

# Computational Genomics

<http://www.cs.cmu.edu/~02710>

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# Topics

- Introduction (1 Week)
- Sequence analysis(4 weeks)
- Gene expression (3 weeks)
- RNA and epigenetics (3 weeks)
- Systems biology (3 weeks)

# Class overview

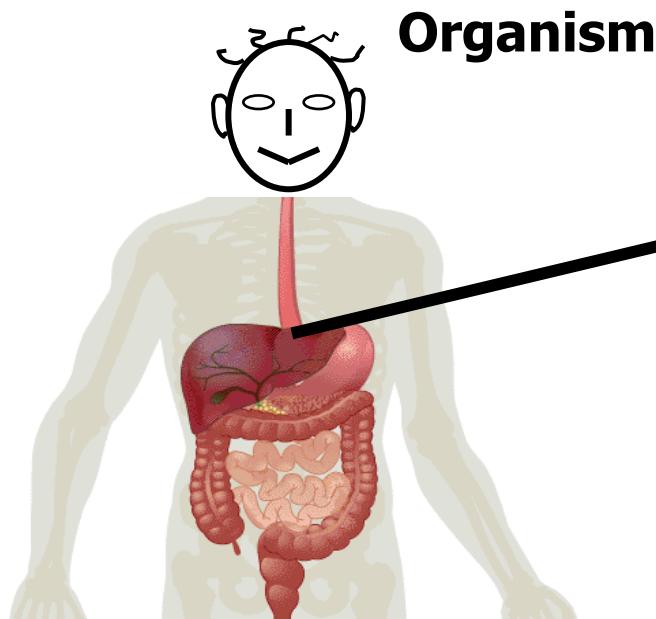
- 4 problem sets
- Midterm
- Project (and poster)
- Class attendance and participation

# Class grades

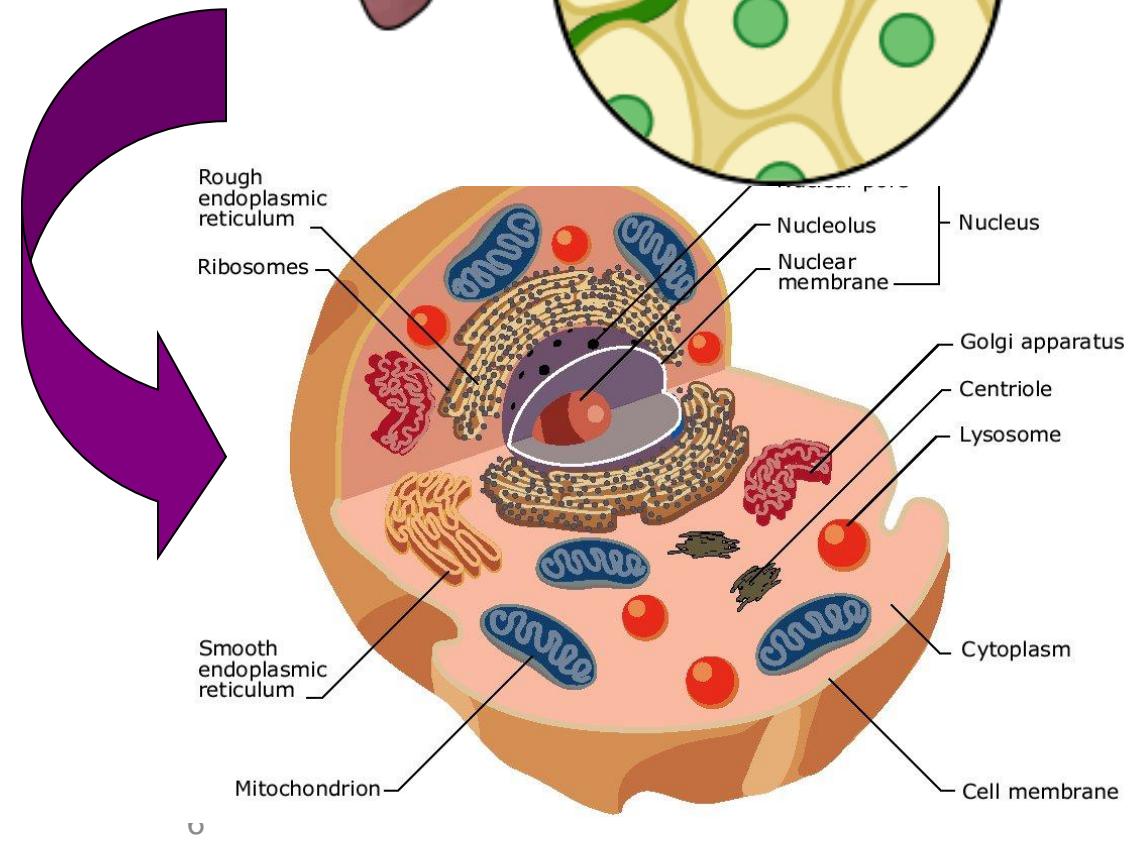
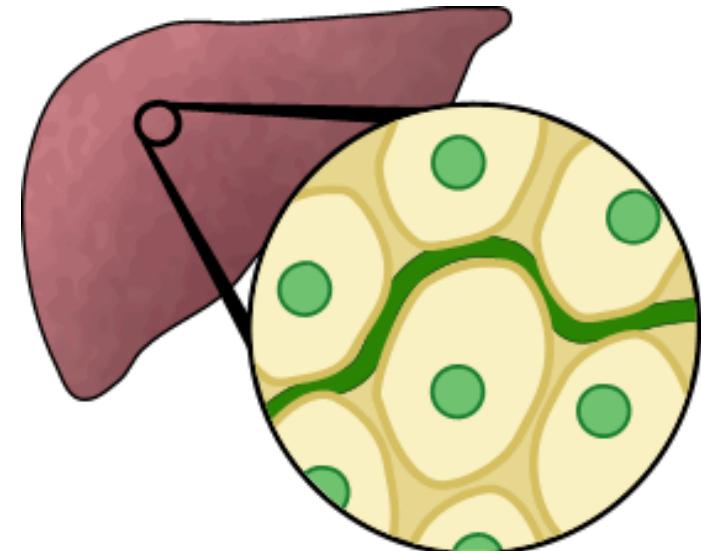
- Problem sets (40%)
- Midterm (30%)
- Project (25%)
- Class participation (5%)

High level and brief intro to molecular  
biology and genomics

# Organism, Organ, Cell



Organ



# Types of Cells

- Eukaryots:
  - Plants, animals, humans
  - DNA resides in the nucleus
  - Contain also other compartments
- Prokaryots:
  - Bacteria
  - Do not contain compartments

