

# CS284A Representations & Algorithms for Molecular Biology

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# Today's Goals

- Course information
- Challenges in computational biology
- Introduction to molecular biology

# Course Information

- Lecture: TT 3:30-4:50pm in PSCB 220
- Grading
  - 30% Homework
  - 20% Scribe note
  - 50% Final project
- Exams
  - no final exams
- Course Prerequisites:
  - Programming skill (Perl/Python, Matlab/R)
  - Statistics, Calculus, basic knowledge of Biology

# Course Goals

- Introduction to computational biology
  - Fundamental problems in computational biology
  - Statistical, algorithmic and machine learning techniques
  - Directions for future research in the field
- Final project:
  - Propose an innovative project
  - Design novel or implement previous algorithms to carry out the project
  - Write-up goals, approach and findings in a conference format
  - Present your project to your peers in a conference setting

# References

- Recommended Textbooks:
  - R. Durbin, S. Eddy, A. Krogh and G. Mitchison. Biological Sequence Analysis
  - P. Baldi and S. Brunak. Bioinformatics: the Machine Learning Approach
- Course Website:  
<http://www.ics.uci.edu/~xhx/courses/CS284A/>

# Why computational biology?

Computational biology/Bioinformatics is the application of computational tools and techniques to biology (mostly molecular biology).

- Lots of data
- Pattern finding, rule discovery
- Allowing analytic and predictive methodologies that support and enhance lab work
- Informatics infrastructure (data storage, retrieval)
- Data visualization
- Life itself is a computer!

# Four Aspects

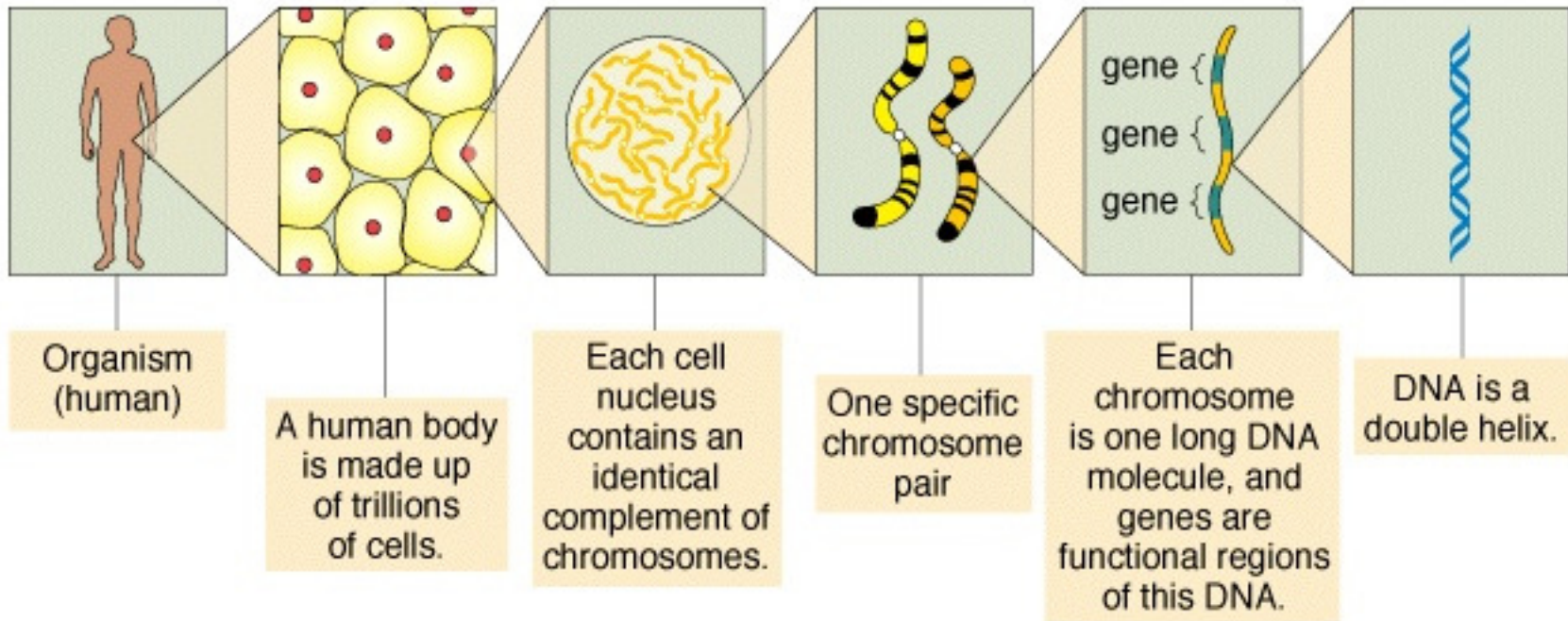
- Biology
  - What's the problem?
- Algorithm
  - How to solve the problem efficiently?
- Learning
  - How to model biology systems and learn from observed data?
- Statistics
  - How to differentiate true phenomena from artifacts?

# Topics to be covered

- DNA/RNA/Protein sequence analysis
  - Pattern finding (motif discovery, EM-algorithm)
  - Sequence alignment (Smith-Waterman, BLAST)
  - Models of sequences (HMM)
  - Gene discovery (HMM)
  - RNA folding (Stochastic context-free grammar SCFG)
- Algorithms for large-scale data analysis
  - Clustering algorithms (Hierarchical clustering, K-means)
  - Inference of networks (Regression, Bayesian networks)
  - Systems biology (Model and simulation)
- Evolutionary models
  - Phylogenetic trees
  - Comparative Genomics
- Protein world (if time allows)
  - Secondary & tertiary structure prediction



# Introduction to Molecular Biology and Genomics



# Different Life Forms Share a Common Genetic Framework



(A)



(B)

