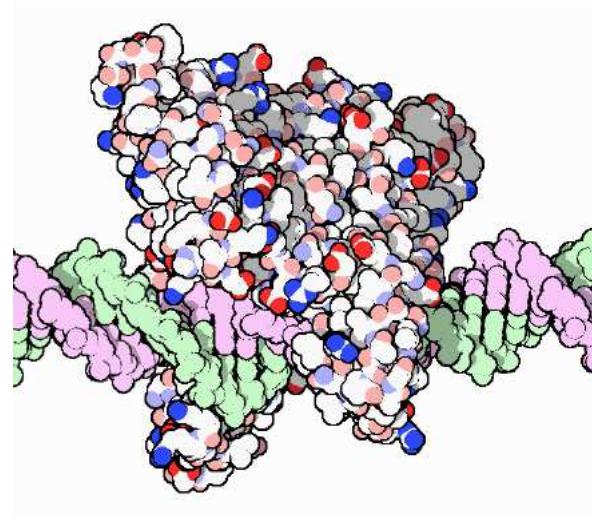
# Advanced Molecular Information Theory

## Information versus Energy



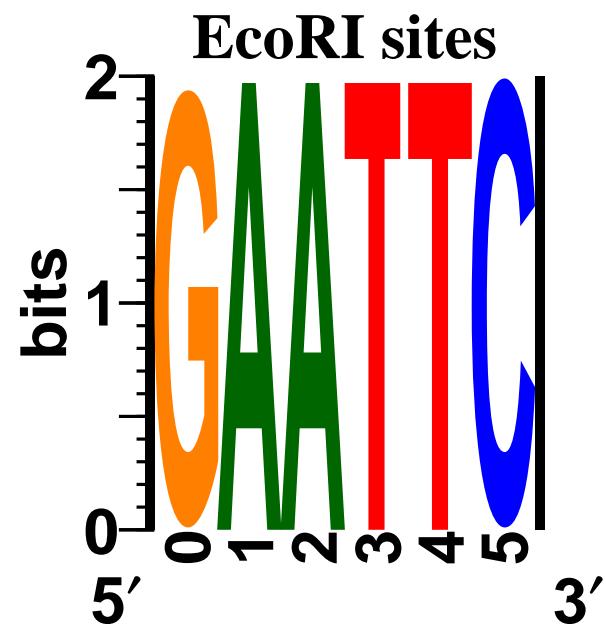
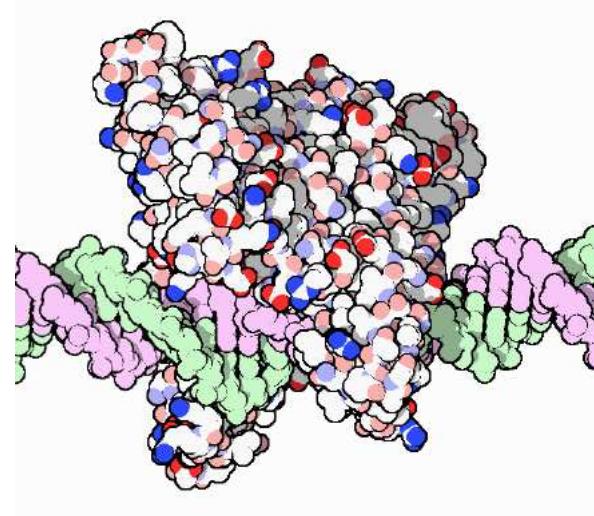
# Information of EcoRI DNA Binding

- EcoRI - restriction enzyme



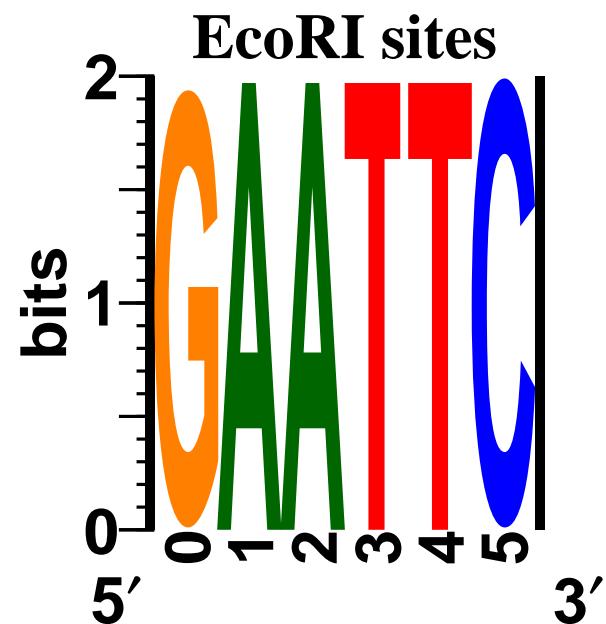
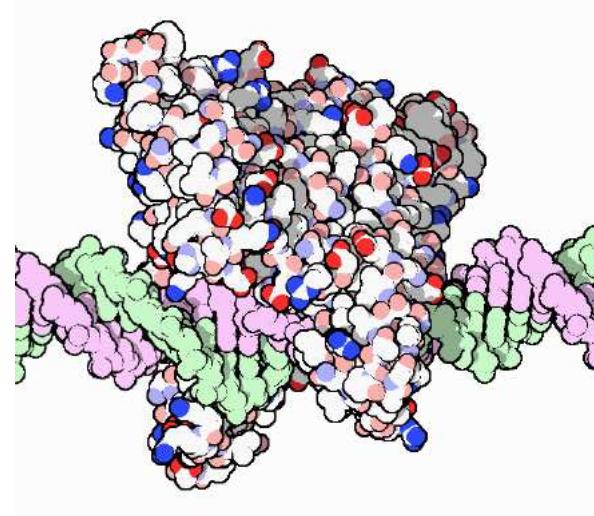
# Information of EcoRI DNA Binding

- EcoRI - restriction enzyme
- EcoRI binds DNA at 5' GAATTC 3'



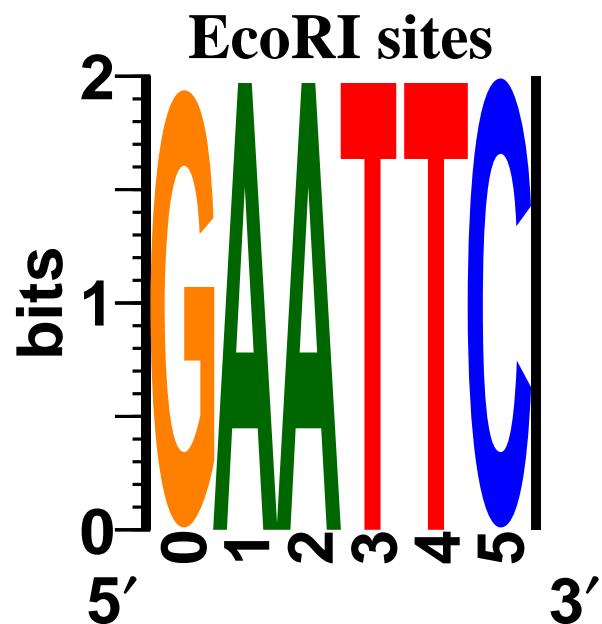
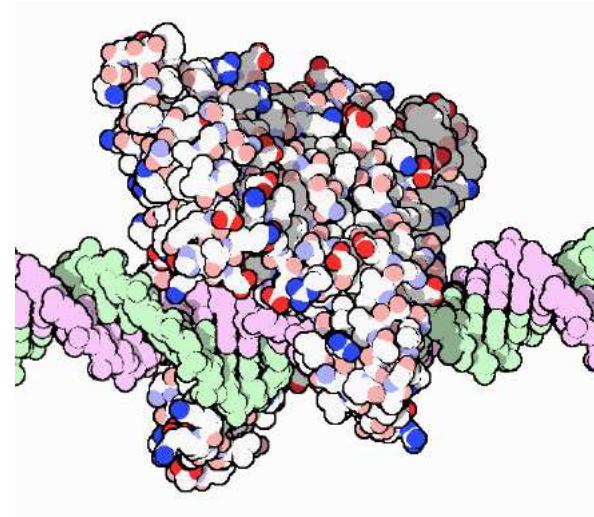
# Information of EcoRI DNA Binding

- EcoRI - restriction enzyme
- EcoRI binds DNA at 5' GAATTC 3'
- $4^6 = 4096$  possible DNA hexamers



# Information of EcoRI DNA Binding

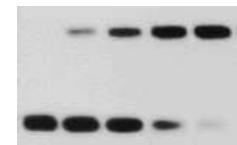
- EcoRI - restriction enzyme
- EcoRI binds DNA at 5' GAATTC 3'
- $4^6 = 4096$  possible DNA hexamers
- information required:  
 $\log_2 4096 = 12$  bits  
or  
 $6 \text{ bases} \times 2 \text{ bits per base} = 12 \text{ bits}$



# Energy Dissipation by EcoRI

- Measured specific binding constant:

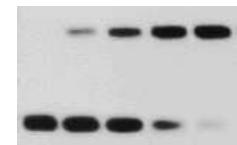
$$K_{spec} = 1.6 \times 10^5$$



# Energy Dissipation by EcoRI

- Measured specific binding constant:

$$K_{spec} = 1.6 \times 10^5$$



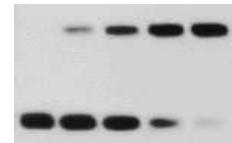
- Average energy dissipated by one molecule as it binds:

$$\Delta G_{spec}^\circ = -k_B T \ln K_{spec} \quad (\text{joules per binding})$$

# Energy Dissipation by EcoRI

- Measured specific binding constant:

$$K_{spec} = 1.6 \times 10^5$$



- Average energy dissipated by one molecule as it binds:

$$\Delta G_{spec}^\circ = -k_B T \ln K_{spec} \quad (\text{joules per binding})$$

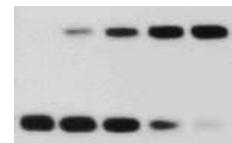
- The Second Law of Thermodynamics as a conversion factor:

$$\mathcal{E}_{min} = k_B T \ln 2 \quad (\text{joules per bit})$$

# Energy Dissipation by EcoRI

- Measured specific binding constant:

$$K_{spec} = 1.6 \times 10^5$$



- Average energy dissipated by one molecule as it binds:

$$\Delta G_{spec}^\circ = -k_B T \ln K_{spec} \quad (\text{joules per binding})$$

- The Second Law of Thermodynamics as a conversion factor:

$$\mathcal{E}_{min} = k_B T \ln 2 \quad (\text{joules per bit})$$

- Number of bits that could have been selected:

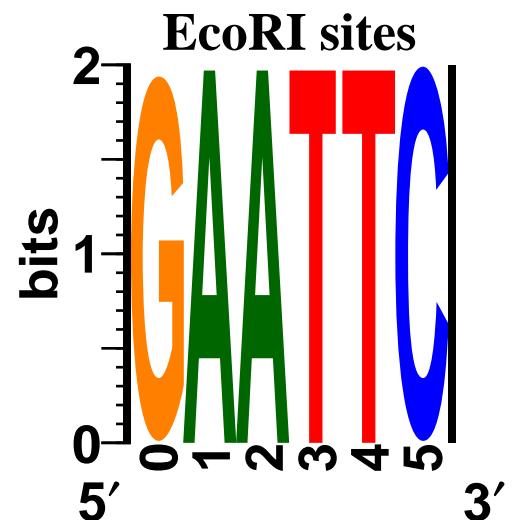
$$\begin{aligned} R_{energy} &= -\Delta G^\circ / \mathcal{E}_{min} \\ &= k_B T \ln K_{spec} / k_B T \ln 2 \\ &= \log_2 K_{spec} \qquad \qquad \Leftarrow \text{SO SIMPLE!} \\ &= \boxed{17.3 \text{ bits per binding}} \end{aligned}$$

# **Information/Energy = Efficiency of EcoRI**

EcoRI could have made 17.3 binary choices

# Information/Energy = Efficiency of EcoRI

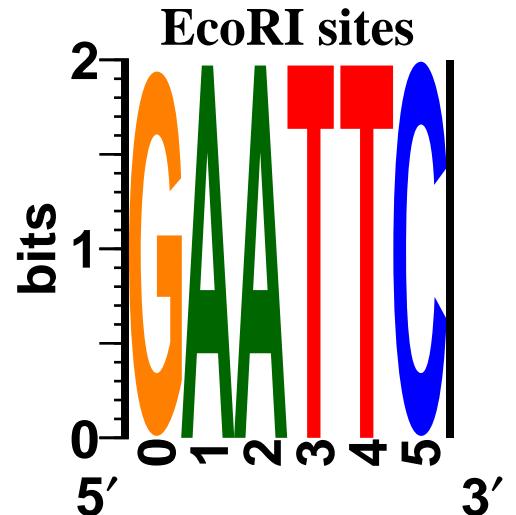
EcoRI could have made 17.3 binary choices  
... but it only made 12 choices.



# Information/Energy = Efficiency of EcoRI

EcoRI could have made 17.3 binary choices  
... but it only made 12 choices.