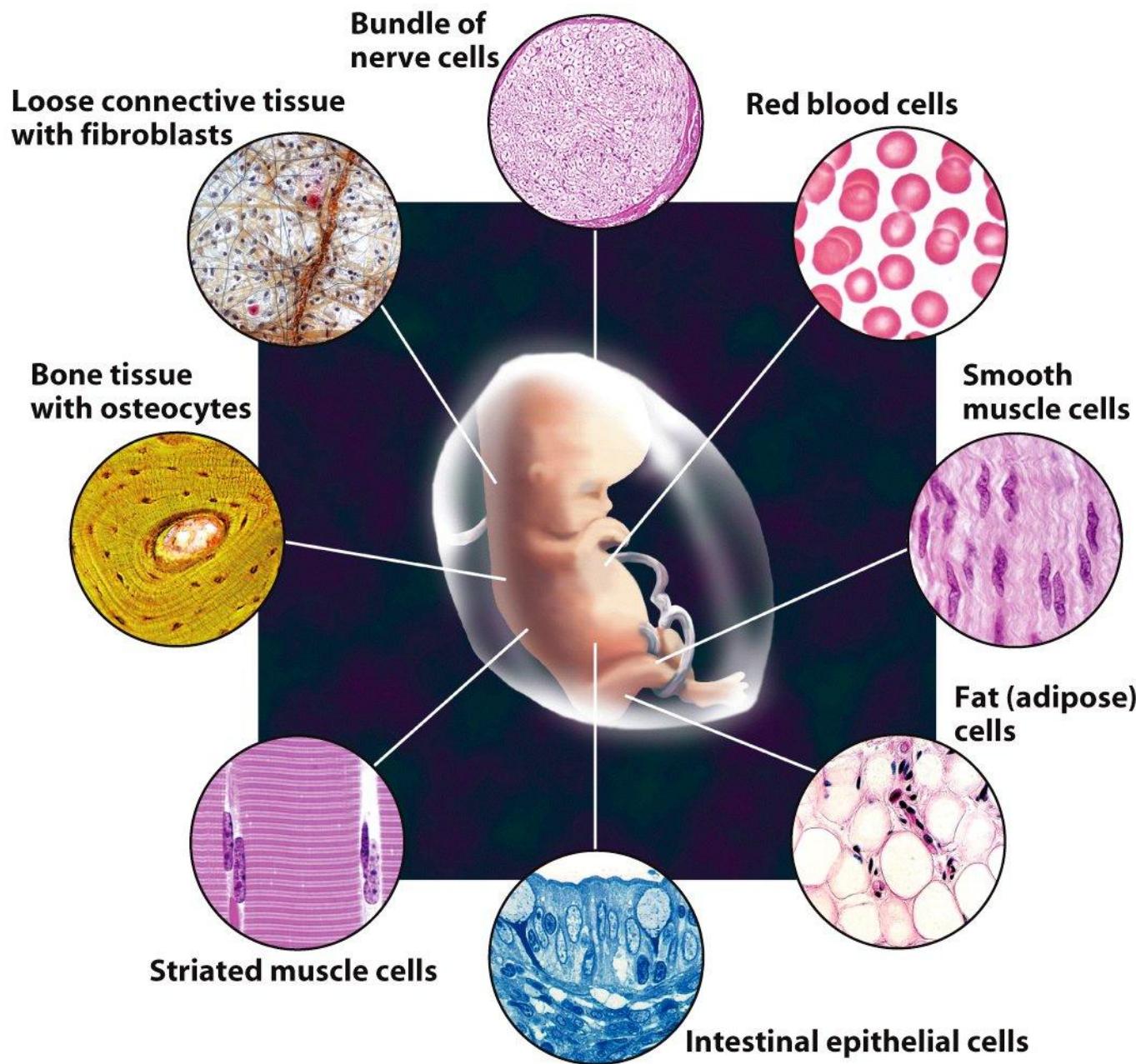


Figure 1-17 Cell and Molecular Biology, 4/e (© 2005 John Wiley & Sons)

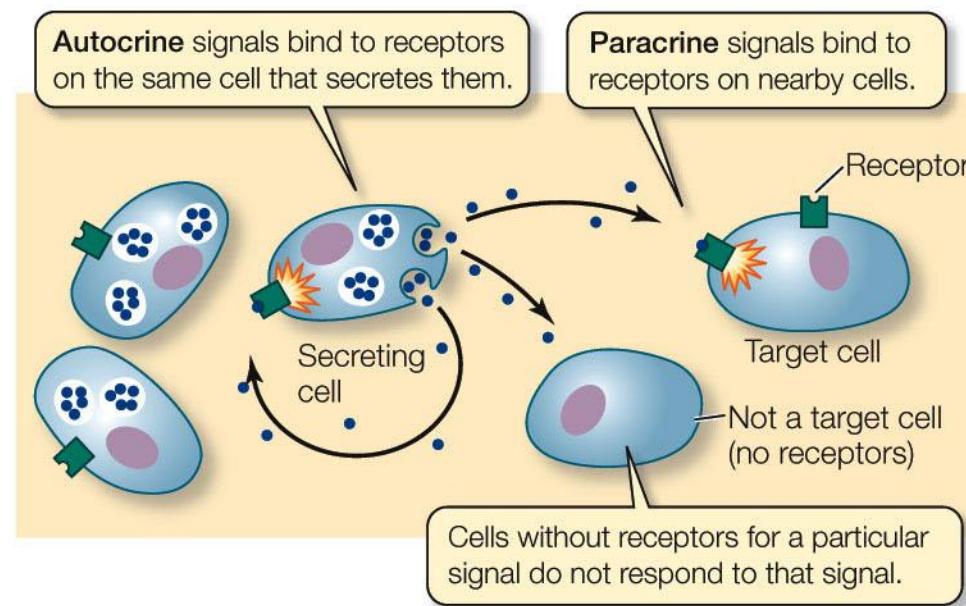
# Cell signaling

- Cells communication is based on chemical *signals* & *receptors*
  - If you have the correct receptor, respond to signal; no receptor = no response
  - Single-celled organisms receive cues about the environment, status of other individuals
- Process termed the **signal transduction pathway**
  - From signal interacting with receptor to cellular response

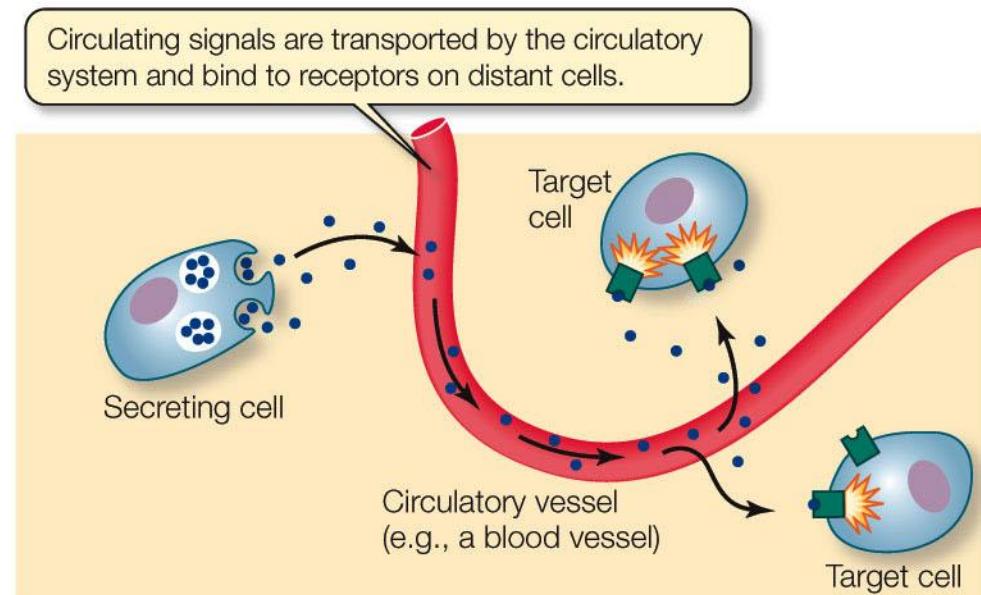
# Types of Signals

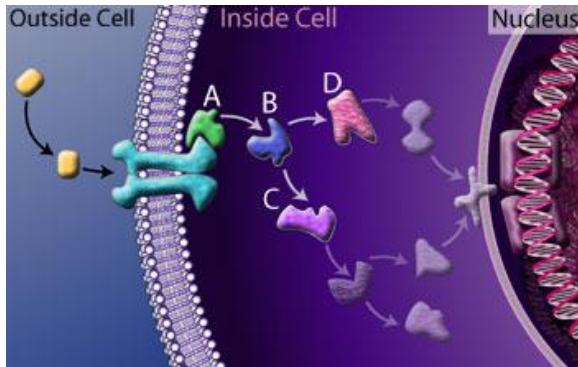
- Local signaling: short-distance
  - affect the cells that produce them
  - affect nearby cells (diffuse)
- Hormonal signaling: long-distance
  - Typically found in multicellular organisms & use circulatory system for distribution

(A)



(B)