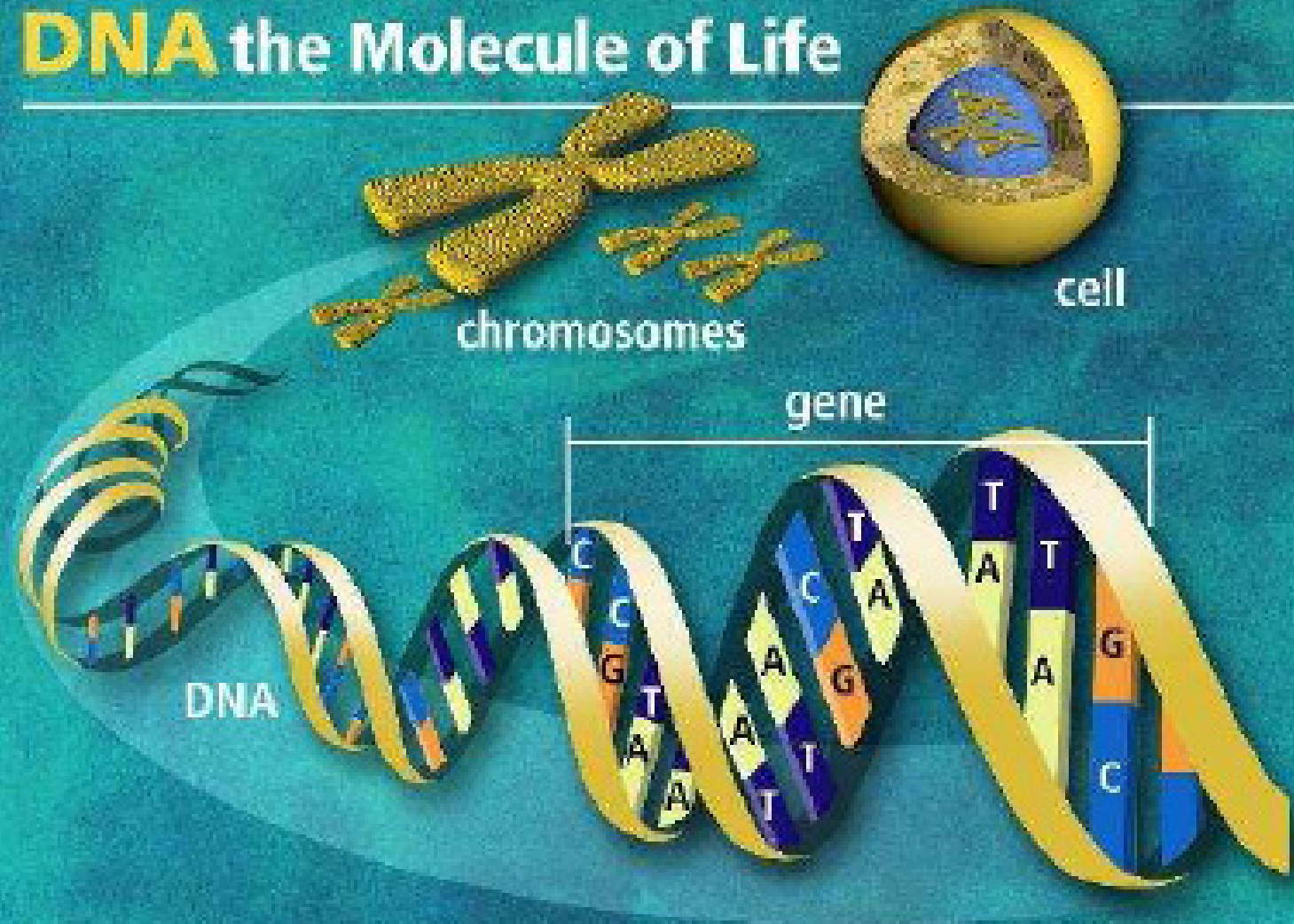


(C)



(D)

# DNA the Molecule of Life



# Deoxyribonucleic acid (DNA)

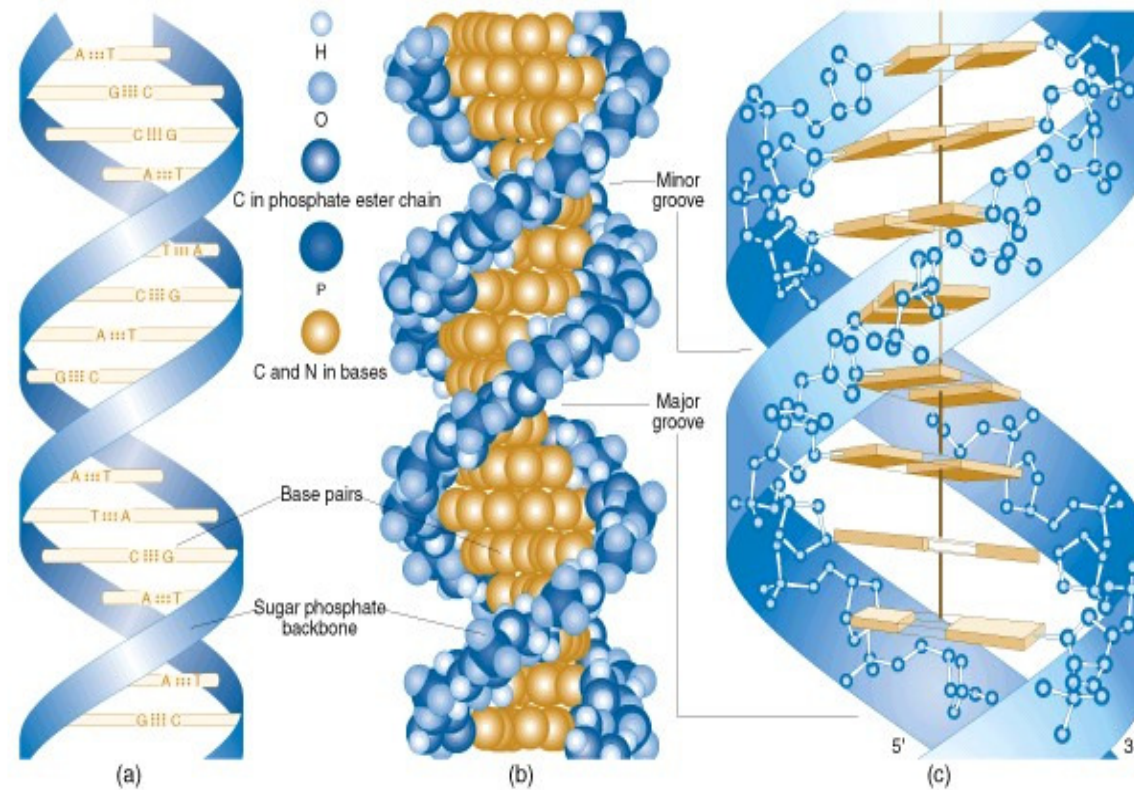
- can be thought of as the “blueprint” for an organism
- composed of small molecules called *nucleotides*
  - four different nucleotides distinguished by the four *bases*: adenine (**A**), cytosine (**C**), guanine (**G**) and thymine (**T**)
- is a *polymer*: large molecule consisting of similar units (nucleotides in this case)
- DNA is digital information
- a single strand of DNA can be thought of as a string composed of the four letters: A, C, G, T