Efficiency is  
'WORK' DONE / ENERGY DISSIPATED

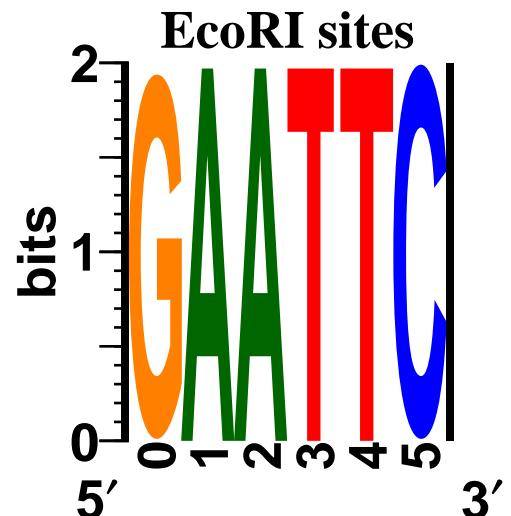


# Information/Energy = Efficiency of EcoRI

EcoRI could have made 17.3 binary choices  
... but it only made 12 choices.

Efficiency is  
'WORK' DONE / ENERGY DISSIPATED

$$\frac{12 \text{ bits per binding}}{17.3 \text{ bits per binding}} = 0.7$$

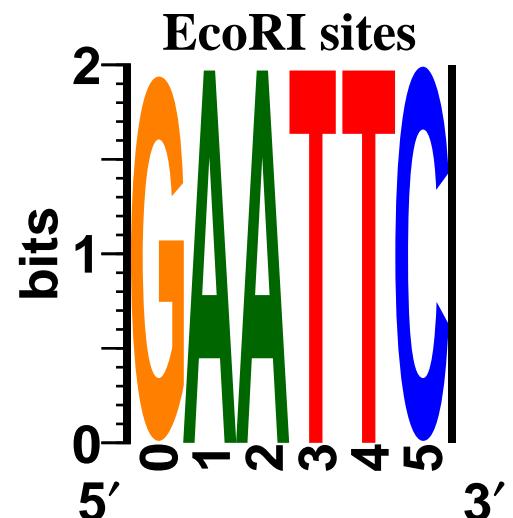


# Information/Energy = Efficiency of EcoRI = 70%

EcoRI could have made 17.3 binary choices  
... but it only made 12 choices.

Efficiency is  
'WORK' DONE / ENERGY DISSIPATED

$$\frac{12 \text{ bits per binding}}{17.3 \text{ bits per binding}} = 0.7$$



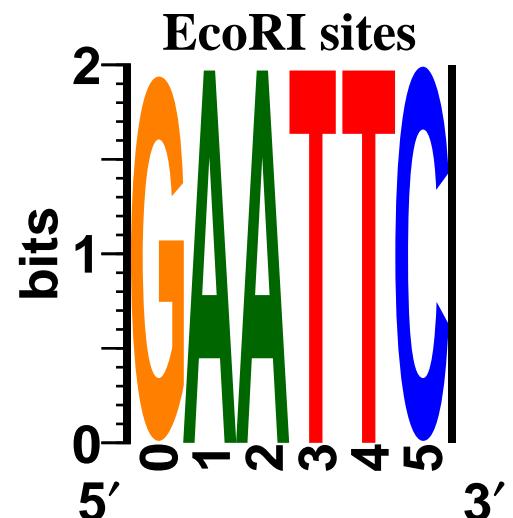
The efficiency is 70%.

# Information/Energy = Efficiency of EcoRI = 70%

EcoRI could have made 17.3 binary choices  
... but it only made 12 choices.

Efficiency is  
'WORK' DONE / ENERGY DISSIPATED

$$\frac{12 \text{ bits per binding}}{17.3 \text{ bits per binding}} = 0.7$$

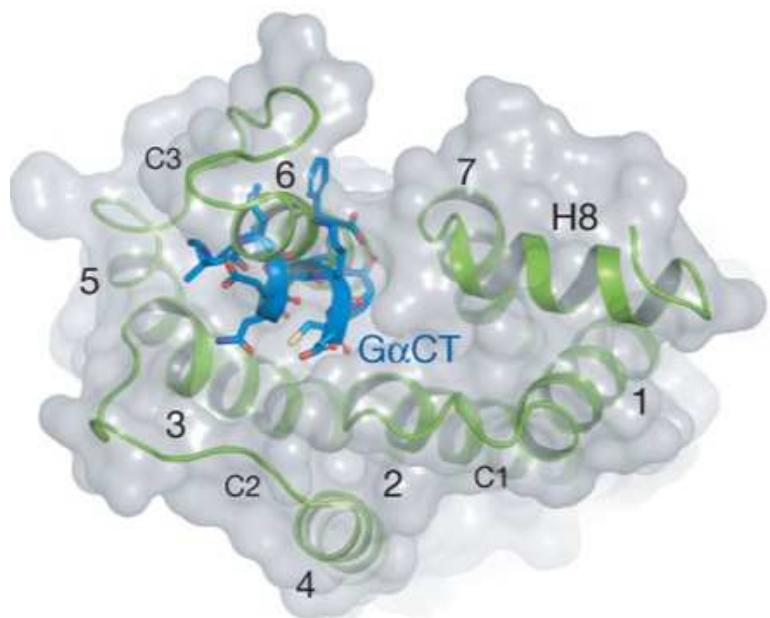


The efficiency is 70%.

18 out of 19 DNA binding proteins give ~70% efficiency.

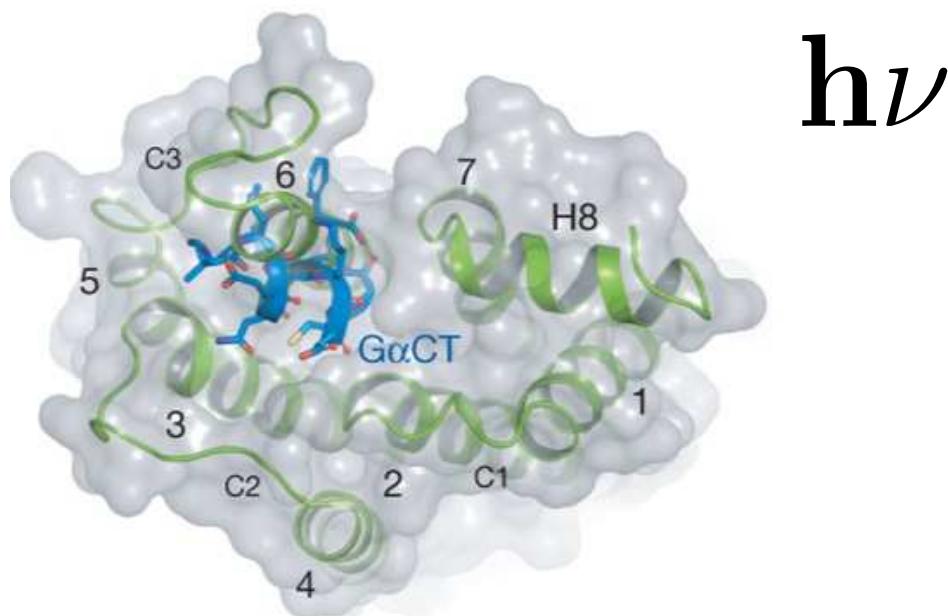
# Rhodopsin Shape Change

Dark State



# Rhodopsin Shape Change

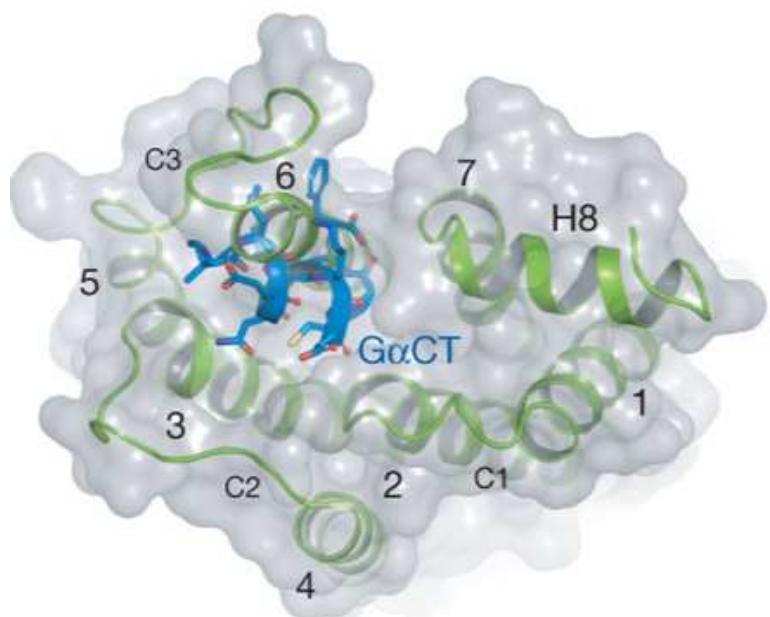
Dark State



$h\nu$

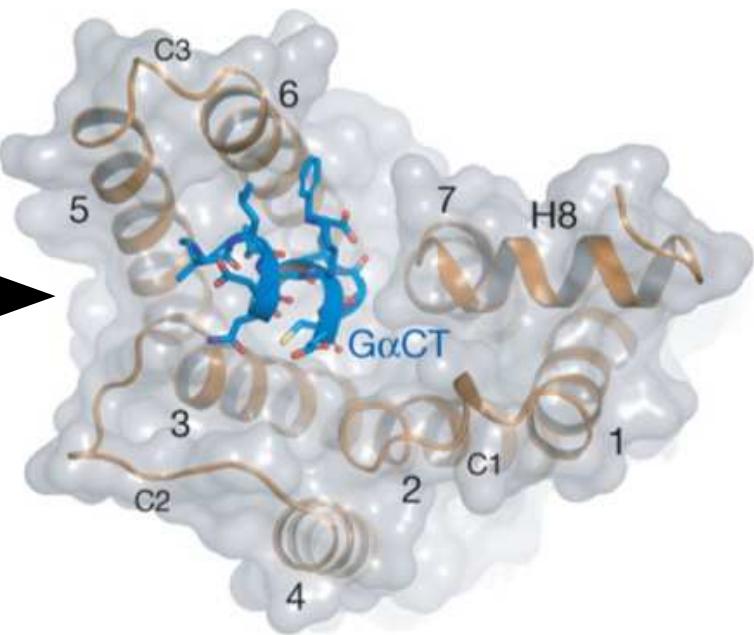
# Rhodopsin Shape Change

Dark State



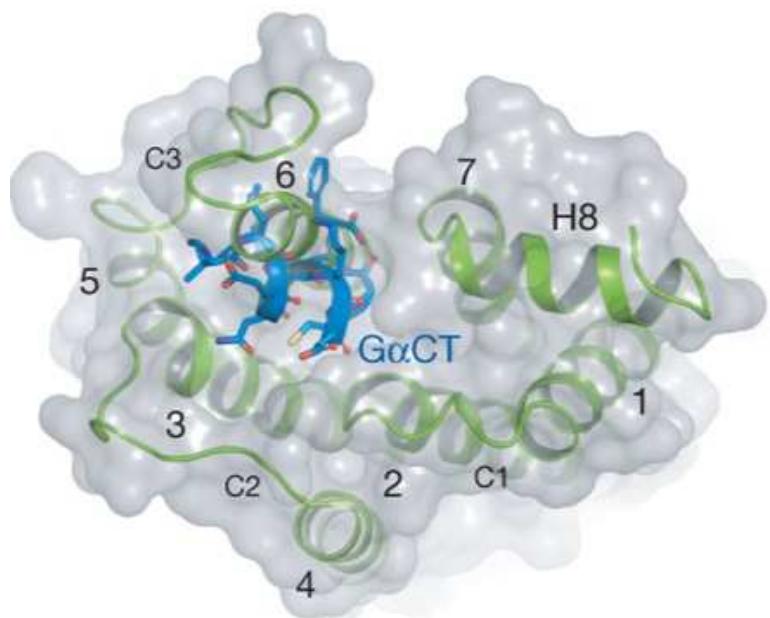
After Photon - Light State

$h\nu$   
70%

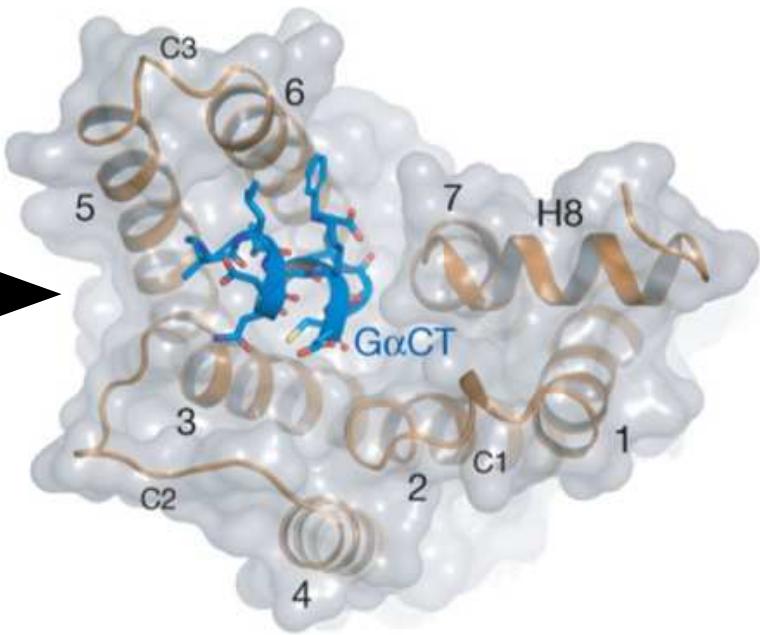
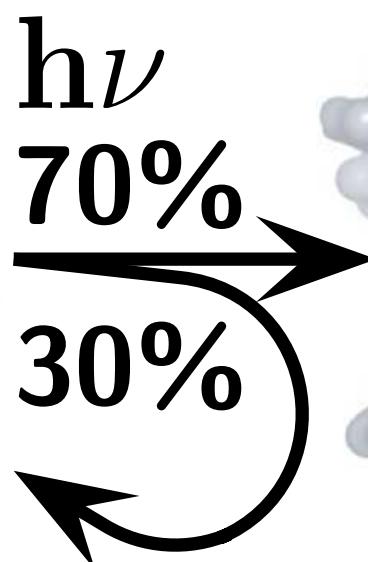