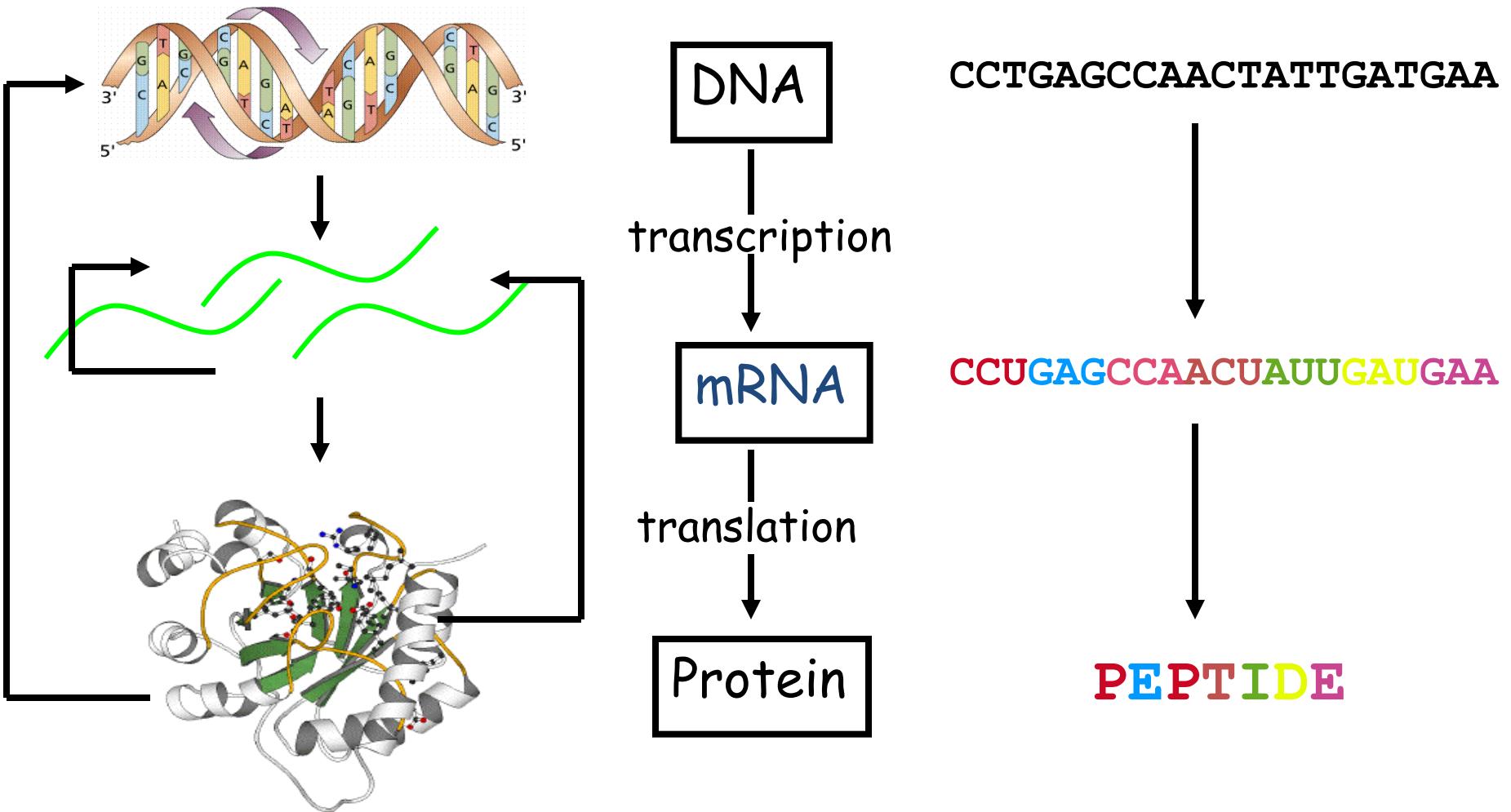




# Cell Signaling Stages

- 1. Reception:** signal molecule interacts with receptor
- 2. Transduction** typically several steps that involve changes to **responder** molecules and downstream targets
- 3. Outcome:** often triggers a cellular response (*effect*)

# Central dogma



# Genome

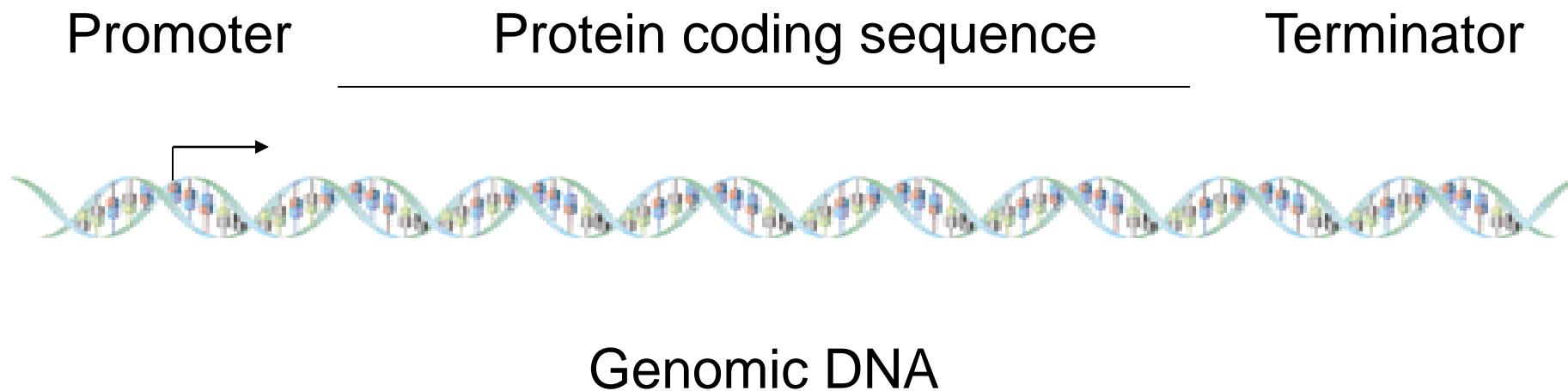
- A genome is an organism's complete set of DNA (including its genes).
- In humans, less than 3% of the genome actually encodes for genes.
- However, a much larger % of the genome is transcribed (miRNAs, lincRNAs, ...)
- And a large part of the rest of the genome serves as a control regions.

# Comparison of Different Organisms

	Genome size	Num. of genes
E. coli	.05*10 <sup>8</sup>	4,200
Yeast	.15*10 <sup>8</sup>	6,000
Worm	1*10 <sup>8</sup>	18,400
Fly	1.8*10 <sup>8</sup>	13,600
Human	30*10 <sup>8</sup>	25,000
Plant	1.3*10 <sup>8</sup>	25,000

# Genes

# What is a gene?



# Example of a Gene: Gal4 DNA

ATGAAGCTACTGTCTTCTATCGAACAAAGCATGCGATATTGCCGACTAAAAAGCTCAAG  
TGCTCCAAAGAAAAACCGAACGTGCGCCAAGTGTCTGAAGAACAACTGGGAGTGTGCTAC  
TCTCCCAAAACCAAAAGGTCTCCGCTGACTAGGGCACATCTGACAGAAGTGGAATCAAGG  
CTAGAAAGACTGGAACAGCTATTCTACTGATTTCTCGAGAACGACCTGACATGATT  
TTGAAAATGGATTCTTACAGGATATAAAAGCATTGTTAACAGGATTATTGTACAAGAT  
AATGTGAATAAAGATGCCGTACAGATAGATTGGCTTCAGTGGAGACTGATATGCCTCTA  
ACATTGAGACAGCATAGAATAAGTGCACATCATCATCGGAAGAGAGTAGAACAAAGGT  
CAAAGACAGTTGACTGTATCGATTGACTCGGCAGCTCATCATGATAACTCCACAATTCCG  
TTGGATTTATGCCAGGGATGCTCTCATGGATTGATTGGTCTGAAGAGGGATGACATG  
TCGGATGGCTTGCCTCTGAAAACGGACCCAAACAATAATGGTTCTTGGCGACGGT  
TCTCTTTATGTATTCTCGATCTTGGCTTAAACCGGAAAATTACACGAACCTAAC  
GTTAACAGGCTCCGACCATGATTACGGATAGATAACGTTGGCTCTAGATCCACAACA  
TCCCGTTACTTCAAAGTTATCTAATAATTTCACCCCTACTGCCCTATCGTCACTCA  
CCGACGCTAATGATGTTGTATAATAACCAGATTGAAATCGCGTCAAGGGATCAATGGCAA  
ATCCTTTAACTGCATATTGCCATTGGAGCCTGGTGTAGAGGGGGAACTACTGAT  
ATAGATGTTTTACTATCAAAATGCTAAATCTCATTGACGAGCAAGGTCTCGAGTCA

# Genes Encode for Proteins

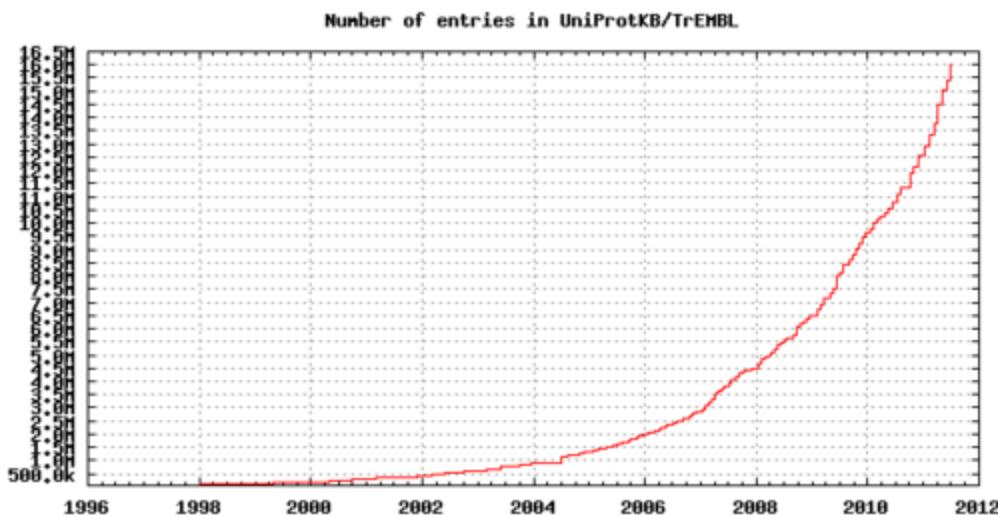
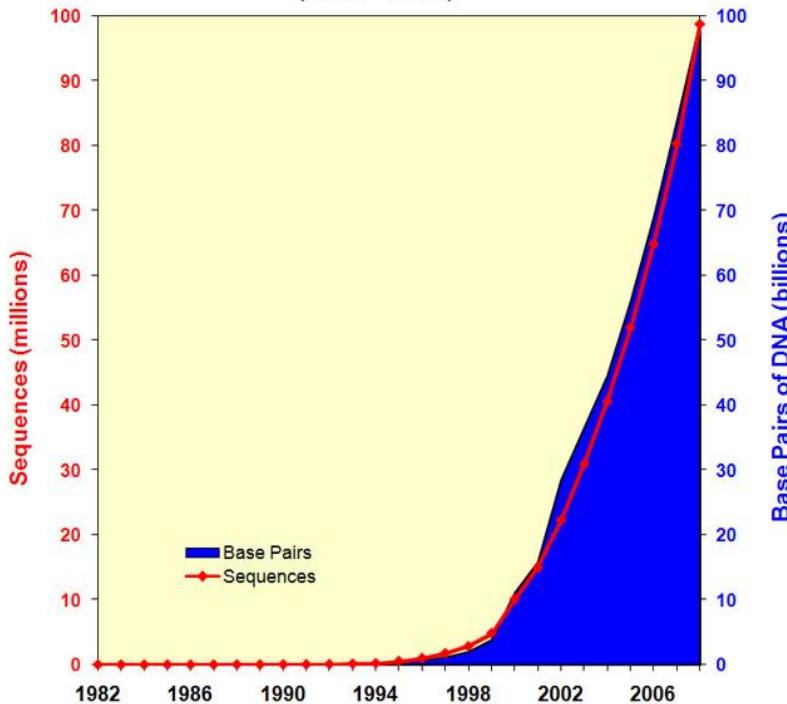
		Second Letter									
		U		C		A		G			
1st letter	U	UUU	Phe	UCU	Ser	UAU	Tyr	UGU	Cys	U	
	UUC	UUC		UCC		UAC		UGC		C	
	UUA	UUA	Leu	UCA		UAA	Stop	UGA	Stop	A	
	UUG	UUG		UCG		UAG	Stop	UGG	Trp	G	
letter	C	CUU		CCU	Pro	CAU	His	CGU		U	3rd letter
	CUC	CUC	Leu	CCC		CAC		CGC		C	
	CUA	CUA		CCA		CAA	Gln	CGA	Arg	A	
	CUG	CUG		CCG		CAG		CGG		G	
letter	A	AUU		ACU	Thr	AAU	Asn	AGU	Ser	U	letter
	AUC	AUC	Ile	ACC		AAC		AGC		C	
	AUA	AUA		ACA		AAA	Lys	AGA	Arg	A	
	AUG	AUG	Met	ACG		AAG		AGG		G	
G	G	GUU		GCU	Ala	GAU	Asp	GGU		U	
	GUC	GUC	Val	GCC		GAC		GGC		C	
	GUA	GUA		GCA		GAA	Glu	GGA	Gly	A	
	GUG	GUG		GCG		GAG		GGG		G	