AGCGGTTAAGGCTGATATGCGCTTTAA  
TCGCCAATTCCGACTATACGCGAAATT



# The Double Helix

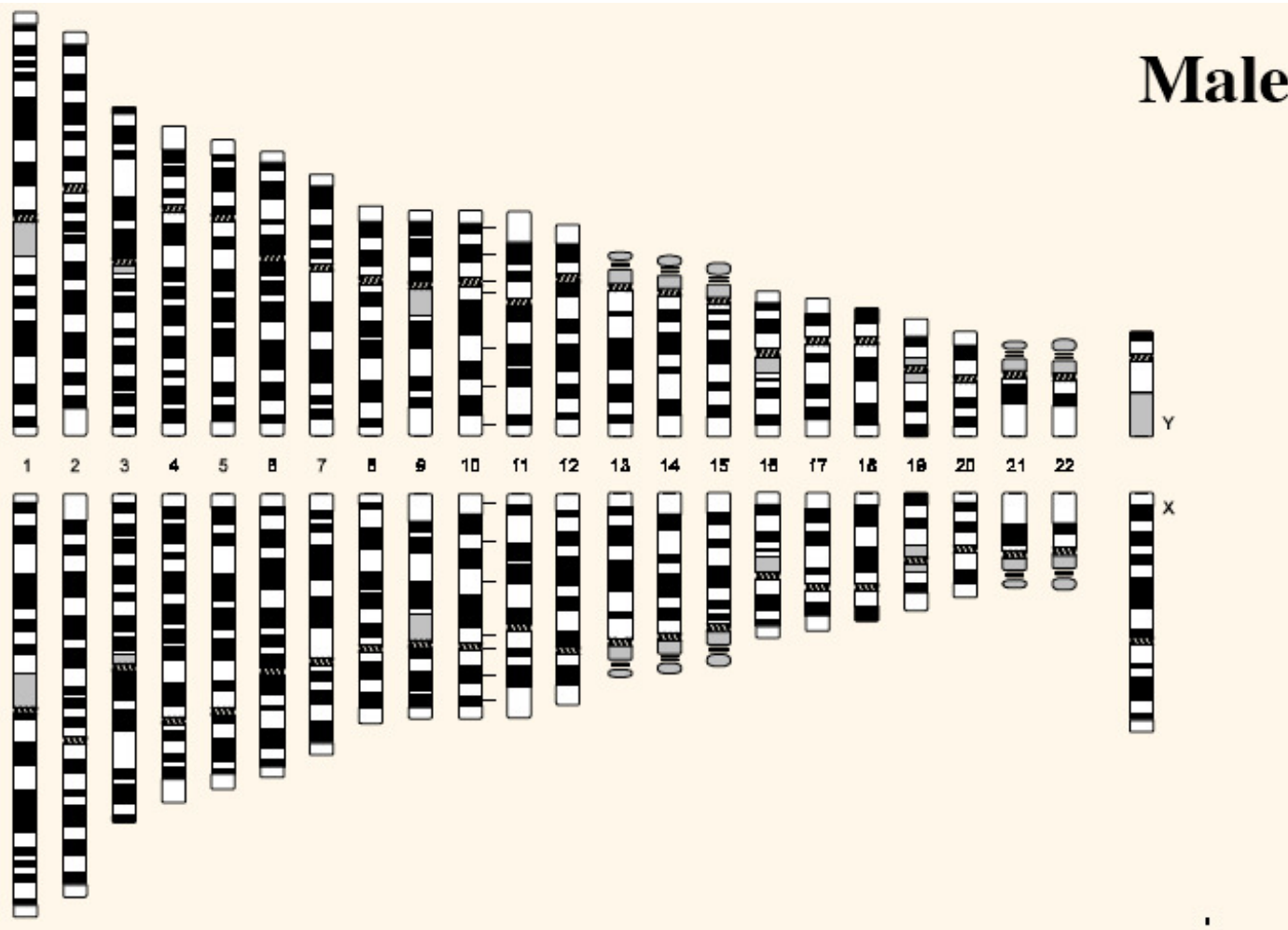
DNA molecules usually consist of two strands arranged in the famous double helix



# Genomes

- The term *genome* refers to the complete complement of DNA for a given species
- The human genome consists of 46 chromosomes
  - Male: 22 pairs of autosomes + XY
  - Female: 22 pairs of autosomes + XX
- Every cell (except sex cells and mature red blood cells) contains the complete genome of an organism