# Rhodopsin Shape Change

Dark State

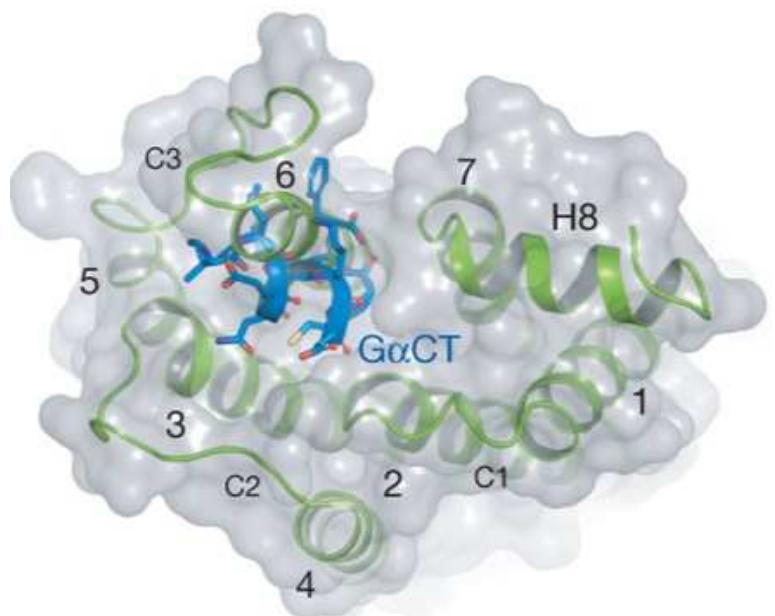


After Photon - Light State

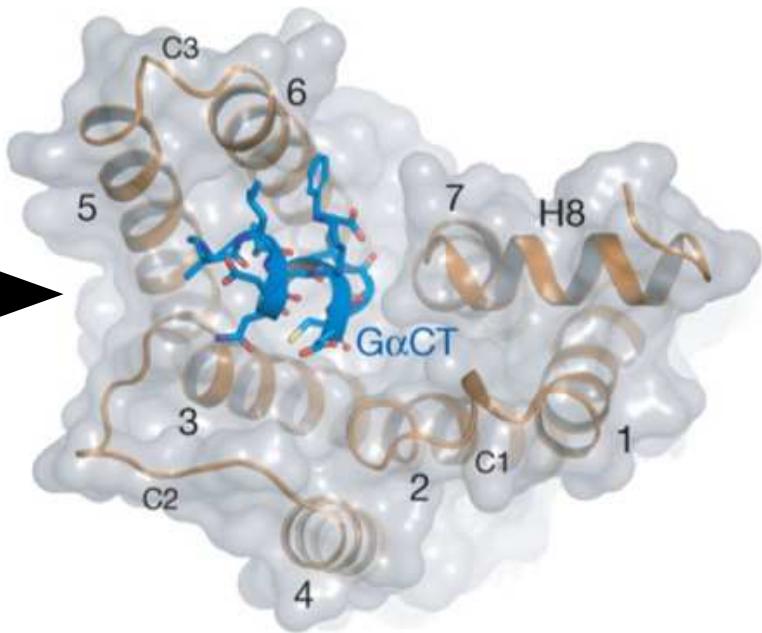


# Rhodopsin Shape Change

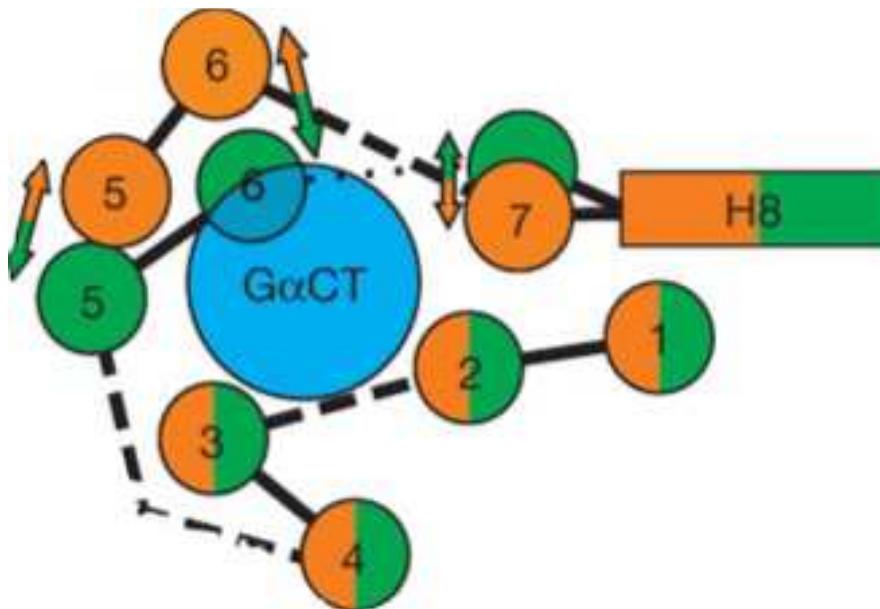
Dark State



After Photon - Light State

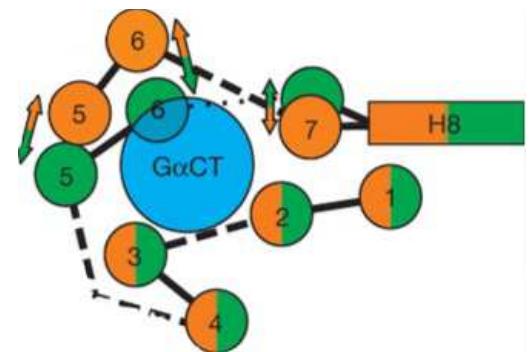
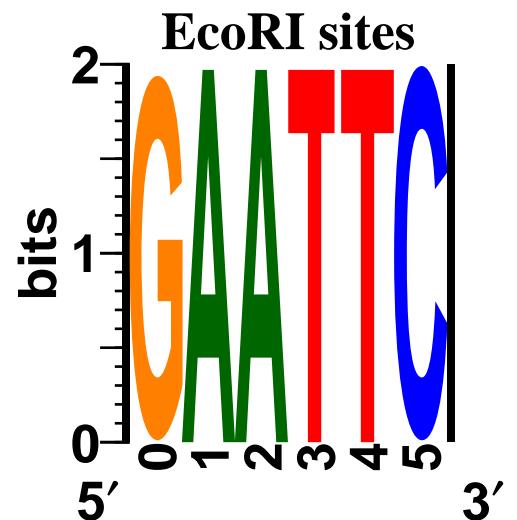


$h\nu$   
70%  
30%



# Why are molecular machines 70% efficient?

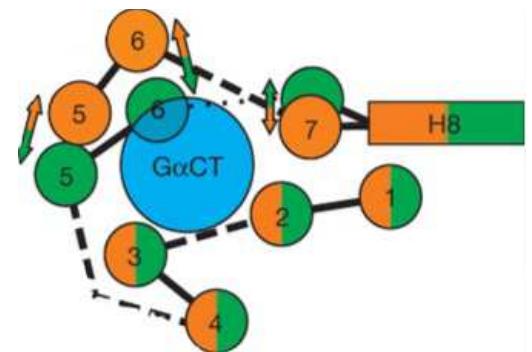
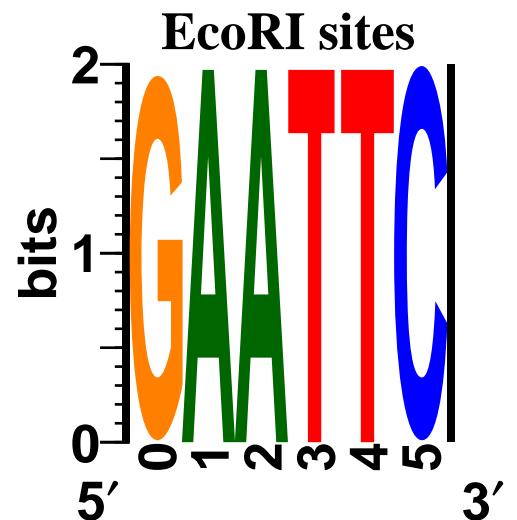
70% efficiency appears widely in biology:



# Why are molecular machines 70% efficient?

70% efficiency appears widely in biology:

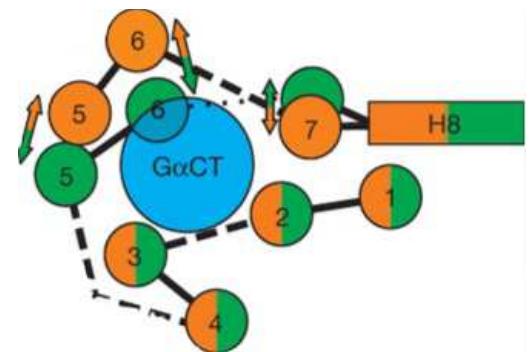
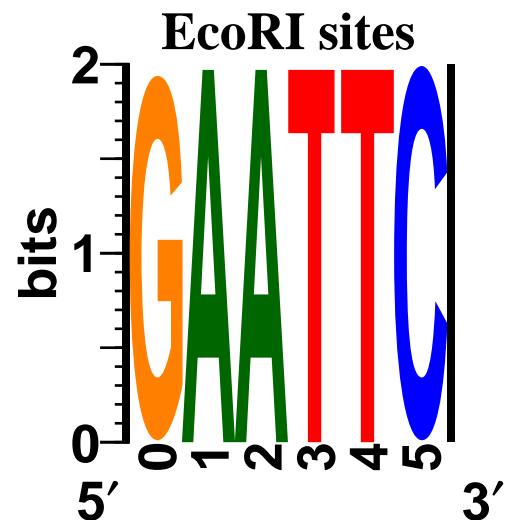
- DNA - protein binding



# Why are molecular machines 70% efficient?

70% efficiency appears widely in biology:

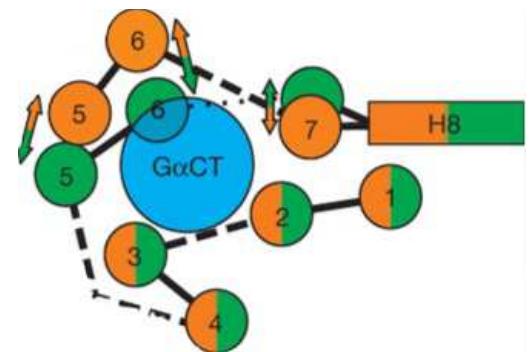
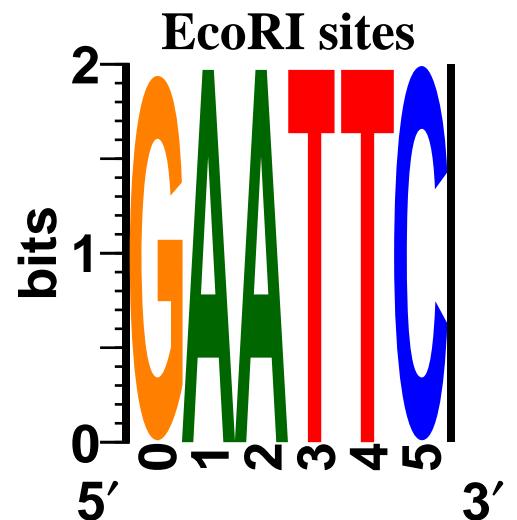
- DNA - protein binding
- rhodopsin



# Why are molecular machines 70% efficient?

70% efficiency appears widely in biology:

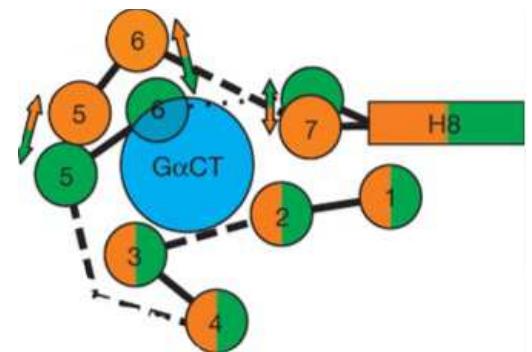
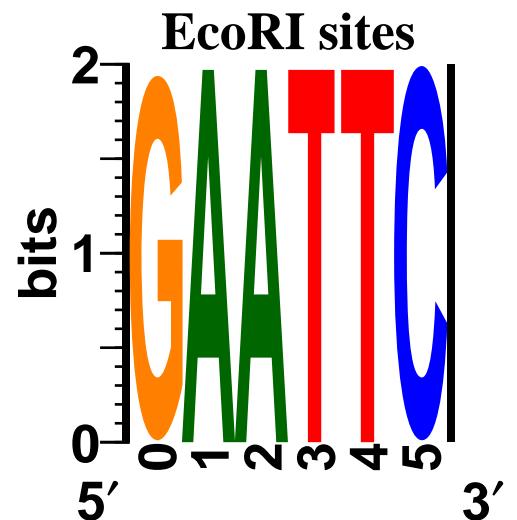
- DNA - protein binding
- rhodopsin
- muscle



# Why are molecular machines 70% efficient?

70% efficiency appears widely in biology:

- DNA - protein binding
- rhodopsin
- muscle
- other systems

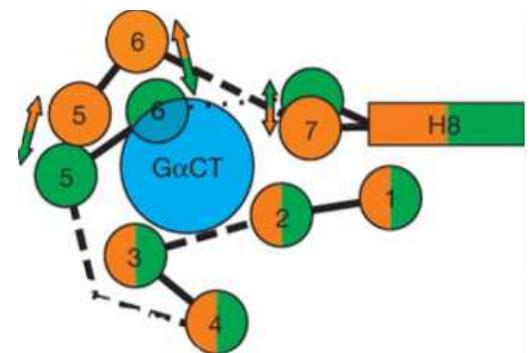
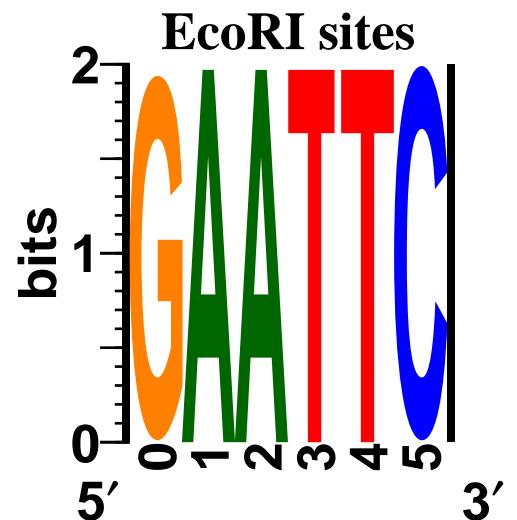


# Why are molecular machines 70% efficient?

70% efficiency appears widely in biology:

- DNA - protein binding
- rhodopsin
- muscle
- other systems

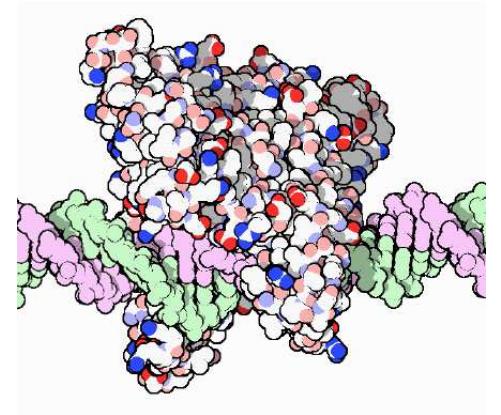
Why 70% efficiency?



# Theoretical Isothermal Efficiency

- For molecular states of molecules with  $d_{space}$  ‘parts’  $P_y$  energy is dissipated for noise  $N_y$  and

$$C = d_{space} \log_2(P_y/N_y + 1) \leftarrow \text{machine capacity}$$

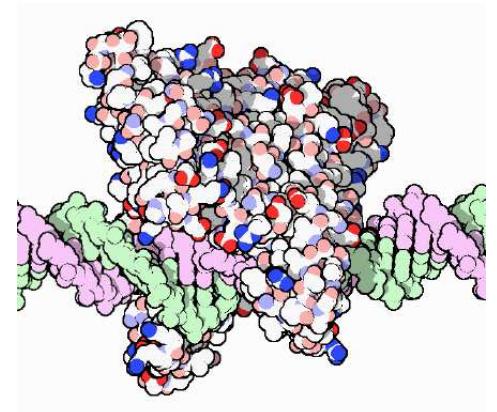


# Theoretical Isothermal Efficiency

- For molecular states of molecules with  $d_{space}$  ‘parts’  $P_y$  energy is dissipated for noise  $N_y$  and

$$C = d_{space} \log_2(P_y/N_y + 1) \leftarrow \text{machine capacity}$$

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y}+1\right)}{\frac{P_y}{N_y}} \leftarrow \text{molecular efficiency}$$

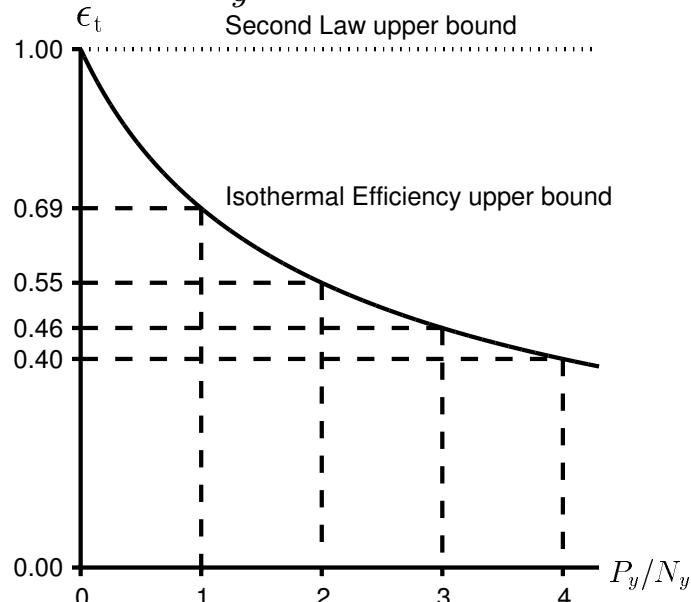


# Theoretical Isothermal Efficiency

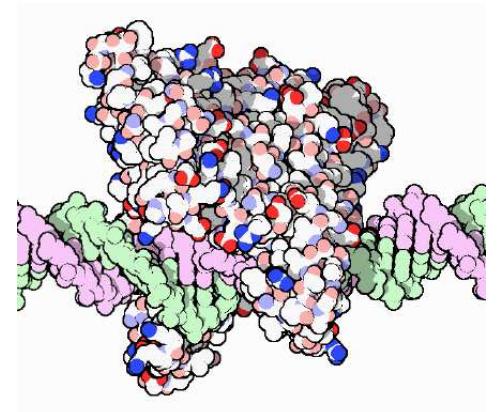
- For molecular states of molecules with  $d_{space}$  ‘parts’  $P_y$  energy is dissipated for noise  $N_y$  and

$$C = d_{space} \log_2(P_y/N_y + 1) \leftarrow \text{machine capacity}$$

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}} \leftarrow \text{molecular efficiency}$$



The curve is an upper bound

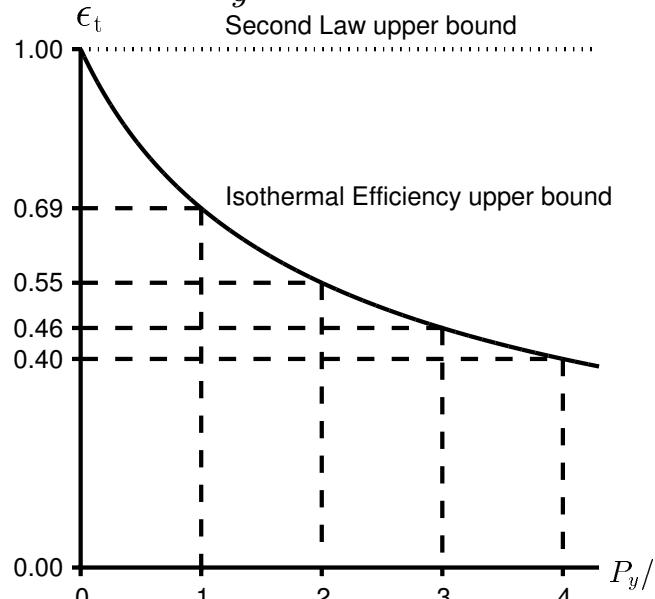


# Theoretical Isothermal Efficiency

- For molecular states of molecules with  $d_{space}$  ‘parts’  $P_y$  energy is dissipated for noise  $N_y$  and

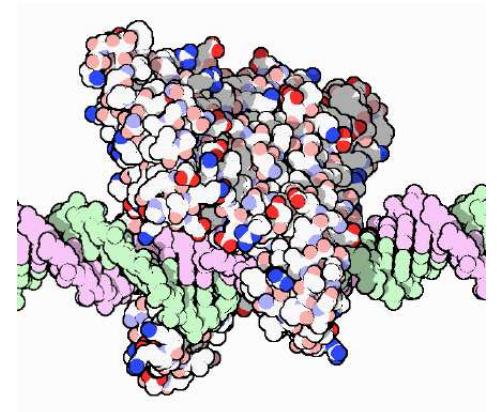
$$C = d_{space} \log_2(P_y/N_y + 1) \leftarrow \text{machine capacity}$$

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}} \leftarrow \text{molecular efficiency}$$



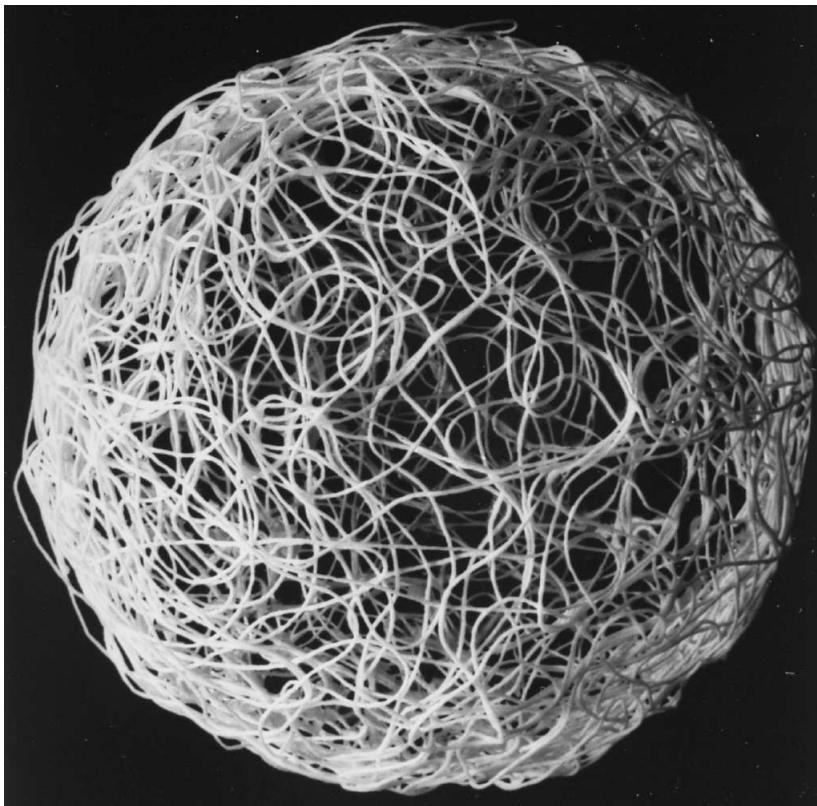
The curve is an upper bound

- If  $P_y/N_y = 1$  the efficiency is 70%!