# Example of a Gene: Gal4 AA

MKLLSSIEQACDICRLKKLKCSKEPKCAKCLKNNWECRYSPTKRSPLTRAHLTEVESR  
LERLEQLFLIFPREDLDMILKMDSLQDIKALLTGLVQDNVNKDAVTDRLASVETDMPL  
TLRQHRISATSSSEESSNKGQRQLTVSIDSAAHHDNSTIPLDFMPRDALHGFDWSEEDDM  
SDGLPFLKTDPPNNNGFFGDGSLLCILRSIGFKPENYTNSNVNRLPTMITDRYTLASRSTT  
SRLLQSYLNNFHPYCPIVHSPTLMMIYNNQIEIASKDQWQILFNCILAIGAWCIEGESTD  
IDVFYYQNAKSHLTSKFESGSIIVTALHLLSRYTQWRQKTNTSYNFHSFSIRMAISLG  
LNRDLPSSFSDSSILEQRRRIWWSVYSWEIQLSLLYGRSIQLSQNTISFPSSVDDVQRTT  
TGPTIYHGIETARLLQVFTKIYELDKTVTAEKSPICAKKCLMICNEIEEVSRQAPKFLQ  
MDISTTALTNLLKEHPWLSFTRFELKWQLSIIYVLRDFFTNTQKKSQLEQDQNDHQ  
YEVKRCSIMLSAAQRTVMSVSSYMDNHNVTYFAWNCSYYLFNAVLVPIKTLNSNSKS  
AENNETAQLLQQINTVLMLLKKLATFKIQTCEKYIQVLEEVCAFLLSQCAIPLPHISYN  
NSNGSAIKNIVGSATIAQYPTLPEENVNNISVKYVSPGSVGSPVPLKSGASFSDLVKLL  
SNRPPSRNSPVTIPRSTPSHRSVTPFLGQQQLQSLVPLTPSALFGGANFNQSGNIADSS

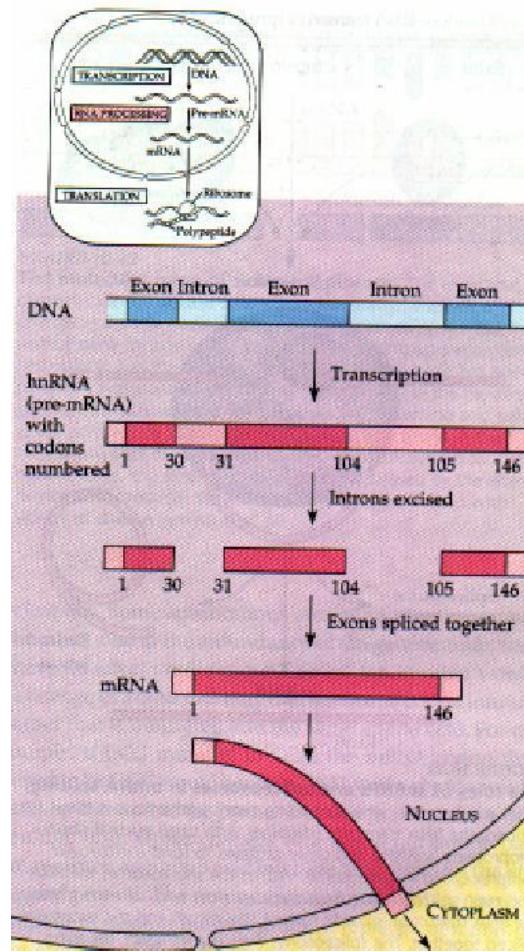
# Number of Genes in Public Databases

**Growth of GenBank**  
(1982 - 2008)



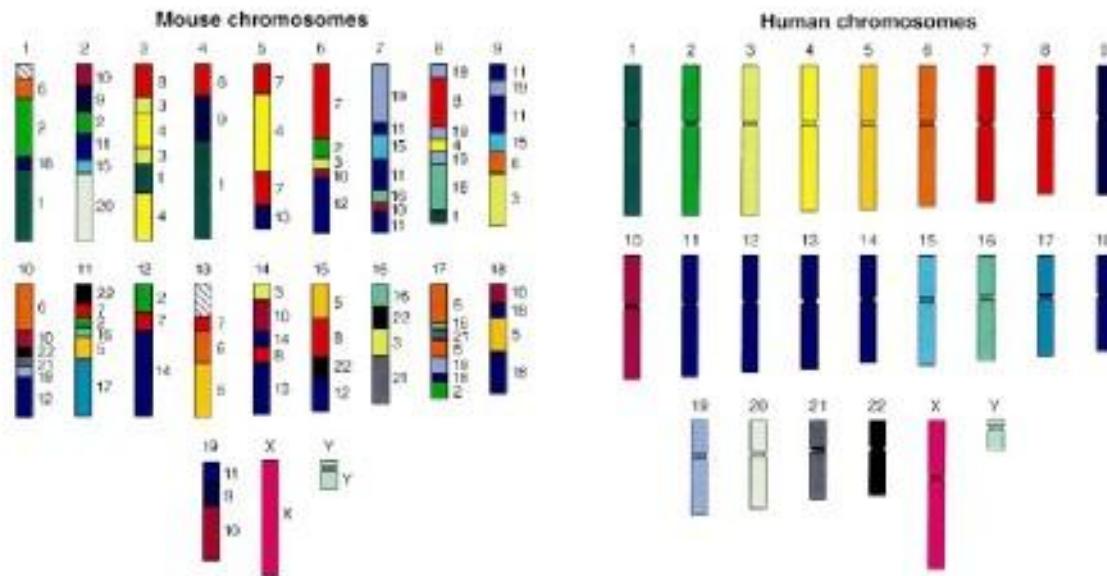
# Structure of Genes in Mammalian Cells

- Within coding DNA genes there can be un-translated regions (Introns)
- Exons are segments of DNA that contain the gene's information coding for a protein
- Need to cut Introns out of RNA and splice together Exons before protein can be made
- Alternative splicing increases the potential number of different proteins, allowing the generation of millions of proteins from a small number of genes.