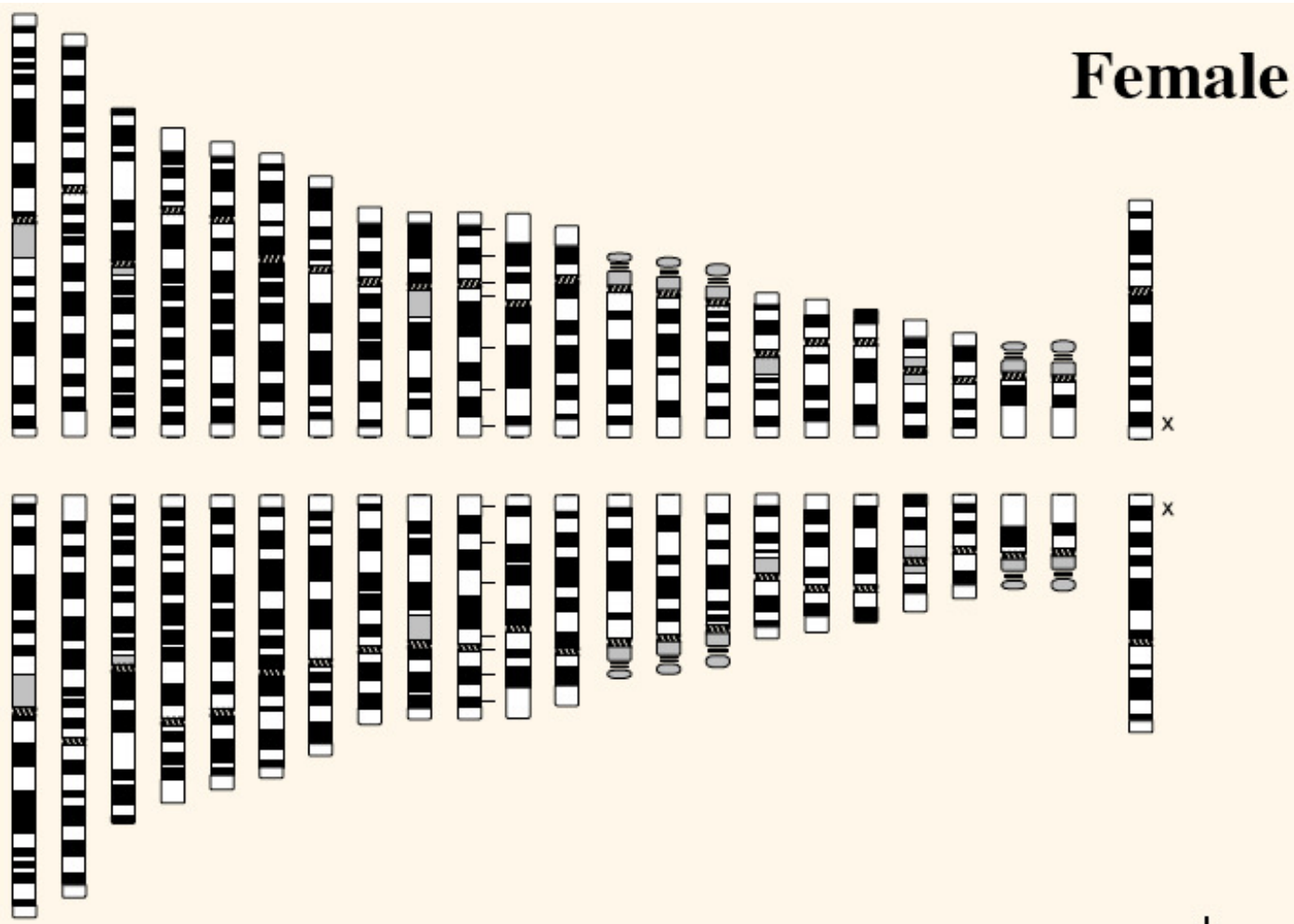
# Human Genome (Male)



22 pairs of autosomes + sex chromosomes (XY)



# Human Genome (Female)



22 pairs of autosomes + sex chromosomes (XX)

# Human Chromosomes



Karyogram

# Chromosomes

- DNA is packaged into individual *chromosomes* (along with proteins)
- *prokaryotes* (single-celled organisms lacking nuclei) have a single circular chromosome
- *eukaryotes* (organisms with nuclei) have a species-specific number of linear chromosomes
- DNA + associated chromosomal proteins = chromatin

# Proteins

- Proteins are molecules composed of one or more *polypeptides*
- A polypeptide is a polymer composed of *amino acids*
- Cells build their proteins from **20** different amino acids
- A polypeptide can be thought of as a string composed from a 20-character alphabet

# Protein Functions

- structural support
- storage of amino acids
- transport of other substances
- coordination of an organism's activities
- response of cell to chemical stimuli
- movement
- protection against disease
- selective acceleration of chemical reactions

# Amino Acids

Alanine	Ala	A
Arginine	Arg	R
Aspartic Acid	Asp	D
Asparagine	Asn	N
Cysteine	Cys	C
Glutamic Acid	Glu	E
Glutamine	Gln	Q
Glycine	Gly	G
Histidine	His	H
Isoleucine	Ile	I
Leucine	Leu	L
Lysine	Lys	K
Methionine	Met	M
Phenylalanine	Phe	F
Proline	Pro	P
Serine	Ser	S
Threonine	Thr	T
Tryptophan	Trp	W
Tyrosine	Tyr	Y
Valine	Val	V