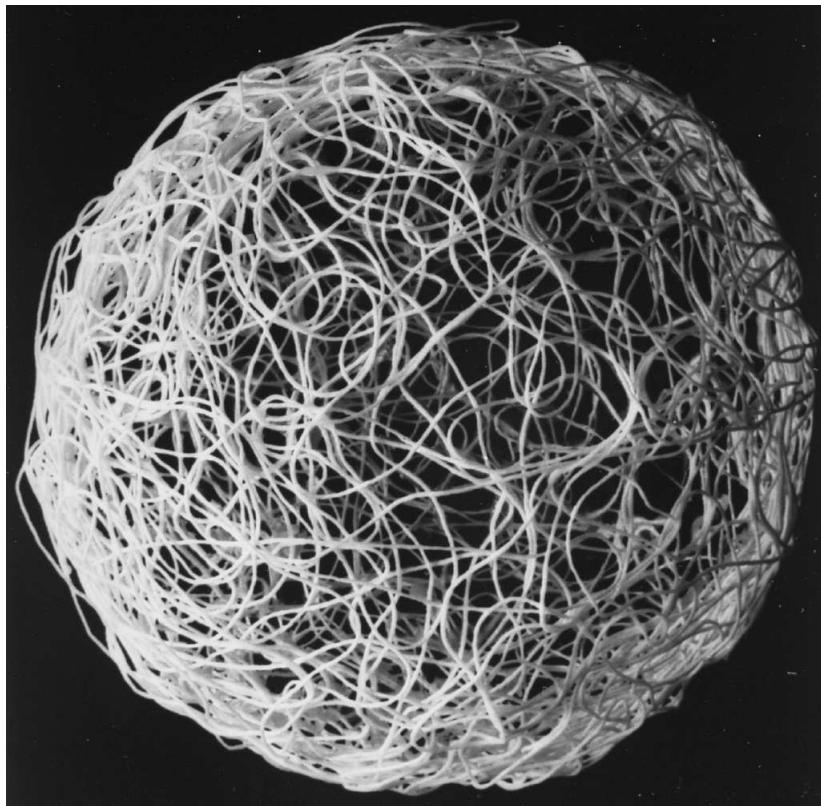
# N Dimensional Sphere Separation

Degenerate Sphere

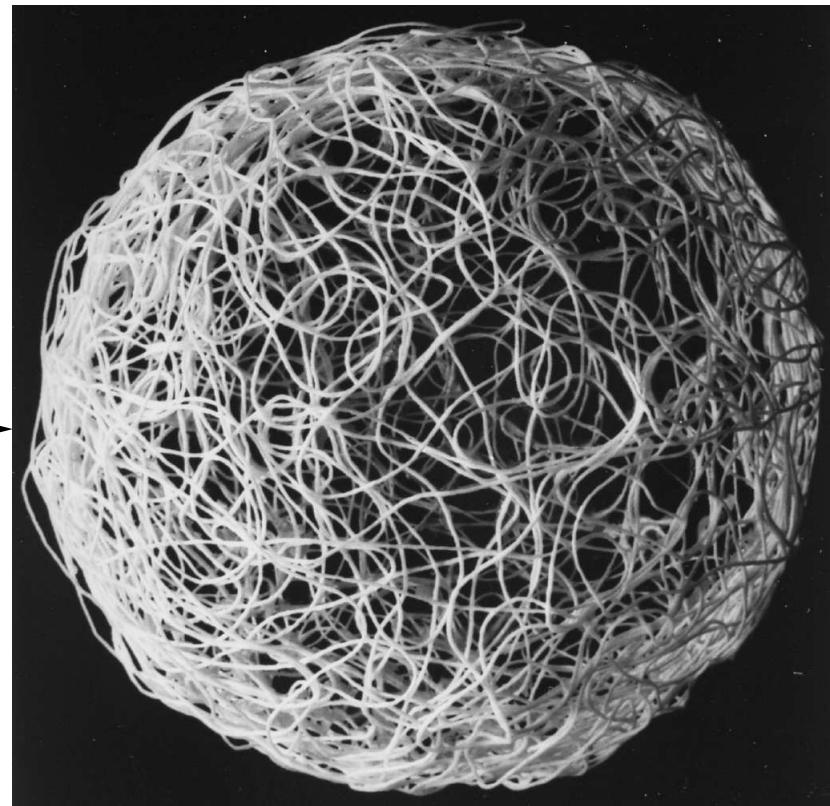


# N Dimensional Sphere Separation

Degenerate Sphere

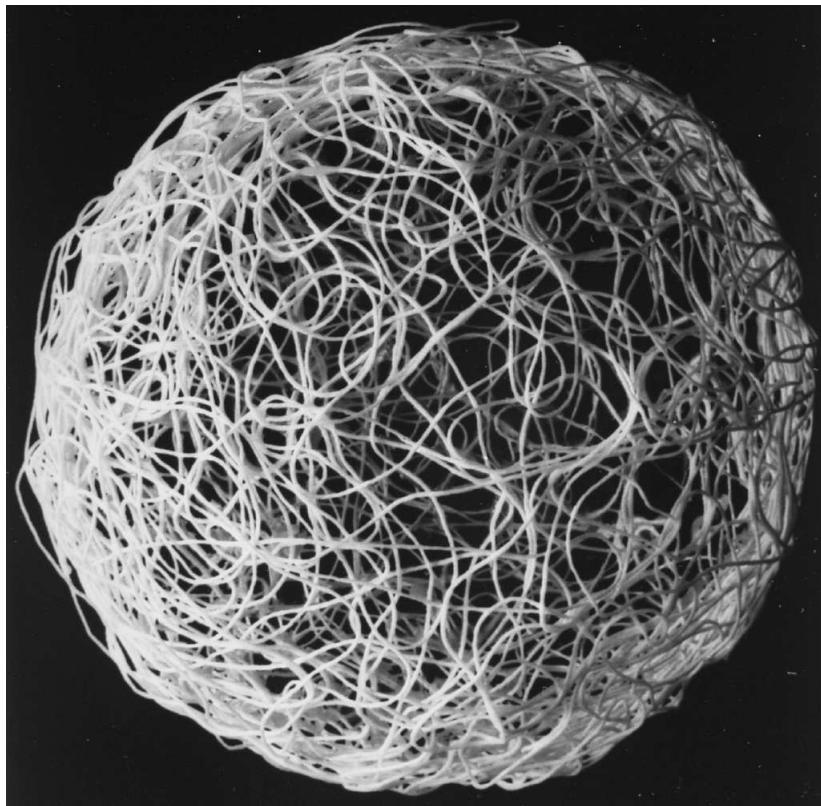


Forward Sphere

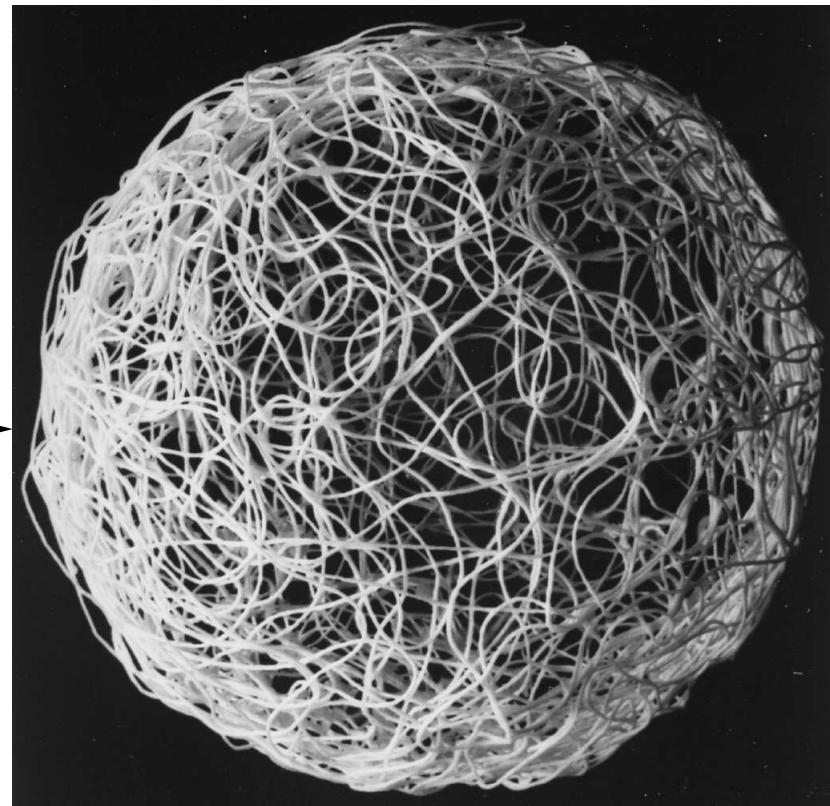


# N Dimensional Sphere Separation

Degenerate Sphere



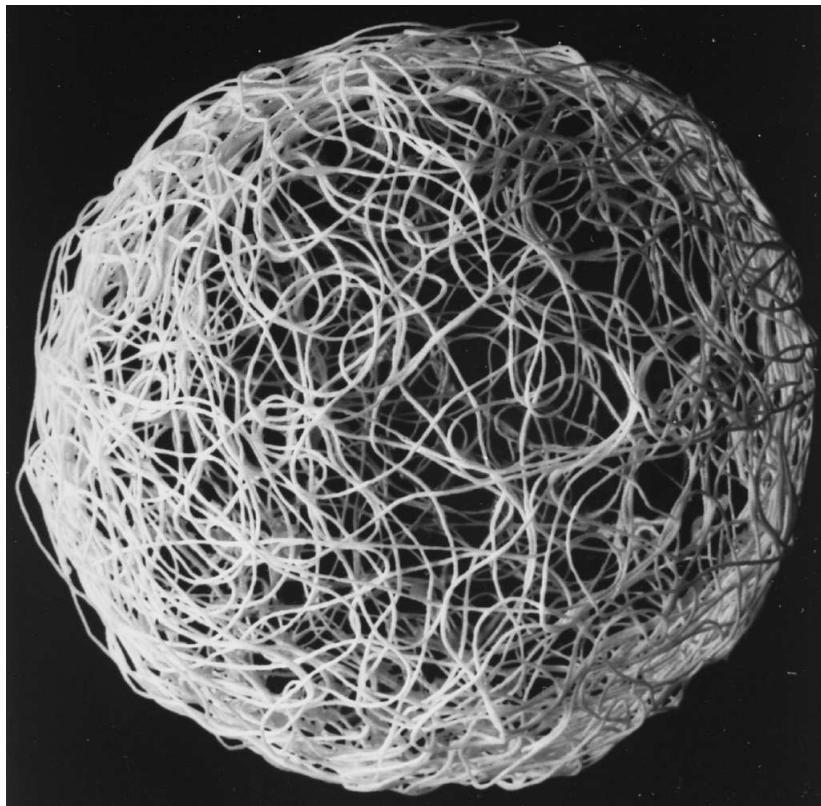
Forward Sphere



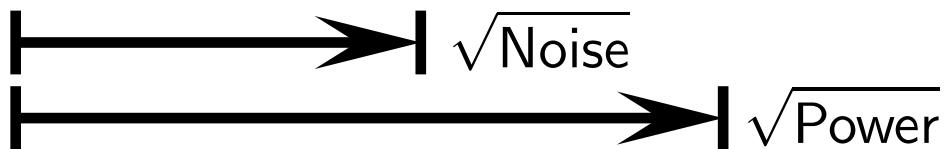
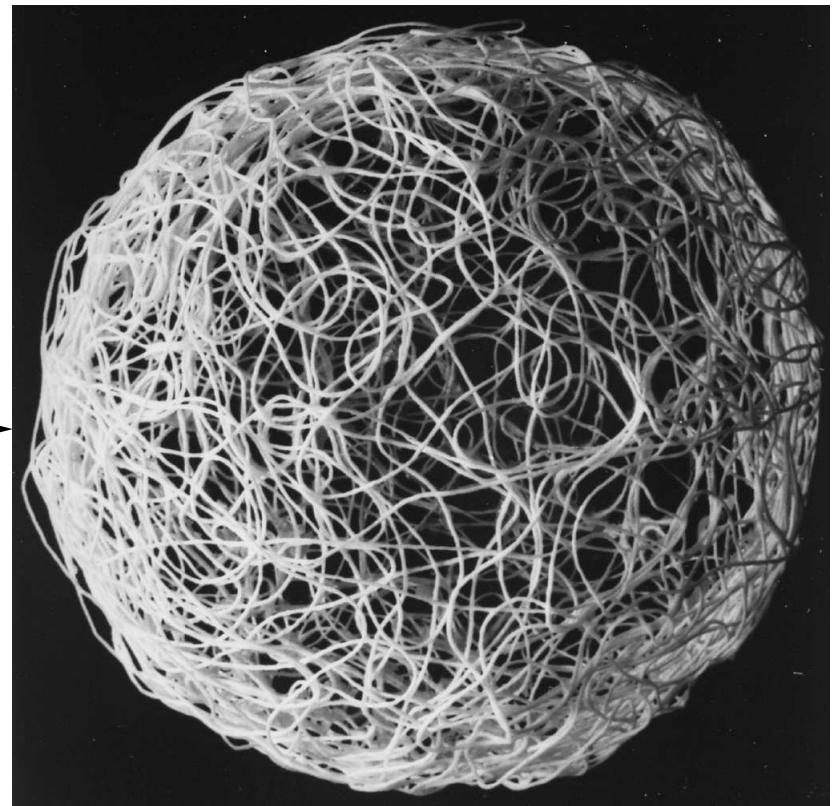
→  $\sqrt{\text{Noise}}$