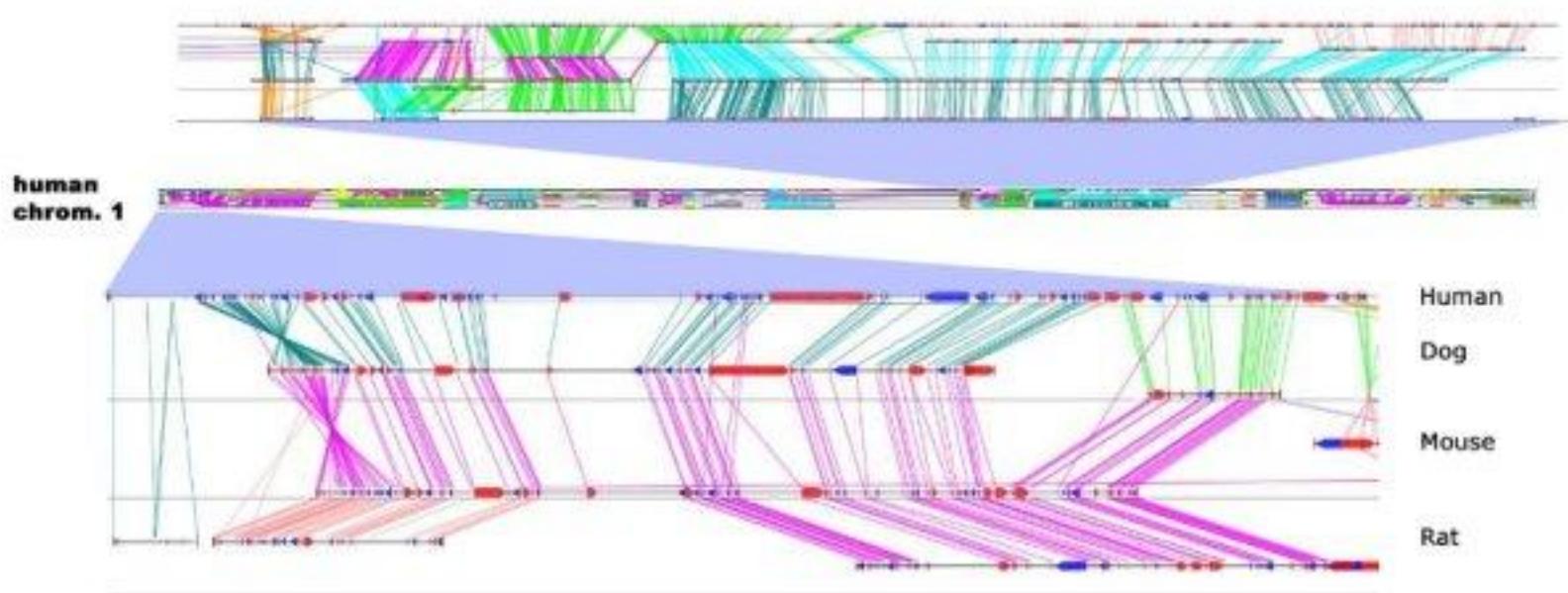


# Comparative genomics

## Mouse and Human Genetic Similarities



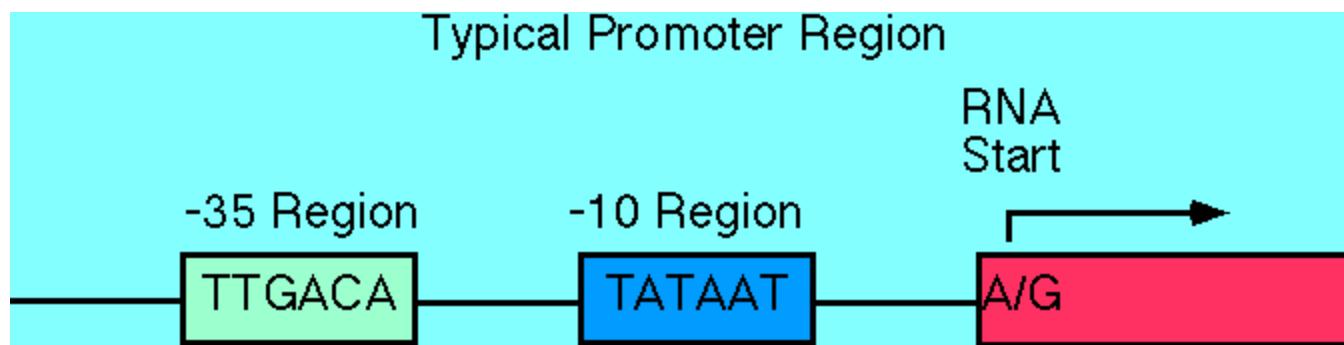
Courtesy Lisa Stubbs  
Oak Ridge National Laboratory



# Regulatory Regions

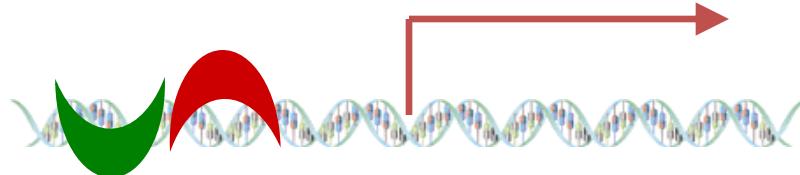
# Promoter

The promoter is the place where RNA polymerase binds to start transcription. This is what determines which strand is the coding strand.

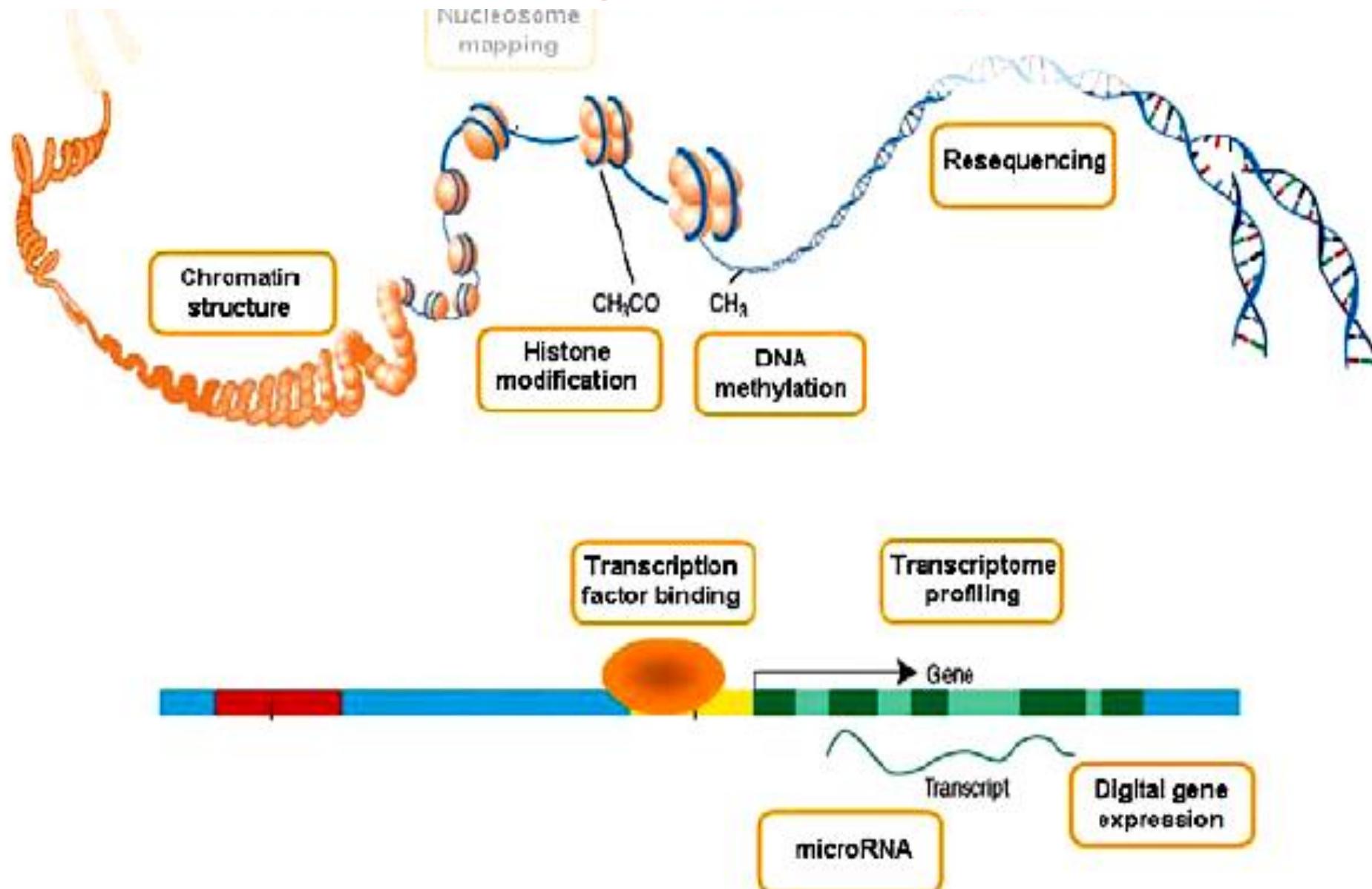


# DNA Binding Motifs

- In order to recruit the transcriptional machinery, a transcription factor (TF) needs to bind the DNA in front of the gene.
- TFs bind in to short segments which are known as DNA binding motifs.
- Usually consists 6 – 8 letters, and in many cases these letters generate palindromes.
- Note however that TF binding requires an open chromatin (a set of proteins that pack the DNA). Several factors are general chromatin modifiers. ‘Chicken and egg’ problem.



# Epigenetics



# Messenger RNAs (mRNAs)

# RNA

Four major types (one recently discovered regulatory RNA).