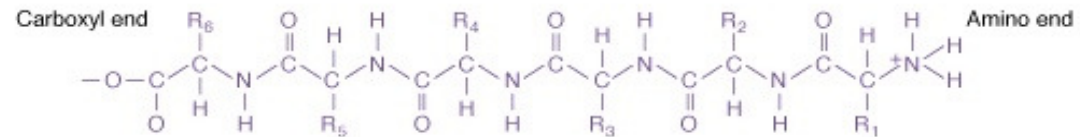
# Amino Acid Sequence of Hexokinase

```
      5      10      15      20      25      30
1  A A S X D X S L V E V H X X V F I V P P X I L Q A V V S I A
31 T T R X D D X D S A A A S I P M V P G W V L K Q V X G S Q A
61 G S F L A I V M G G G D L E V I L I X L A G Y Q E S S I X A
91 S R S L A A S M X T T A I P S D L W G N X A X S N A A F S S
121 X E F S S X A G S V P L G F T F X E A G A K E X V I K G Q I
151 T X Q A X A P S L A X L X K L I S A M X N A X F P A G D X X
181 X X V A D I X D S H G I L X X V N Y T D A X I K M G I I F G
211 S G V N A A Y W C D S T X I A D A A D A G X X G G A G X M X
241 V C C X Q D S F R K A F P S L P Q I X Y X X T L N X X S P X
271 A X K T F E K N S X A K N X G Q S L R D V L M X Y K X X G Q
301 X H X X X A X D F X A A N V E N S S Y P A K I Q K L P H F D
331 L R X X X D L F X G D Q G I A X K T X M K X V V R R X L F L
361 I A A Y A F R L V V C X I X A I C Q K K G Y S S G H I A A X
391 G S X R D Y S G F S X N S A T X N X N I Y G W P Q S A X X S
421 K P I X I T P A I D G E G A A X X V I X S I A S S Q X X X A
451 X X S A X X A
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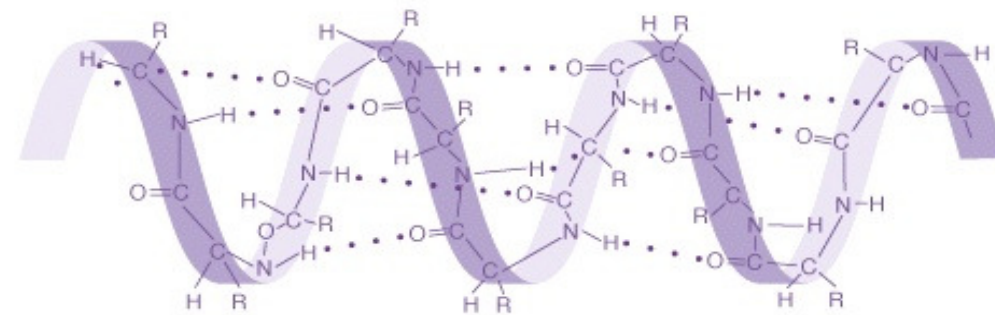
# Protein Structure

- Proteins are poly-peptides of 70-3000 amino-acids
- This structure is (mostly) determined by the sequence of amino-acids that make up the protein

(a) Primary structure

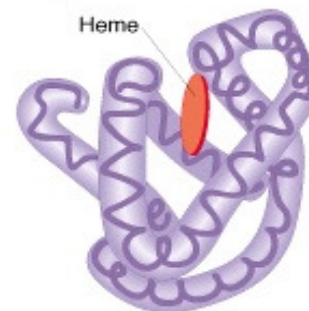


(b) Secondary structure



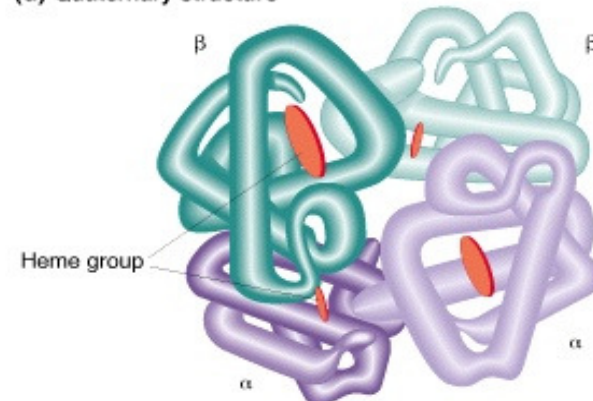
Hydrogen bonds between amino acids at different locations in polypeptide chain

(c) Tertiary structure



$\beta$  polypeptide

(d) Quaternary structure



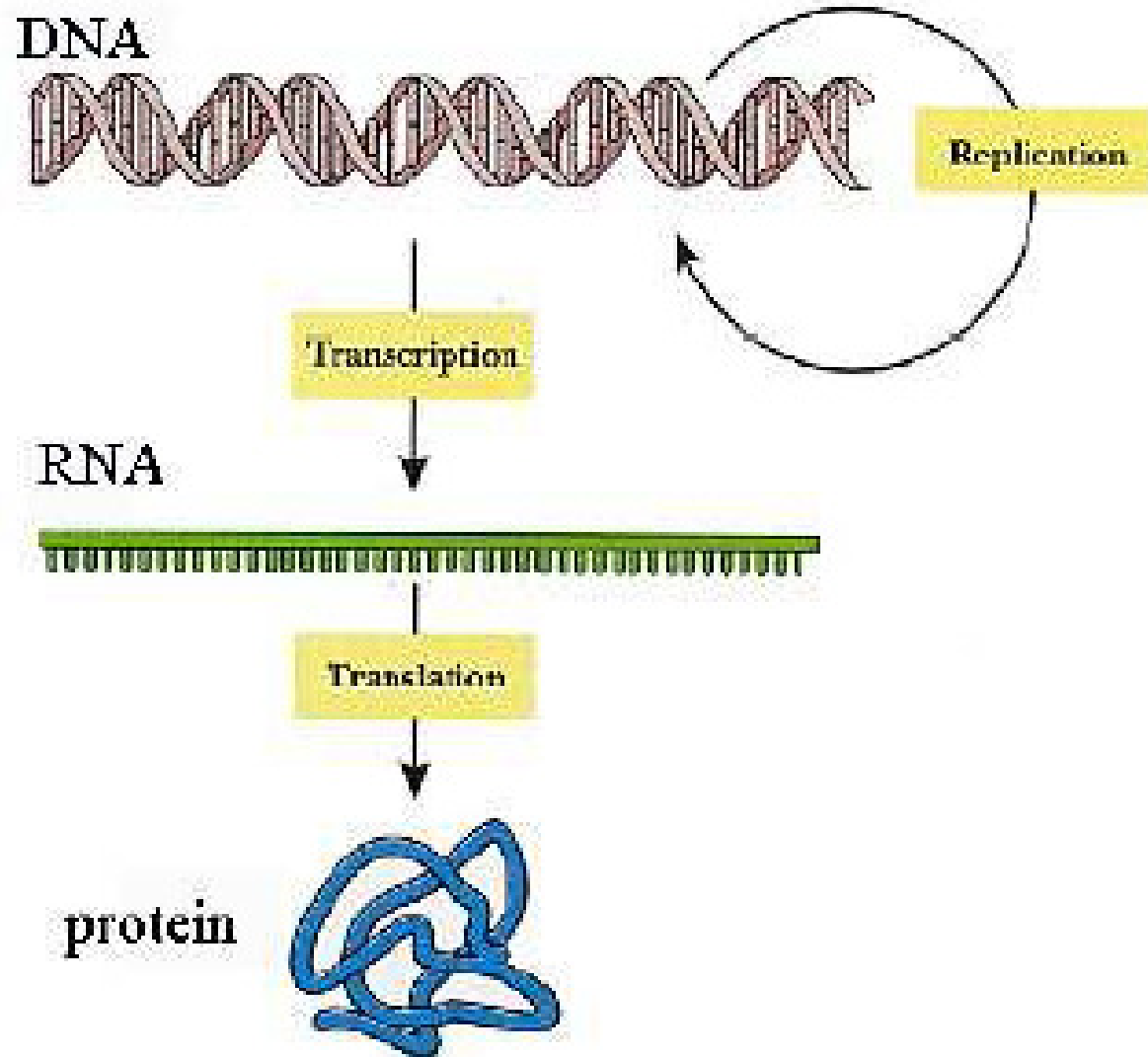
Heme group



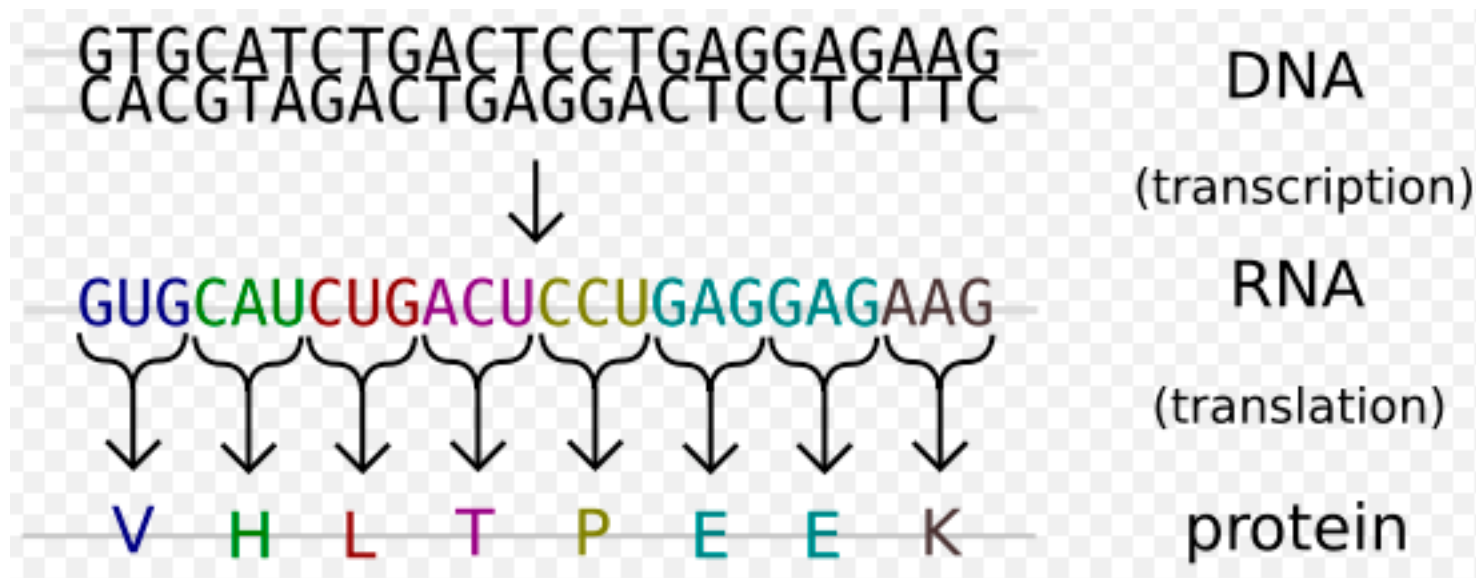
# Genes

- **Genes** are the basic units of heredity
- A gene is a sequence of bases that carries the information required for constructing a particular protein (polypeptide really)
- Such a gene is said to *encode* a protein
- The human genome comprises **~22,000** genes
- Those genes encode **>100,000** polypeptides
- RNA genes: microRNAs and other small RNAs

# The Central Dogma



# Genetic code: DNA -> mRNA -> protein



# RNA

- RNA is like DNA except:
  - backbone is a little different
  - usually single stranded
  - the base uracil (**U**) is used in place of thymine (T)
- A strand of RNA can be thought of as a string composed of the four letters: A, C, G, **U**

# The Genetic Code

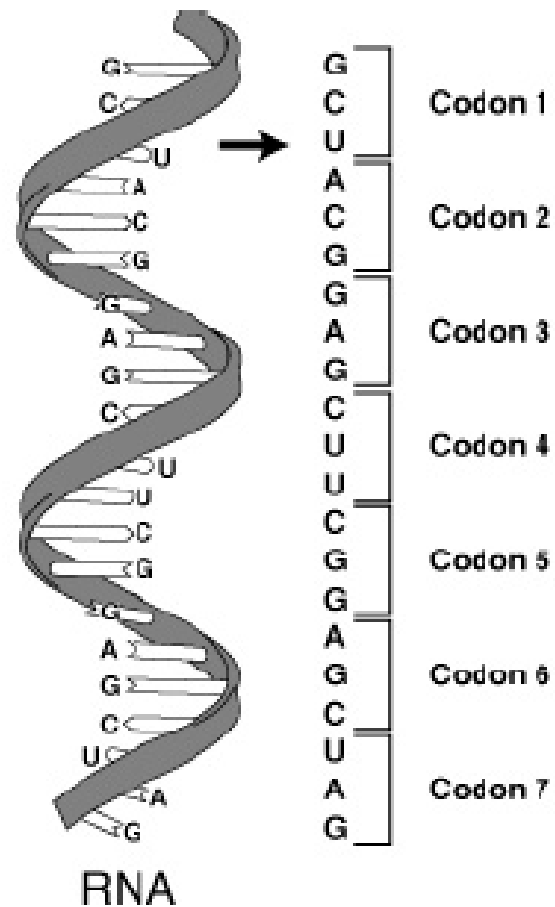
		Second letter				
		U	C	A	G	
First letter	U	UUU } Phe UUC } UUA } Leu UUG }	UCU } UCC } Ser UCA } UCG }	UAU } Tyr UAC } <b>UAA Stop</b> <b>UAG Stop</b>	UGU } Cys UGC } <b>UGA Stop</b> UGG } Trp	U C A G
	C	CUU } CUC } Leu CUA } CUG }	CCU } CCC } Pro CCA } CCG }	CAU } His CAC } CAA } Gln CAG }	CGU } CGC } Arg CGA } CGG }	U C A G
	A	AUU } AUC } Ile AUA } <b>AUG Met</b>	ACU } ACC } Thr ACA } ACG }	AAU } Asn AAC } AAA } Lys AAG }	AGU } Ser AGC } AGA } Arg AGG }	U C A G
	G	GUU } GUC } Val GUA } GUG }	GCU } GCC } Ala GCA } GCG }	GAU } Asp GAC } GAA } Glu GAG }	GGU } GGC } Gly GGA } GGG }	U C A G

64 combinations: 20 amino acids + stop codon

# Translation

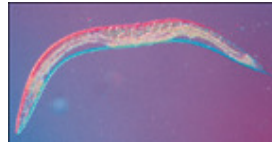
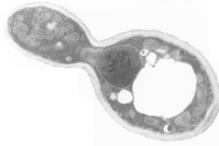
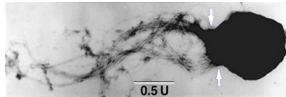
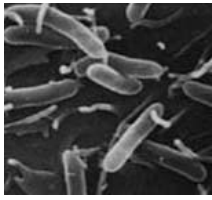
- *Ribosomes* are the machines that synthesize proteins from mRNA
- The grouping of codons is called the *reading frame*
- Translation begins with the *start codon*
- Translation ends with the *stop codon*

# Codons and Reading Frames



# Comparison of genome size

## Organisms

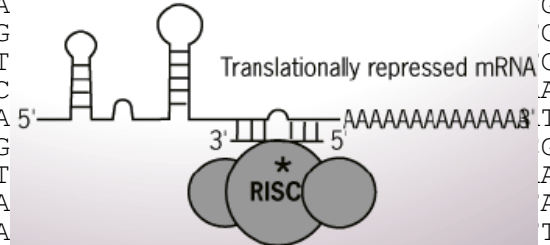
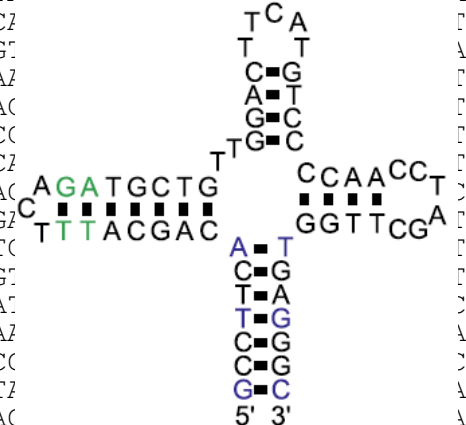
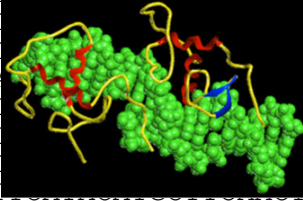


## Genomes

	<b>Haemophilus influenzae</b>	<b>Methanococcus jannaschii</b>	<b>Saccharomyces cerevisiae (baker's yeast)</b>	<b>Caenorhabditis elegans (nematode worm)</b>	<b>Drosophila Melanogaster (fruit fly)</b>	<b>Mus musculus (laboratory mouse)</b>	<b>Homo sapiens (man)</b>
<b>Genome (MB)</b>	<b>1.83</b>	<b>1.66</b>	<b>13</b>	<b>97</b>	<b>180</b>	<b>3200</b>	<b>3500</b>
<b>Number of genes</b>	<b>1709</b>	<b>1682</b>	<b>6241</b>	<b>18,424</b>	<b>13,500</b>	<b>~30,000</b>	<b>~30,000</b>



AGATTTCGATTATCCTTATAGTTCATACATGCATGCTTCAACTACTTAATAAAATGATTGTATGATAATGTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATA  