# N Dimensional Sphere Separation

Degenerate Sphere

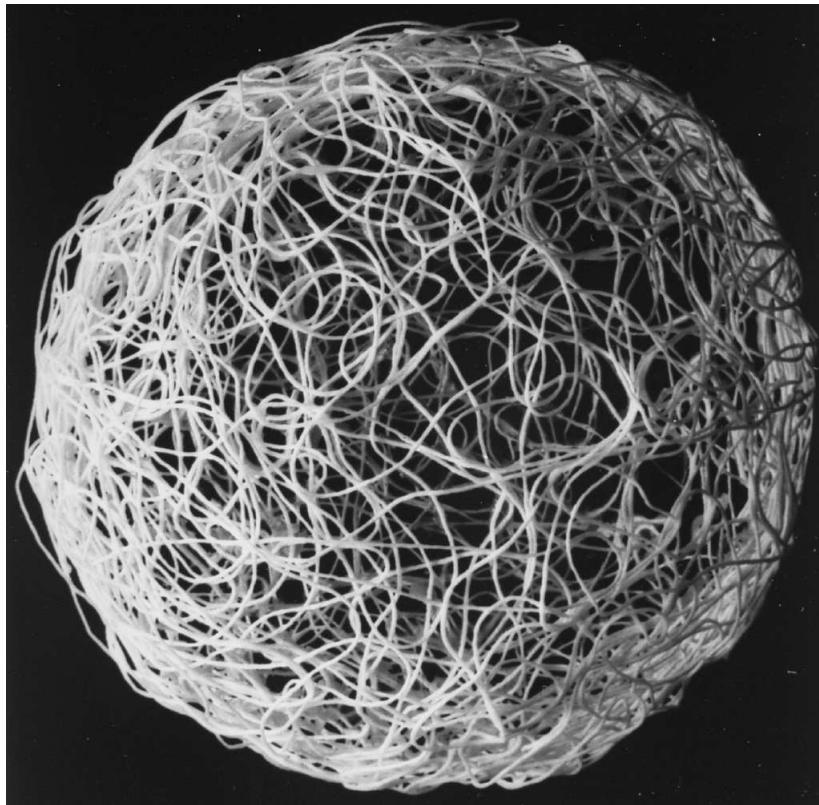


Forward Sphere

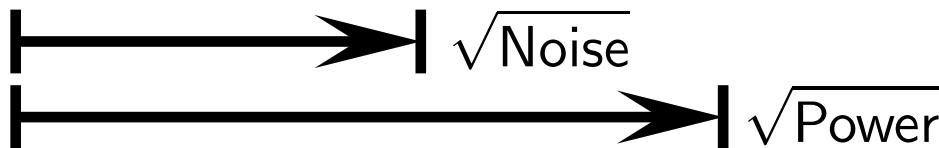
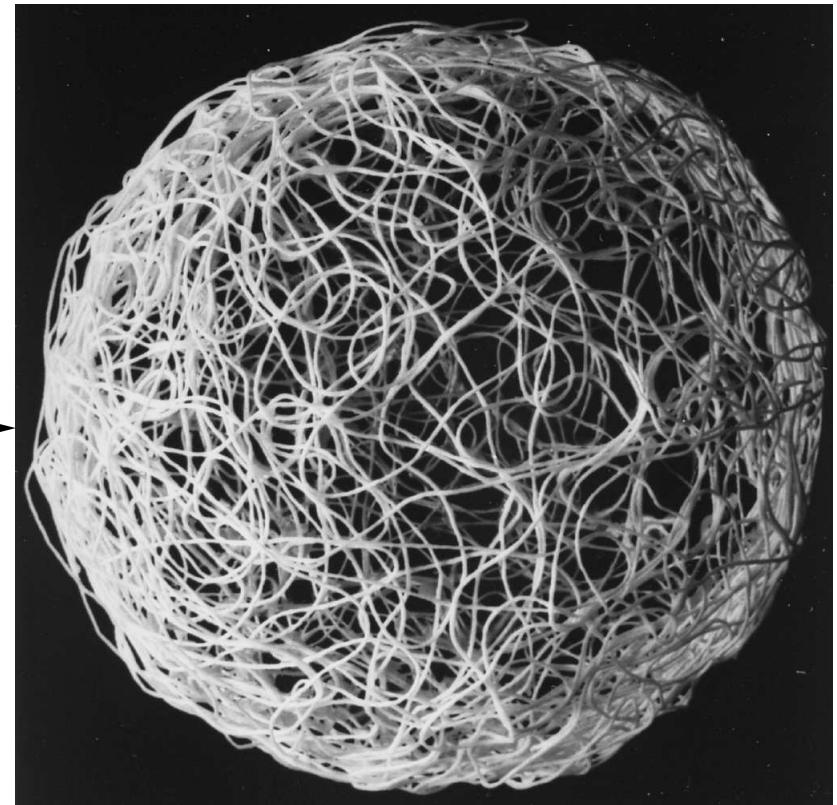


# N Dimensional Sphere Separation

Degenerate Sphere



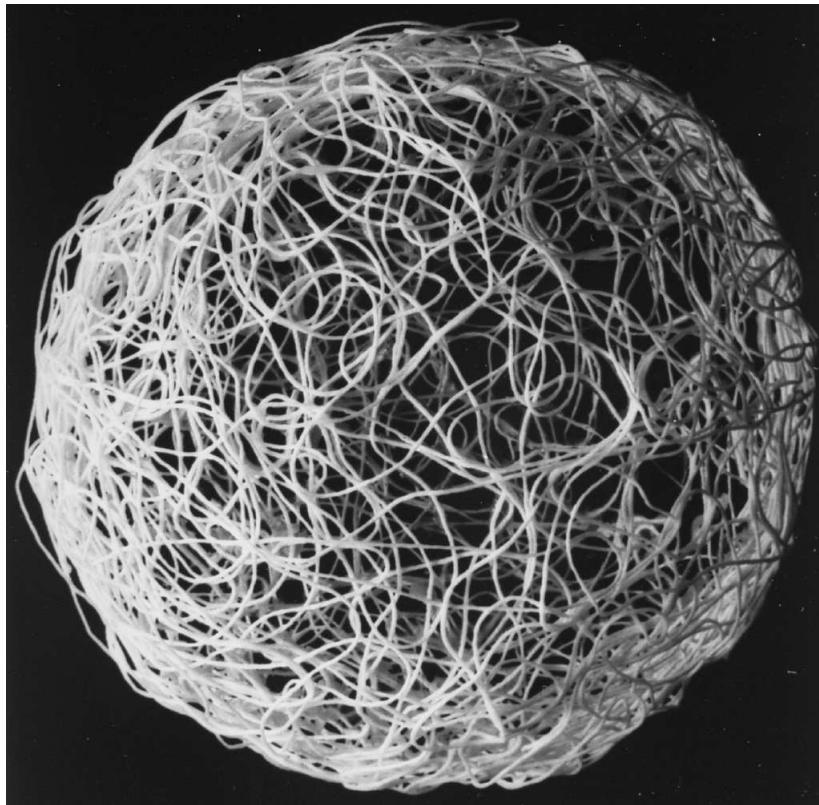
Forward Sphere



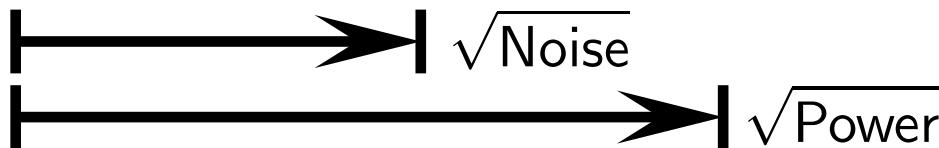
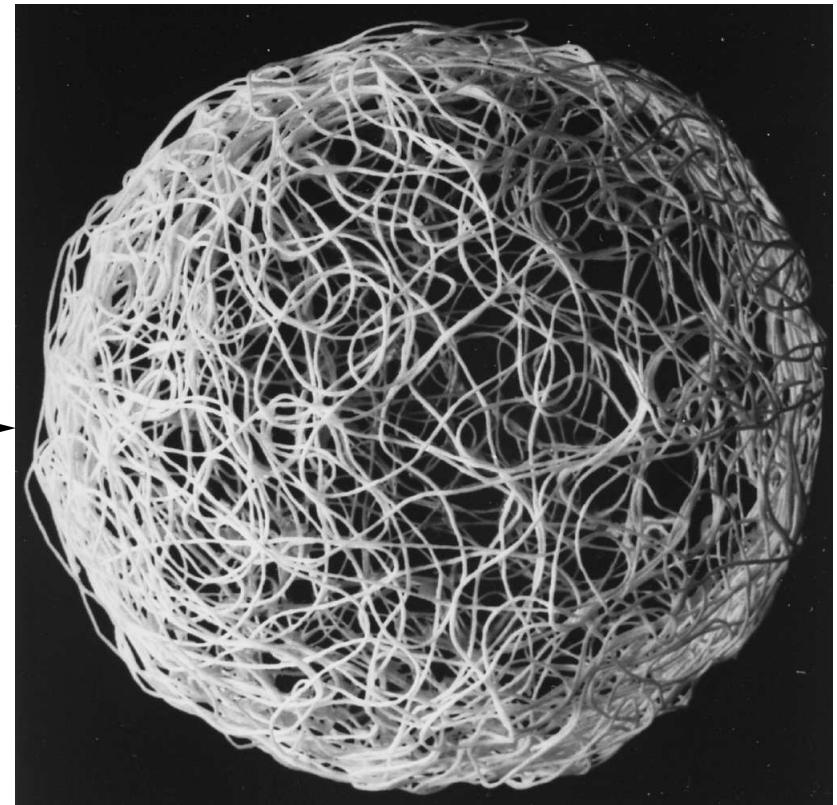
Energy dissipated to escape the Degenerate Sphere must exceed the Noise

# N Dimensional Sphere Separation

Degenerate Sphere



Forward Sphere



Energy dissipated to escape the Degenerate Sphere must exceed the Noise

$$\sqrt{\text{Power}} > \sqrt{\text{Noise}}$$

## Why is the Genetic Code Degenerate?

# The Genetic Code

## Second base in codon

First base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

Third base in codon

# The Genetic Code

## Second base in codon

U C A G

U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

64 codons

$$\log_2 64 = 6 \text{ bits/amino acid}$$

Third base in codon

# The Genetic Code

## Second base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

**64 codons**

$$\log_2 64 = 6 \text{ bits/amino acid}$$

**20 amino acids**

$$\log_2 20 = 4.3 \text{ bits/amino acid}$$

# Efficiency of The Genetic Code

## Second base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

**64 codons**

$$\log_2 64 = 6 \text{ bits/amino acid}$$

**20 amino acids**

$$\log_2 20 = 4.3 \text{ bits/amino acid}$$

**Compute Efficiency**

$$\epsilon_r = \frac{\log_2 \text{actual choices}}{\log_2 \text{maximum choices}}$$

$$= \frac{4.3}{6} = 0.72$$

# Efficiency of The Genetic Code

## Second base in codon

	U	C	A	G	
U	Phe	Ser	Tyr	Cys	U
C	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

**64 codons**

$$\log_2 64 = 6 \text{ bits/amino acid}$$

**20 amino acids**

$$\log_2 20 = 4.3 \text{ bits/amino acid}$$

**Compute Efficiency**

$$\epsilon_r = \frac{\log_2 \text{actual choices}}{\log_2 \text{maximum choices}}$$

$$= \frac{4.3}{6} = 0.72$$

**The Genetic Code fits the theory!**

# Amino Acid Frequencies

A	114882992
C	19056074
D	73332522
E	84344300
F	52828061
G	91113903
H	29753791
I	75133404
K	71121318
L	130161413
M	29818802
N	57427084
O	8
P	67078118
Q	53820991
R	78100977
S	100354324
T	75562140
U	477
V	87249674
W	16751452
Y	40544232

## Refine the Calculation

Obtain actual amino acid frequencies from the 50% sequence identity non-redundant Protein Information Resource (PIR) UniRef50 database, January 2011.

$$n = 1,240,702,008 = 1.2 \times 10^9 \text{ amino acids}$$

# Amino Acid Frequencies

A	114882992
C	19056074
D	73332522
E	84344300
F	52828061
G	91113903
H	29753791
I	75133404
K	71121318
L	130161413
M	29818802
N	57427084
O	8
P	67078118
Q	53820991
R	78100977
S	100354324
T	75562140
U	477
V	87249674
W	16751452
Y	40544232

## Refine the Calculation

Obtain actual amino acid frequencies from the 50% sequence identity non-redundant Protein Information Resource (PIR) UniRef50 database, January 2011.

$$n = 1,240,702,008 = 1.2 \times 10^9 \text{ amino acids}$$

Compute the uncertainty:

$$\begin{aligned} H_{aa} &= - \sum_{aa=A}^Y P_{aa} \log_2 P_{aa} \quad \text{bits per amino acid} \\ &= 4.170 \quad \text{bits per amino acid} \end{aligned}$$

That's what is actually accomplished by translation.

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6}$$

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6} = 0.6949 \text{ Measured efficiency}$$

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6}$$

= 0.6949 Measured efficiency

$$\epsilon_t = 0.6931 \text{ Theoretical maximum} = \ln(2)$$

0.0018 difference

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

Since this comes from > 1 billion amino acids,  
0.2% excess is significant!

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6}$$

= 0.6949 Measured efficiency

$$\epsilon_t = 0.6931 \text{ Theoretical maximum} = \ln(2)$$

0.0018 difference

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

Since this comes from > 1 billion amino acids,  
0.2% excess is significant!

## Theory violation! ... What's Missing?

- Rare amino acids don't contribute much.

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6}$$

= 0.6949 Measured efficiency

$$\epsilon_t = 0.6931 \text{ Theoretical maximum} = \ln(2)$$

0.0018 difference

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

Since this comes from > 1 billion amino acids,  
0.2% excess is significant!