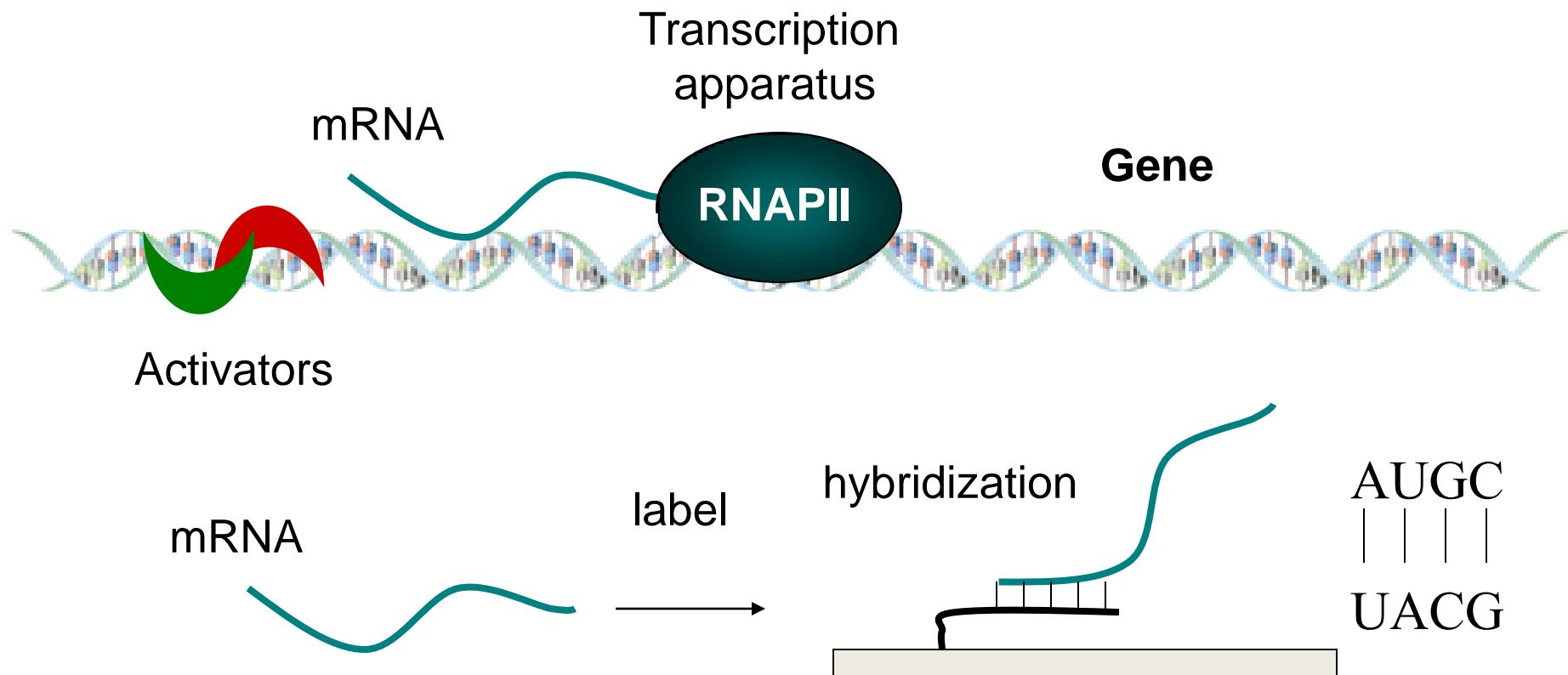
- mRNA – messenger RNA
- tRNA – Transfer RNA
- rRNA – ribosomal RNA
- shRNA, microRNA – RNA interference

# Messenger RNA

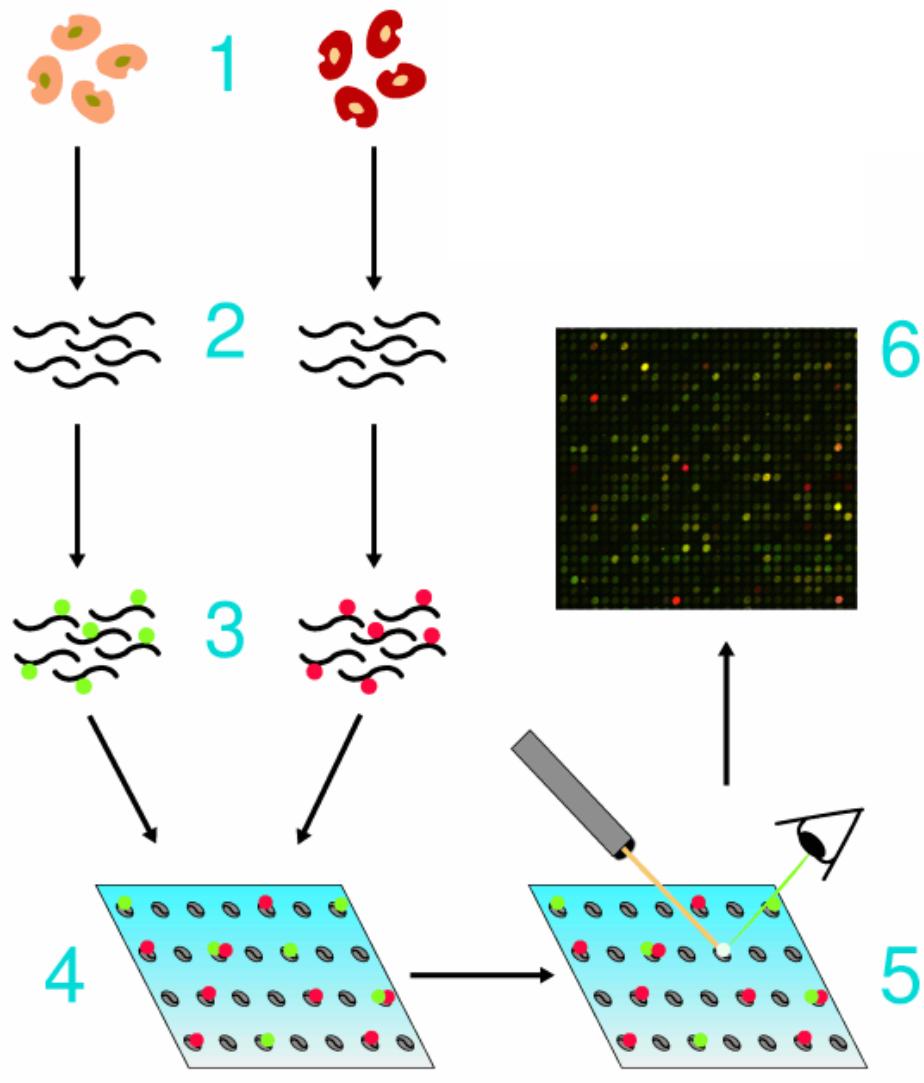
- Basically, an intermediate product
- Transcribed from the genome and translated into protein
- Number of copies correlates well with number of proteins for the gene.
- Unlike DNA, the amount of messenger RNA (as well as the number of proteins) differs between different cell types and under different conditions.

# Complementary base-pairing

- mRNA is transcribed from the DNA
- mRNA (like DNA, but unlike proteins) binds to its complement

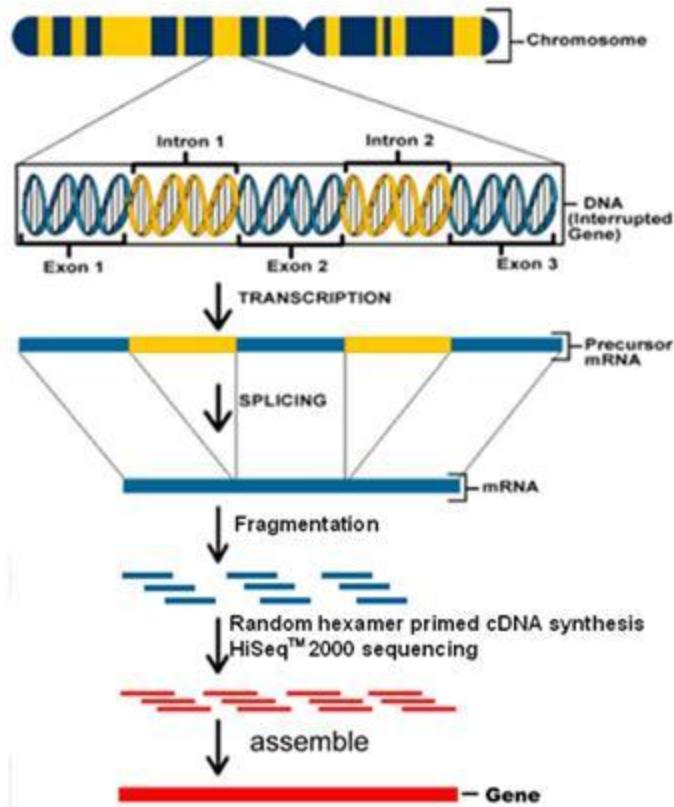


# Hybridization and Scanning— Microarrays



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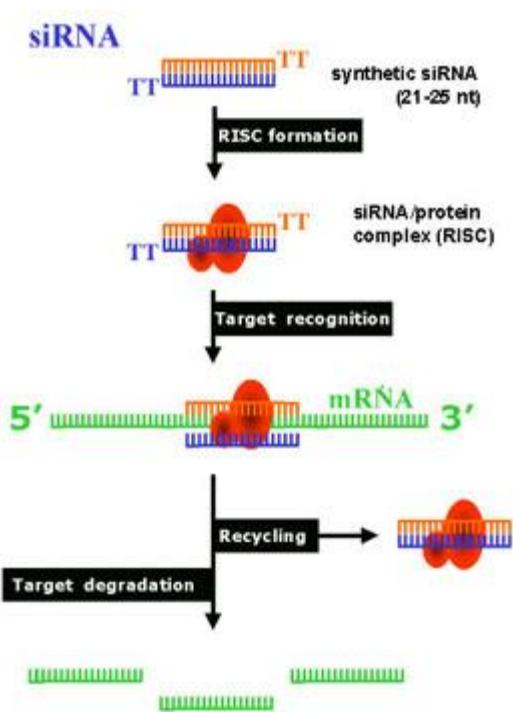
# RNASeq using next generation sequencing methods