 CATGCATGCTTCAATGTATGATAAATGTTTTCAATGTAAGAGATTTCGATTATCCTTATAGTTCATACATGCATGCTTCAACTACTTAATAAAATGATTGTATGATAATG  
 TTTTCAATG**TAAGAGATTTTC**GATT  
 TTAATAAATGATTGTATGATAAAT  
 ATGCATGCTTCAACTACTTAATA  
 ATGTAAGAGATTTTCGATTATCCT  
 GTTCA**TACATGCATGCTT**CAACT  
 AATGTTTTCAATGTAAGAGATTT  
 CTTATAGTTCATACATGCATAGT  
 GCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCTAGTTCATAC  
 GTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATACATGCCTT**CAATGTAAGAGATTTTC**GATTATC  
 CAACTACTTAATAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATAC  
 GATTATCCTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAG  
 CTACTTAATAAATG**CAGATGCTGTTGGACTTTCATGTC**CCCAACCTAGCTTGGTGCACAGCATTATTGTAAG  
 AGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATC  
 GATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCAATGTAAGAGATTTTCGATTATCCTTATAG  
 GTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATACATGTATTGAATTTCAA  
 ATAATCATATTACATGGCATTACCACCATATACATATCCATATCTAATCTTAC**TATA**TGTTGTGGAAATGTA  
 TTGGAACTTTTCAAGTAATACGCTTAACTGCTCATTGCTATATTGAAGTACGGATTAGAAGCCGCCGAGCGGGC  
 TCGCTTTCACCGGTCGCGTTCTCTGAAACGCAGATGTGCCTCGCGCCGCACTGCTCCGAACAATAAAGATTCT  
 GGCAGTAACCTGGCCCAACAACTTCAAATTAACGAATCAAATTAACAACCATAGGATGATAATGCGGATTAC  
 AGCGATGATTTTTGATCTATTAACAGATATATAAATGGAAAAGTGCATAAACCACTTTAACAATACTTTCAACATTTTTCAGTTTGTATTACTTCTTATCAAATGTCA  
 TAAAAGTATCAACAAAAAATTGTTAATATACCTCTATACTTTAACGTCAAGGAGAAAAACTATA**ATGACTAAATCTCATT**CAGAAGAAGT**GATTGTACTCTGAGTTCA**  
**TTCTAGCGCAAAGGAATTACCAAGACCATTGGCCGAAAAGTGCCCGAGCATAATTAAGAAATTTATAAGCGCTTATGATGCTAAACCGGATTTTGTGCTAGATCGCC**  
**GGTAGAGTCAATCTAATTGGTGAACATATTGATTATTGTGACTTCTCGGTTTTACCTTTAGCTATTGATTTTGATATGCTTTGCGCCGTCAAAGTTTTGAACGATGAGA**  
**TTTCAAGTCTTAAAGCTATATCAGAGGGCTAAGCATGTGTATTCTGAATCTTTAAGAGTCTTGAAGGCTGTGAAATTAATGACTACAGCGAGCTTTACTGCCGACGAAG**  
**ACTTTTTCAAGCAATTTGGTGCCTTGATGAACGAGTCTCATT**CAGTTGGTACGATAAACTTTACGAATGTTCTTGTCAGAGATTGACAAAATTTGTTCCATTGCTTT  
 GTCAAAATGGATCATATGGTTCCCGTTTGACCCGGAGCTGGCTGGGGTGGTTGTAAGTACTGTTCACTTGGTTCCAGGGGGCCCAATGGCAACATAGAAAAGGTAAAAGAAGCC  
 CTTGCCAATGAGTCTTACAAGGTCAAGTACCCTAAGATCACTGATGCTGAGCTAGAAAATGCTATCATCGTCTCTAAACCAGCATTTGGGCAGTGTCTATATGAATTAG  