## Theory violation! ... What's Missing?

- Rare amino acids don't contribute much.
- Removing the stop codons reduces the maximum from 6 bits to  $\log_2 61 = 5.931$  bits and the efficiency would be  $4.170/5.931 = 0.7031$ , so this makes the situation worse and does not explain the discrepancy.

# Translational Efficiency

Compute the efficiency:

$$\epsilon_r = \frac{4.170}{6}$$

= 0.6949 Measured efficiency

$$\epsilon_t = 0.6931 \text{ Theoretical maximum} = \ln(2)$$

0.0018 difference

		Second base in codon					
		U	C	A	G		
U	Phe	Ser	Tyr	Cys	U		
	Phe	Ser	Tyr	Cys	C		
	Leu	Ser	och	opa	A		
	Leu	Ser	amb	Trp	G		
C	Leu	Pro	His	Arg	U		
	Leu	Pro	His	Arg	C		
	Leu	Pro	Gln	Arg	A		
	Leu	Pro	Gln	Arg	G		
A	Ile	Thr	Asn	Ser	U		
	Ile	Thr	Asn	Ser	C		
	Ile	Thr	Lys	Arg	A		
	Met	Thr	Lys	Arg	G		
G	Val	Ala	Asp	Gly	U		
	Val	Ala	Asp	Gly	C		
	Val	Ala	Glu	Gly	A		
	Val	Ala	Glu	Gly	G		

Since this comes from > 1 billion amino acids,  
0.2% excess is significant!

## Theory violation! ... What's Missing?

- Rare amino acids don't contribute much.
- Removing the stop codons reduces the maximum from 6 bits to  $\log_2 61 = 5.931$  bits and the efficiency would be  $4.170/5.931 = 0.7031$ , so this makes the situation worse and does not explain the discrepancy.
- Translational error rate was not accounted for?

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.  
See if we can compute it.

Second base in codon				Third base in codon	
U	C	A	G		
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.

See if we can compute it.

## Compute Error Rate

Proper Computation:

$$\epsilon_r = \frac{H_{\text{before}} - H_{\text{after}}}{6} = \frac{4.170 - H_{\text{error}}}{6} = \ln 2$$

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.  
See if we can compute it.

## Compute Error Rate

Proper Computation:

$$\epsilon_r = \frac{H_{\text{before}} - H_{\text{after}}}{6} = \frac{4.170 - H_{\text{error}}}{6} = \ln 2$$

Average probability of misincorporation,  $P_{\text{error}}$  determines the information lost:

$$H_{\text{error}} = [-P_{\text{error}} \log_2 P_{\text{error}}] + [-(1 - P_{\text{error}}) \log_2 (1 - P_{\text{error}})]$$

Second base in codon				Third base in codon	
U	C	A	G		
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.  
See if we can compute it.

## Compute Error Rate

Proper Computation:

$$\epsilon_r = \frac{H_{\text{before}} - H_{\text{after}}}{6} = \frac{4.170 - H_{\text{error}}}{6} = \ln 2$$

Average probability of misincorporation,  $P_{\text{error}}$  determines the information lost:

$$H_{\text{error}} = [-P_{\text{error}} \log_2 P_{\text{error}}] + [-(1 - P_{\text{error}}) \log_2 (1 - P_{\text{error}})]$$

Solving gives the **theoretically predicted error rate of translation**:

$$P_{\text{error}} = 0.94 \times 10^{-4} \approx 1 \times 10^{-3}$$

				Second base in codon	
				U C A G	
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.  
See if we can compute it.

## Compute Error Rate

Proper Computation:

$$\epsilon_r = \frac{H_{\text{before}} - H_{\text{after}}}{6} = \frac{4.170 - H_{\text{error}}}{6} = \ln 2$$

Average probability of misincorporation,  $P_{\text{error}}$  determines the information lost:

$$H_{\text{error}} = [-P_{\text{error}} \log_2 P_{\text{error}}] + [-(1 - P_{\text{error}}) \log_2 (1 - P_{\text{error}})]$$

Solving gives the **theoretically predicted error rate of translation**:

$$P_{\text{error}} = 0.94 \times 10^{-4} \approx 1 \times 10^{-3}$$

**Experimental data** from Parker (1989) gave:

$$5 \times 10^{-5} \text{ to } 3 \times 10^{-3}, \\ \text{average } \approx (1 \pm 1) \times 10^{-3}$$

				Second base in codon	
				U C A G	
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

**Theory Violation!** What's missing?

Error rate of transcription/translation was not accounted for.  
See if we can compute it.

## Compute Error Rate

Proper Computation:

$$\epsilon_r = \frac{H_{\text{before}} - H_{\text{after}}}{6} = \frac{4.170 - H_{\text{error}}}{6} = \ln 2$$

Average probability of misincorporation,  $P_{\text{error}}$  determines the information lost:

$$H_{\text{error}} = [-P_{\text{error}} \log_2 P_{\text{error}}] + [-(1 - P_{\text{error}}) \log_2 (1 - P_{\text{error}})]$$

Solving gives the **theoretically predicted error rate of translation**:

$$P_{\text{error}} = 0.94 \times 10^{-4} \approx 1 \times 10^{-3}$$

**Experimental data** from Parker (1989) gave:

$$5 \times 10^{-5} \text{ to } 3 \times 10^{-3}, \\ \text{average } \approx (1 \pm 1) \times 10^{-3}$$

**The theory correctly predicts the error rate of translation**

				Second base in codon	
				U C A G	
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
C	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

Combine:

**Frequencies of >1 billion amino acids**

Second base in codon				Third base in codon	
U	C	A	G		
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
C	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

Combine:

**Frequencies of >1 billion amino acids**

with

**The known translational error rate,  $1 \times 10^{-3}$**

Second base in codon				Third base in codon	
U	C	A	G		
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
C	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G
A	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
	Met	Thr	Lys	Arg	G
G	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

# Efficiency of the Genetic Code

Combine:

**Frequencies of >1 billion amino acids**

with

**The known translational error rate,  $1 \times 10^{-3}$**

$$(H_{aa} - H(P_{\text{error}}))/6 = 0.69304765 = \text{measured efficiency}$$

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

# Efficiency of the Genetic Code

Second base in codon				Third base in codon	
U	C	A	G		
U	Phe	Ser	Tyr	Cys	U
	Phe	Ser	Tyr	Cys	C
	Leu	Ser	och	opa	A
C	Leu	Ser	amb	Trp	G
	Leu	Pro	His	Arg	U
	Leu	Pro	His	Arg	C
	Leu	Pro	Gln	Arg	A
A	Leu	Pro	Gln	Arg	G
	Ile	Thr	Asn	Ser	U
	Ile	Thr	Asn	Ser	C
	Ile	Thr	Lys	Arg	A
G	Met	Thr	Lys	Arg	G
	Val	Ala	Asp	Gly	U
	Val	Ala	Asp	Gly	C
	Val	Ala	Glu	Gly	A
	Val	Ala	Glu	Gly	G

Combine:

**Frequencies of >1 billion amino acids**

with

**The known translational error rate,  $1 \times 10^{-3}$**

$$(H_{aa} - H(P_{\text{error}}))/6 = 0.69304765 = \text{measured efficiency}$$
$$\ln(2) = 0.69314718 = \text{theoretical efficiency}$$

# Efficiency of the Genetic Code

				Second base in codon		
				U C A G		
U		Phe	Ser	Tyr	Cys	U
		Phe	Ser	Tyr	Cys	C
		Leu	Ser	och	opa	A
		Leu	Ser	amb	Trp	G
C		Leu	Pro	His	Arg	U
		Leu	Pro	His	Arg	C
		Leu	Pro	Gln	Arg	A
		Leu	Pro	Gln	Arg	G
A		Ile	Thr	Asn	Ser	U
		Ile	Thr	Asn	Ser	C
		Ile	Thr	Lys	Arg	A
		Met	Thr	Lys	Arg	G
G		Val	Ala	Asp	Gly	U
		Val	Ala	Asp	Gly	C
		Val	Ala	Glu	Gly	A
		Val	Ala	Glu	Gly	G

Combine:

**Frequencies of >1 billion amino acids**

with

**The known translational error rate,  $1 \times 10^{-3}$**

$$(H_{aa} - H(P_{\text{error}}))/6 = 0.69304765 = \text{measured efficiency}$$
$$\ln(2) = 0.69314718 = \text{theoretical efficiency}$$
$$\Delta = \underline{0.00009953} = \text{difference}$$

# Efficiency of the Genetic Code

Combine:

**Frequencies of >1 billion amino acids**

with

**The known translational error rate,  $1 \times 10^{-3}$**

		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	

$$(H_{aa} - H(P_{\text{error}}))/6 = 0.69304765 = \text{measured efficiency}$$
$$\ln(2) = 0.69314718 = \text{theoretical efficiency}$$
$$\Delta = \underline{0.00009953} = \text{difference}$$

**The theory matches the data to 4 decimal places!**

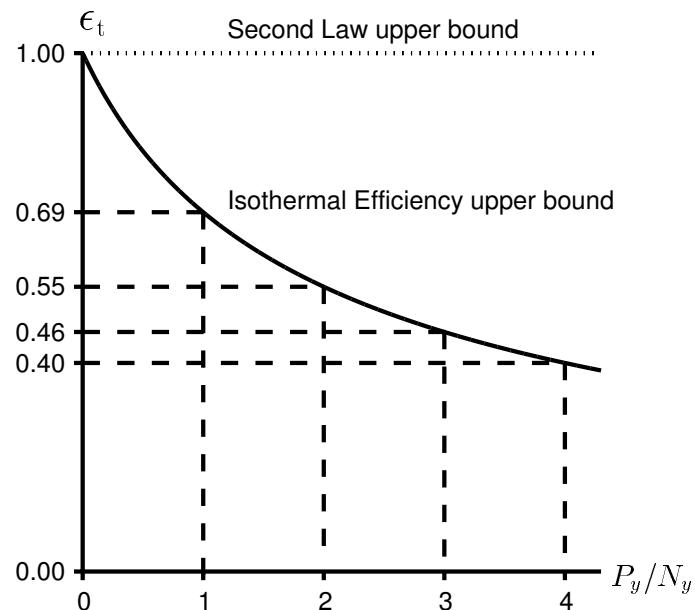
## Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$

# Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$
- . . . so the genetic code is optimally efficient molecular machine

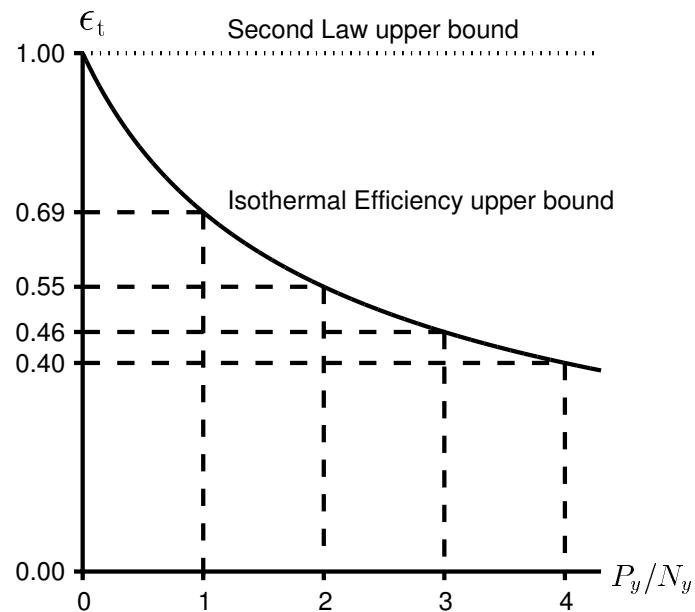
$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}}$$



# Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$
- . . . so the genetic code is optimally efficient molecular machine

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}}$$

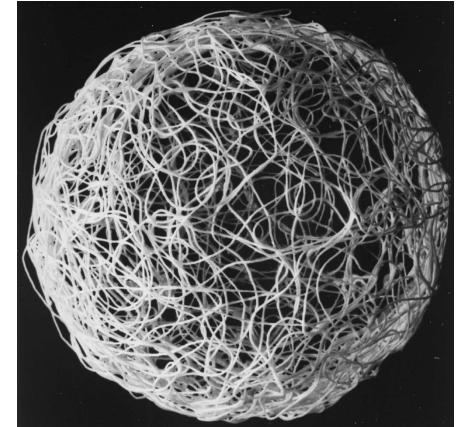
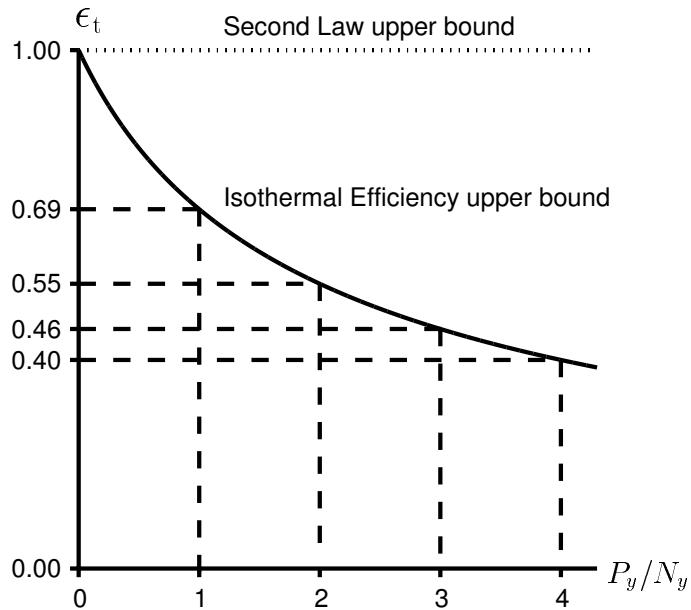