# Perturbation

- In many cases we would like to perturb the systems to study the impacts of individual components (genes).
- This can be done in the sequence level by removing (knocking out) the gene of interest.
- Not always possible:
  - higher organisms
  - genes that are required during development but not later
  - genes that are required in certain cell types but not in others

# Perturbations: RNAi

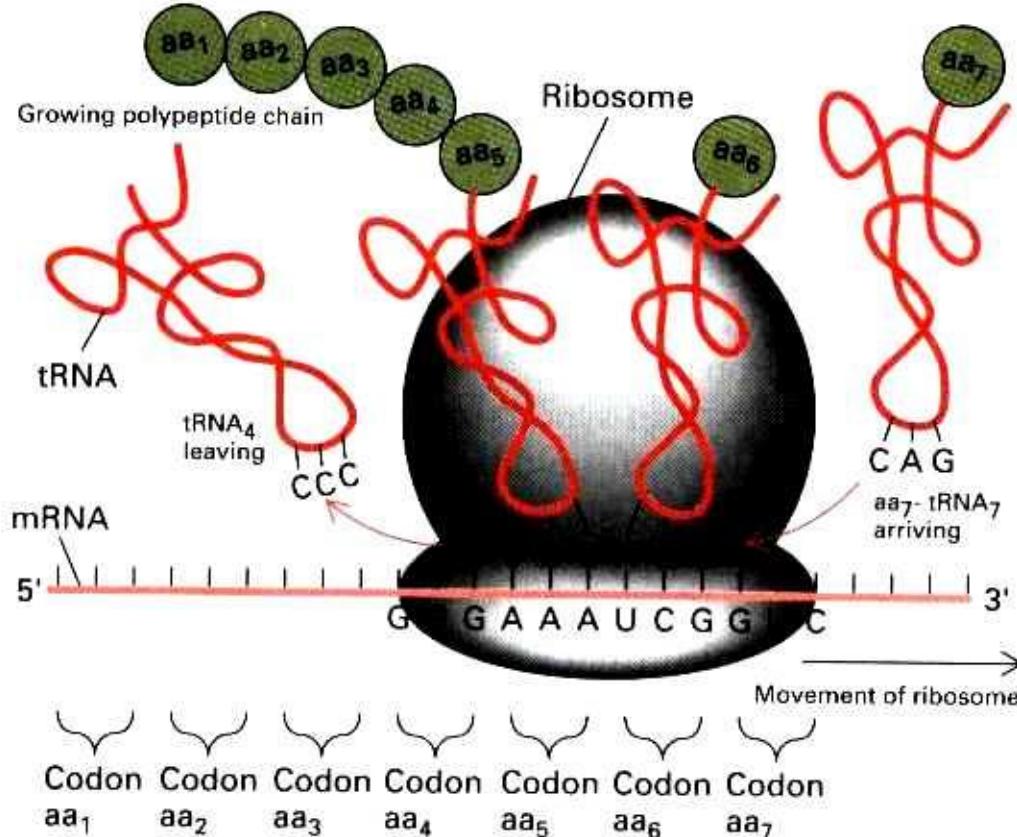


# Proteins

# From RNA to proteins: The Ribosome

- Decoding machine.
- Input: mRNA, output: protein
- Built from a large number of proteins and a number of RNAs.
- Several ribosomes can work on one mRNA

# The Ribosome



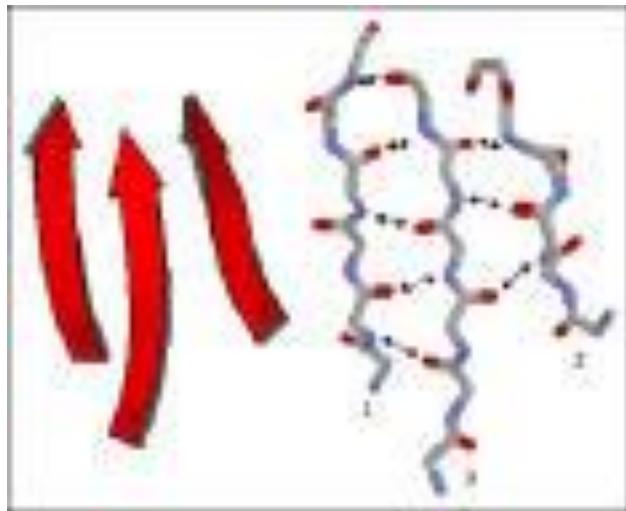
# Proteins

- Proteins are polypeptide chains of amino acids.
- Four levels of structure:
  - Primary Structure: The sequence of the protein
  - Secondary structure: Local structure in regions of the chain
  - Tertiary Structure: Three dimensional structure
  - Quaternary Structure: multiple subunits

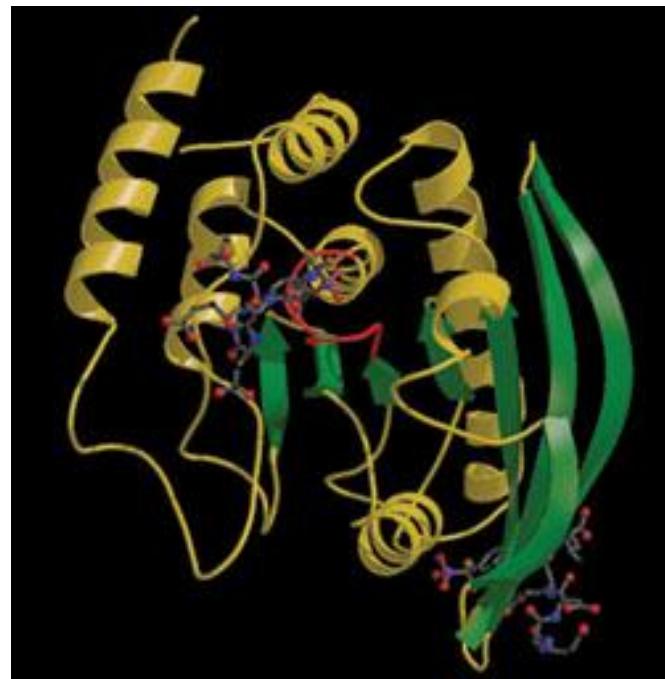
# Secondary Structure: Alpha Helix



# Secondary Structure: Beta Sheet



# Protein Structure



# Domains of a Protein

- While predicting the structure from the sequence is still an open problem, we can identify several domains within the protein.
- Domains are compactly folded structures.
- In many cases these domains are associated with specific biological function.

# Protein Interaction

In order to fulfill their function, proteins interact with other proteins in a number of ways including:

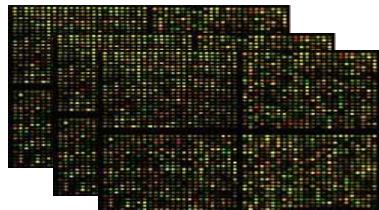
- Regulation
- Pathways, for example A -> B -> C
- Post translational modifications
- Forming protein complexes

Putting it all together: Systems biology

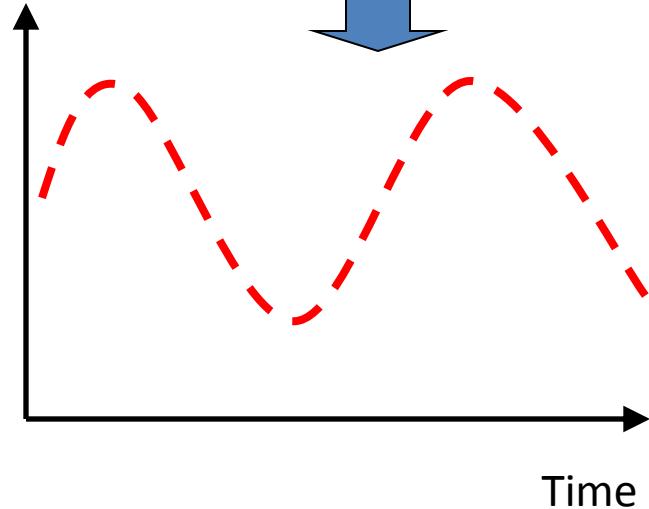
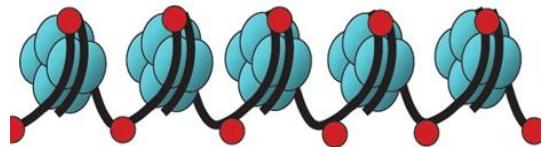
# High throughput data