 TCAAGTATACTCTTTTTTACTTTGTTTTCAGAACAACTTCTCATTTTTTTCTACTCATAACTTTAGCATCACAAAATACGCAATAATAACAGGAGTAGTAACTTTTAT  
 AGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCACAACTTTAAAACACAGGGACAAAATCTTGATA  
 TGCTTTCAACCGCTGCGTTTTGGATACCTATTCTTGACATGATATGACTACCATTTGTTATTGTACGTGGGGCAGTTGACGTCTTATCATATGTCAAAGAAAATTTGC  
 GAAGTCTTGGCAAGTTGCCAACTGACGAGATGCAGTAACACTTTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAG  
 ATTTTCGATTATCCACAACTTTAAAACACAGGGACAAAATCTTGATATGCTTTCAACCGCTGCGTTTTGGATACCTATTCTTGACATGATATGACTACCATTTTGTTA  
 TTGTACGTGGGGCAGTTGACGTCTTATCATATGTCAAAGTCATTTGCGAAGTCTTGGCAAGTTGCCAACTGACGAGATGCAGTTTCTTACGCATAATAAGAATAGGAG  
 GGAATATGCAG**GAGAACGCCAGACAATCTATCATTACATTTAAGCGGCTCTTCAAAAAGATTGAACTCTCGCCAACCTTATGGAATCTTCCAATGAGACCTTTGCGCCA**  
**ATAATGTGGATTTGGAAAAGAGTATAAGTCATCTCAGAGTAAATAACTACCGAAGTTTATGAGGCATCGAGCTTTGAAGAAAAGTAAAGCTCAGAAAAACCTCAAT**  
**CAGCTCATTCTGGAAGAATAGTGTCTTGTACAACAGGACTTGAAGCCGTCGAAAAAGAAAGCGGGTTGGGATTTGGGTACGGTTTCGTTGGTCTTTGTTGT**  
**TTTGGCCTCTAGAGTTGGATCTGCTTATCATTGTCAACAGGACTTGAAGCCGTCGAAAAAGAAAGCGGGTTGGGATTTGGGTACGGTTTCGTTGGTCTTTGTTGT**  
**GCCATCGTTTTGGTATAGTGTCCAAGCTTATATTGTCGGCAACTCCCGTATCATTAATGCTGAAATCTATCTTTGGAAAAGATTTACAATGATTGTACGTGGGGCAGTTGA**  
 CGTCTTATCATATGTCAAAGTCATTTGCGAAGTCTTGGCAAGTTGCCAACTGACGAGATGCAGTAACACTTTTATA  
 TTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCACAACTTTAAACACAGGGACAAAATCTTGATATG  
 TGACATGATAT**GACTACCAT**TTTTGTTATTGTTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGAT  
 TTATAGTTCATACATGCTTCAACTACTTAATA**TGCAGTGTAT**GATAAATGTTTTCAATGTAAGAGATTTTCGATTATC  
 GATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATACATGCTTCAACTACTTAATAAA  
 GTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGATTTACTTAATAAAATGATTG  
 TTATCCTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGATTTACTTAATAAAATGATTG  
 AGATTTTCGATTATCCTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATC  
 AGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCA**ATAAAAA**GTAAAGAGATTTTCGATTAT  
 ACATGATATGACTACCATTTTGTATTGTTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATGATTG  
 TATGATAAATGTTTTCAATGTAAGAGATTTTCGATTATCCTTATAGTTCATACATGCTTCAACTACTTAATAAAATGATTGTATGATAAATGTTTTGTATGATTATATCG



# Readout from the genome