- . . . so  $P_y/N_y \geq 1$

# Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$
- . . . so the genetic code is optimally efficient molecular machine

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}}$$

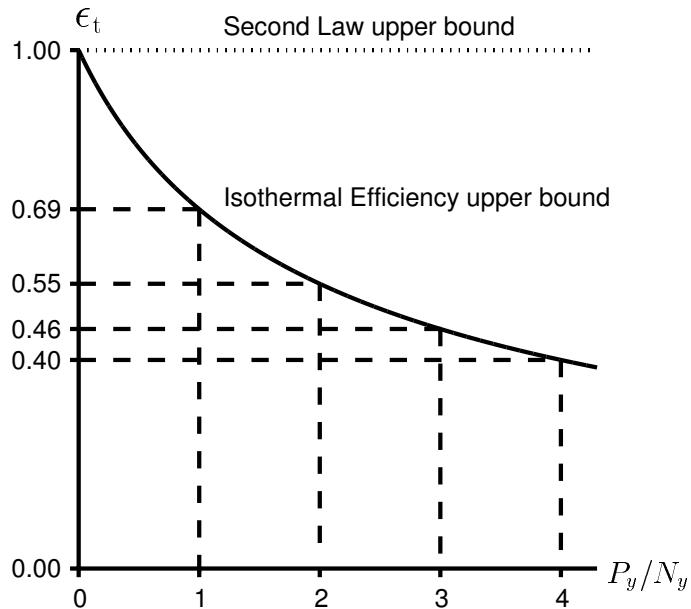


- . . . so  $P_y/N_y \geq 1$
- . . . so the amino acid states are distinct high dimensional spheres

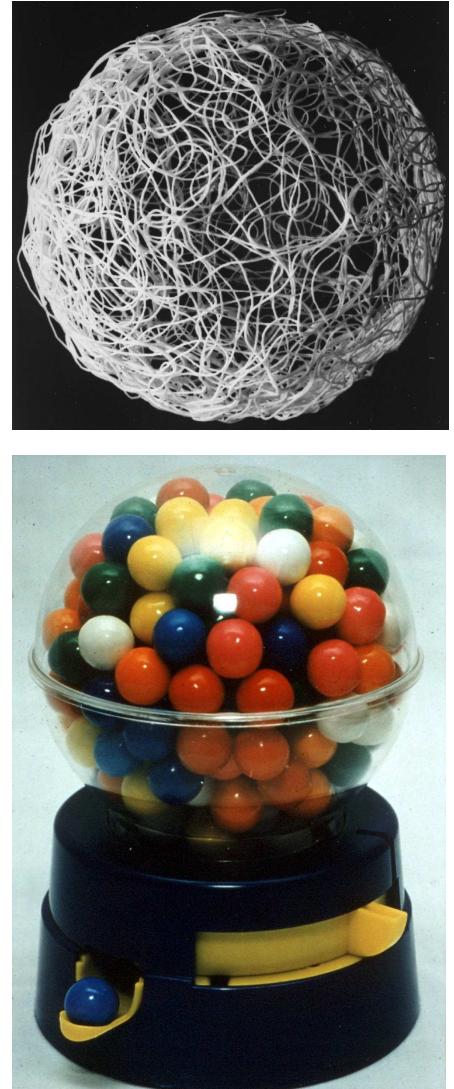
# Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$
- . . . so the genetic code is optimally efficient molecular machine

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}}$$



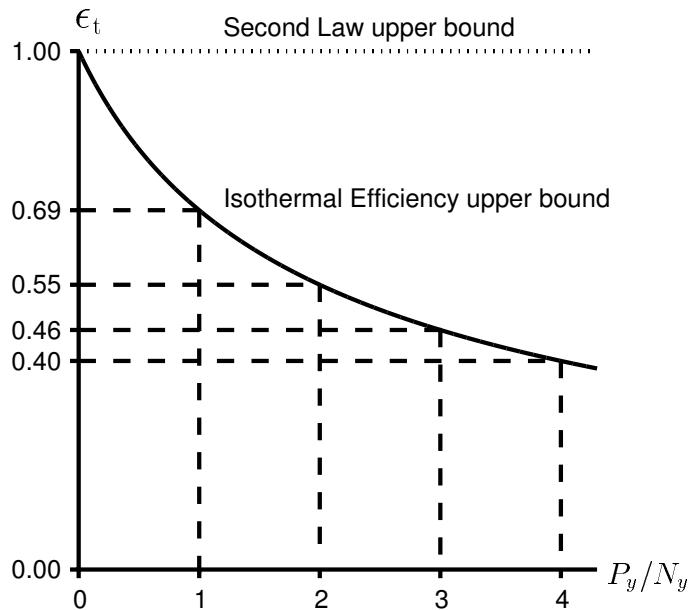
- . . . so  $P_y/N_y \geq 1$
- . . . so the amino acid states are distinct high dimensional spheres
- . . . and there is good sphere packing: the spheres do not intersect.



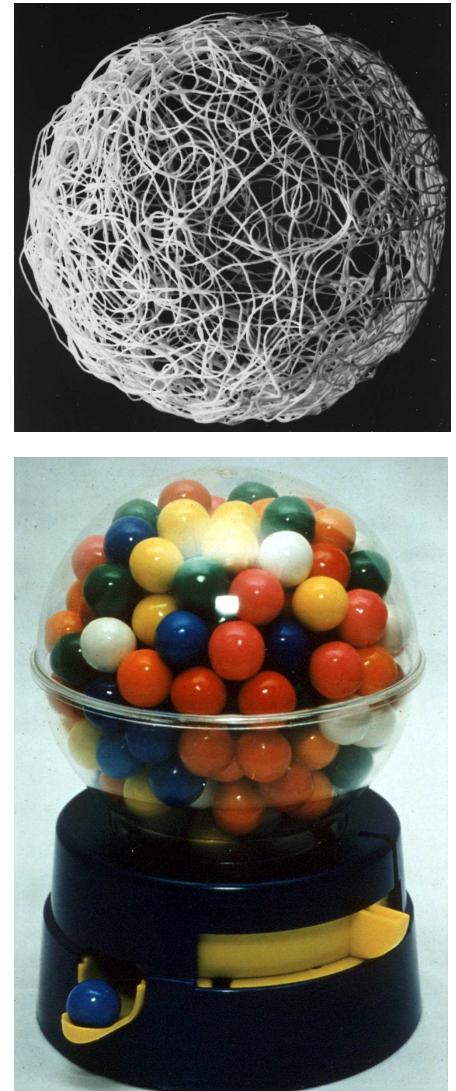
# Why the Genetic Code is Degenerate

- The genetic code has an isothermal efficiency at  $\ln 2 = 0.693$
- . . . so the genetic code is optimally efficient molecular machine

$$\epsilon_t \leq \frac{\ln\left(\frac{P_y}{N_y} + 1\right)}{\frac{P_y}{N_y}}$$



- . . . so  $P_y/N_y \geq 1$
- . . . so the amino acid states are distinct high dimensional spheres
- . . . and there is good sphere packing: the spheres do not intersect.
- The price for having distinct states is ‘degeneracy’.



# Acknowledgments

**Herbert A. Schneider (1922-2009)**

**Andrzej Ehrenfeucht**

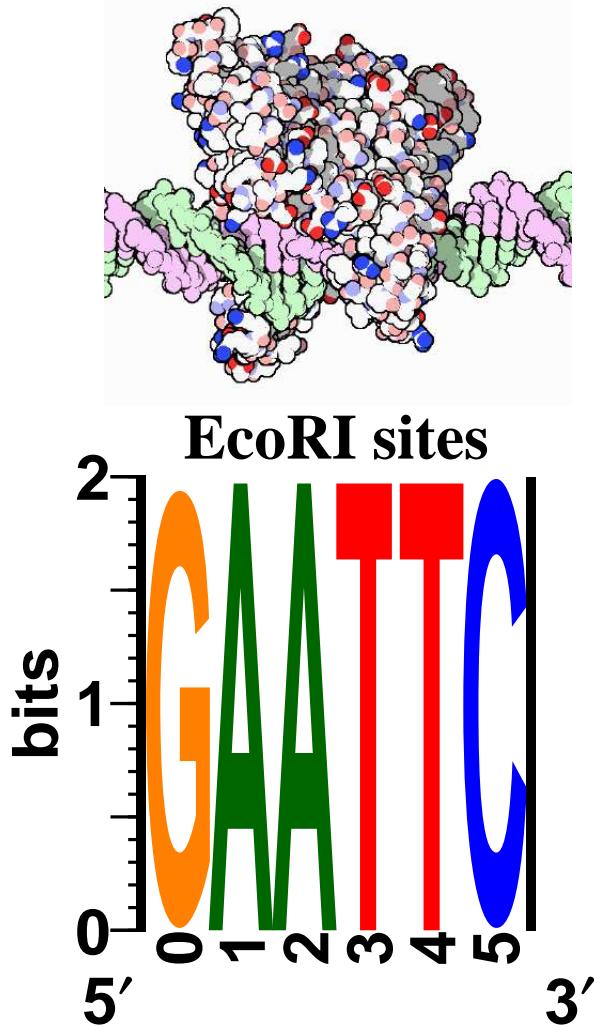
**John Spouge, Peter Rogan, John Garavelli**

Andrzej Konopka, Martin Bier, Ilya Lyakhov, Danielle Needle, Peyman Khalichi, Carrie Paterson, Ryan Shultz-aberger, Amar Klar, Peter Lemkin, Barry Zeeberg, Lynn Bayer, Zehua Chen, Blake Sweeney, Bert Gold, Sorina Eftim, Mikhail Kashlev, Alex Mitrophanov, Peter Thomas, Hong Qian, Baris E. Suzek, Jeff Strathern and Peter Wills

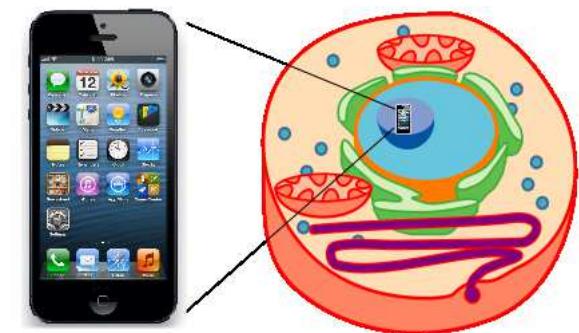
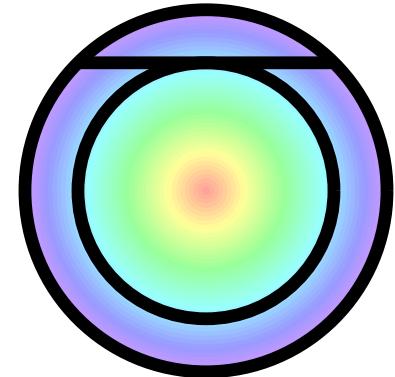
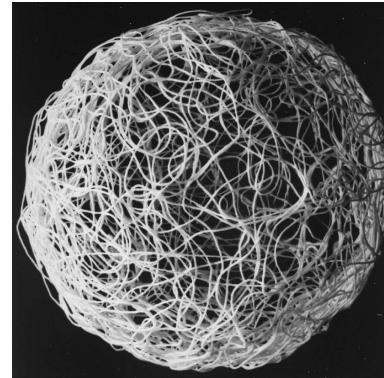
**National Institutes of Health, National Cancer Institute**



Web site:  
[TinyURL.com/tomschneider](http://TinyURL.com/tomschneider)



		Second base in codon				Third base in codon
		U	C	A	G	
U	Phe	Ser	Tyr	Cys	U	
	Phe	Ser	Tyr	Cys	C	
	Leu	Ser	och	opa	A	
	Leu	Ser	amb	Trp	G	
C	Leu	Pro	His	Arg	U	
	Leu	Pro	His	Arg	C	
	Leu	Pro	Gln	Arg	A	
	Leu	Pro	Gln	Arg	G	
A	Ile	Thr	Asn	Ser	U	
	Ile	Thr	Asn	Ser	C	
	Ile	Thr	Lys	Arg	A	
	Met	Thr	Lys	Arg	G	
G	Val	Ala	Asp	Gly	U	
	Val	Ala	Asp	Gly	C	
	Val	Ala	Glu	Gly	A	
	Val	Ala	Glu	Gly	G	





# Version

version = 1.58 of code15.tex 2014 Apr 29