## Time-series measurements

gene expression



epigenetics



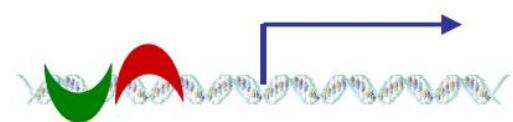
sequence



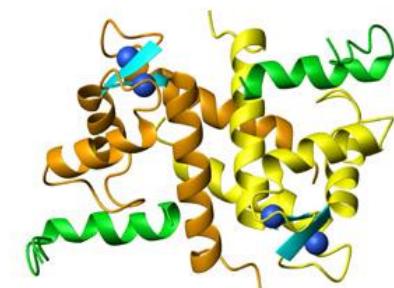
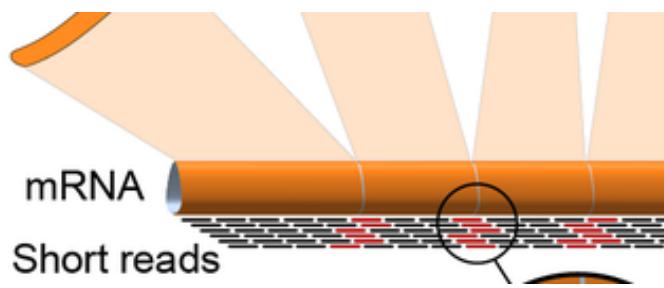
motif



CHIP-Seq



PPI



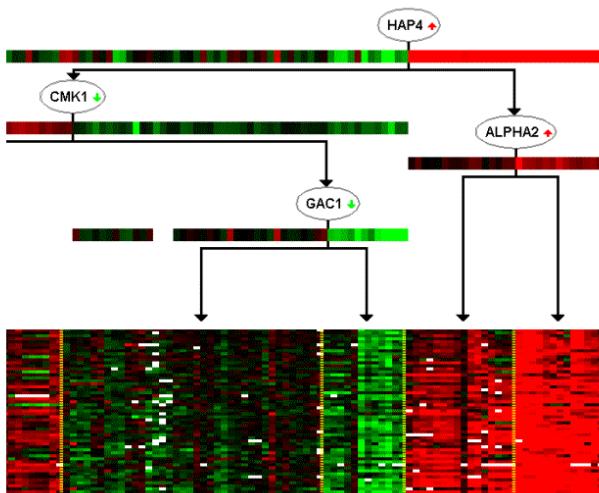
RNA-Seq

# High throughput data

- We now have many sources of data, each providing a different view on the activity in the cell
  - Sequence (genes)

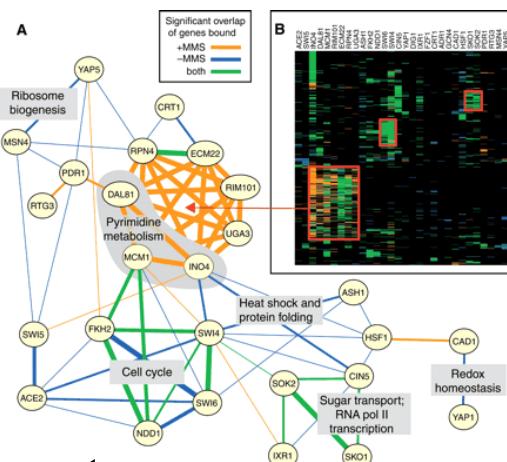
How to combine these different data types together to obtain a unified view of the activity in the cell is one of the major challenges of systems biology

# Reverse engineering of regulatory networks



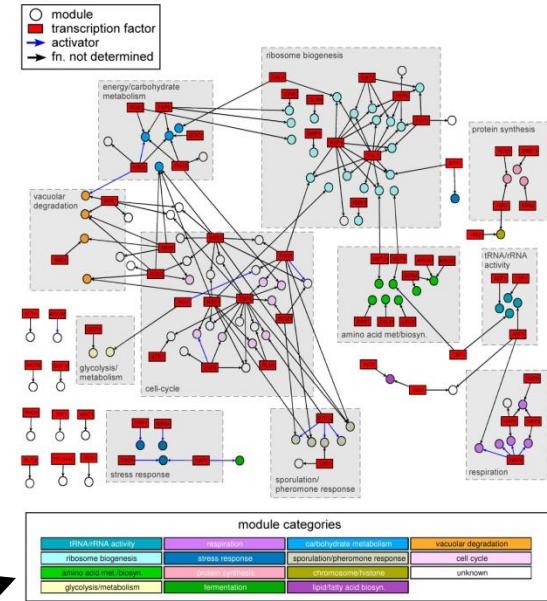
Segal et al *Nature Genetics* 2003

- Gene expression
- Protein-DNA and gene expression



Workman et al *Science* 2006

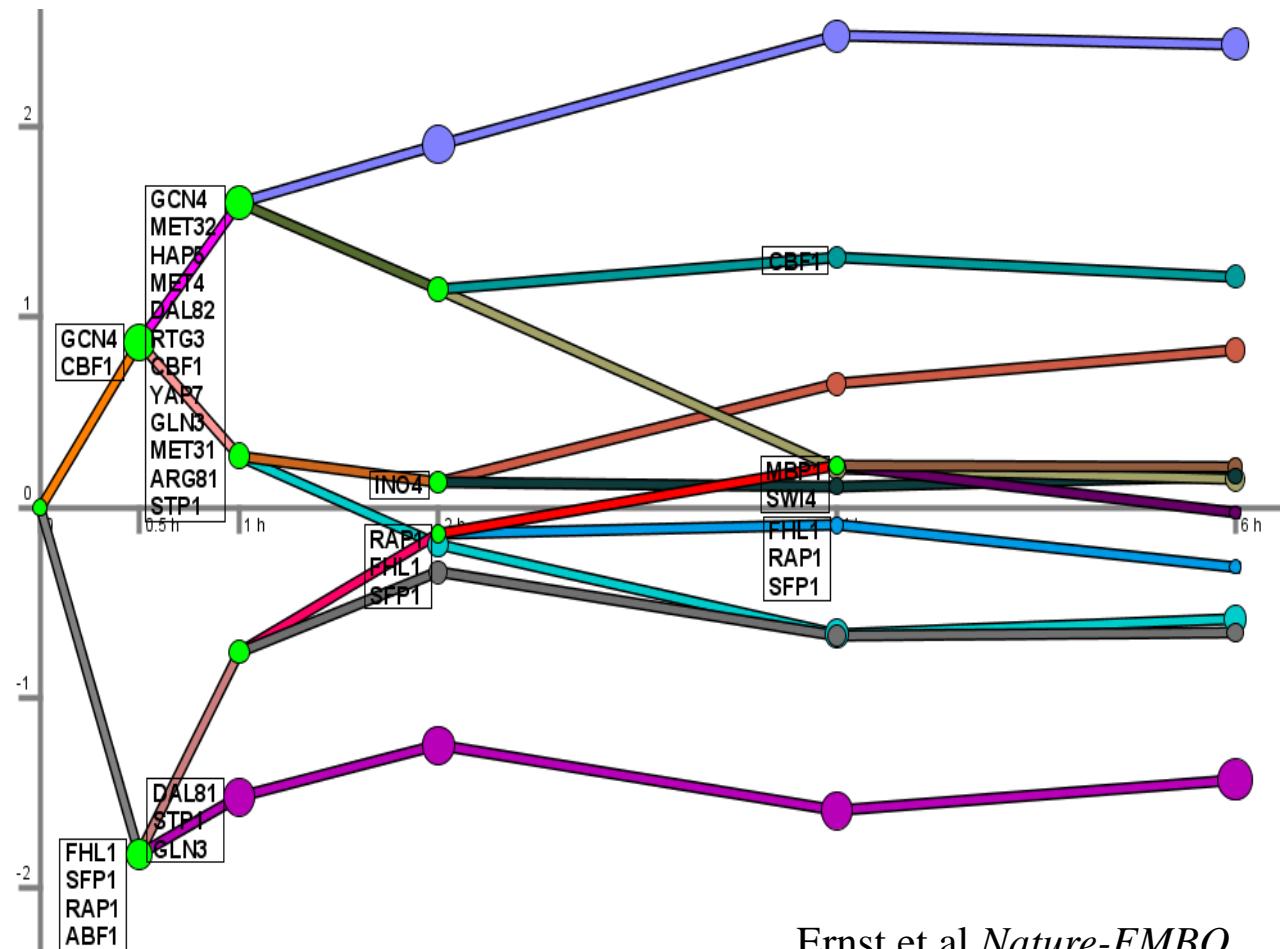
Figure 1: Rich media gene modules network



Bar-Joseph et al *Nature Biotechnology* 2003

# Dynamic regulatory networks

Protein-DNA, motif  
and time series gene  
expression data



Ernst et al *Nature-EMBO Mol. & Systems Bio.* 2007,  
PNAS 2013