

# Network algorithms for molecular biology



**Course organised by members of Inria European Team ERABLE**

**Physically located and also part of  
Laboratory of Biometry and Evolutionary Biology  
CNRS UMR 5558 / University Lyon 1**

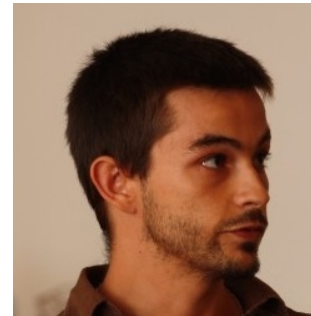
**And including researchers at  
University La Sapienza of Rome  
Universities of Florence and Pisa  
Center for Mathematics and Computer Science (CWI) Amsterdam  
Free University of Amsterdam**

## Organisation of the course – Who will be teaching

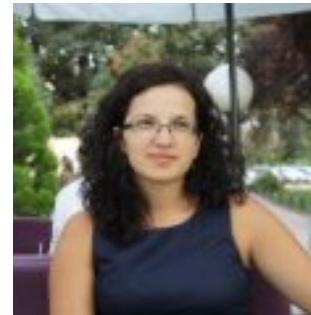
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**Myself – Marie-France Sagot, Director of Research Inria**

**Arnaud Mary, Associate Professor UCL**



**Blerina Sinimeri, Junior Researcher Inria**



**All three members of ERABLE**

# Organisation of the course – Program

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Before Christmas: 12 courses of 2 hours each, on Thursday mornings, 8-10am  
In January: Final evaluation (see next slide)

Schedule (in black: MFS; in red: AM; in blue: BS)

Sept 17	Presentation of the course and general introduction to biology
Sept 24	General overview of networks (graphs) in biology & associated algorithms
Oct 1	General introduction to enumeration algorithms
Oct 8	Enumeration + Motifs in networks
Oct 15	Motifs in networks
Oct 22	Cycles and <i>st</i> -paths in NGS-related graphs
Nov 5	Cycles and <i>st</i> -paths in NGS-related graphs
Nov 12	Phylogenetic networks
Nov 19	Co-phylogenetic networks
Nov 26	Metabolic networks and precursor sets (as a prelude to species interactions)
Dec 3	Metabolic networks and precursor sets (as a prelude to species interactions)
Dec 17	Metabolic stories

## Organisation of the course – Evaluation

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Two types of evaluation – **May be adapted depending on how many attend!**

### Continuous

Will consist mainly in exercises to be done at home possibly accompanied by short presentations to be done in class

### Final

Report + presentation of a paper with open problem(s) and attempts to address such

or

Report + presentation of an algorithmic project developed on a topic related to those given in the course

In both cases, choice should be discussed with us and made before December 1<sup>st</sup>



## Master research training period

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In case of an interest in doing the Master research training in computational biology

Apart from our own Inria research group that can greet Master students

There are other groups in Lyon, France or abroad who might interest you

In the first case, talk to us

In the second case, we can give you suggestions of appropriate groups, so talk also to us

Notice that in France, there is a rather large community of persons working in computational biology, including from a computer science perspective

There is even, since 2000, an annual conference called JOBIM

# Today

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## General introduction to biology

The idea is to give you just a very broad overview that will enable you to acquire the basic vocabulary and concepts



Next week, I'll get more in detail on the various uses of networks/graphs in biology before we focus on the algorithmics of some more specific cases

Some more biological concepts will be introduced later as needed

# Basics of molecular biology

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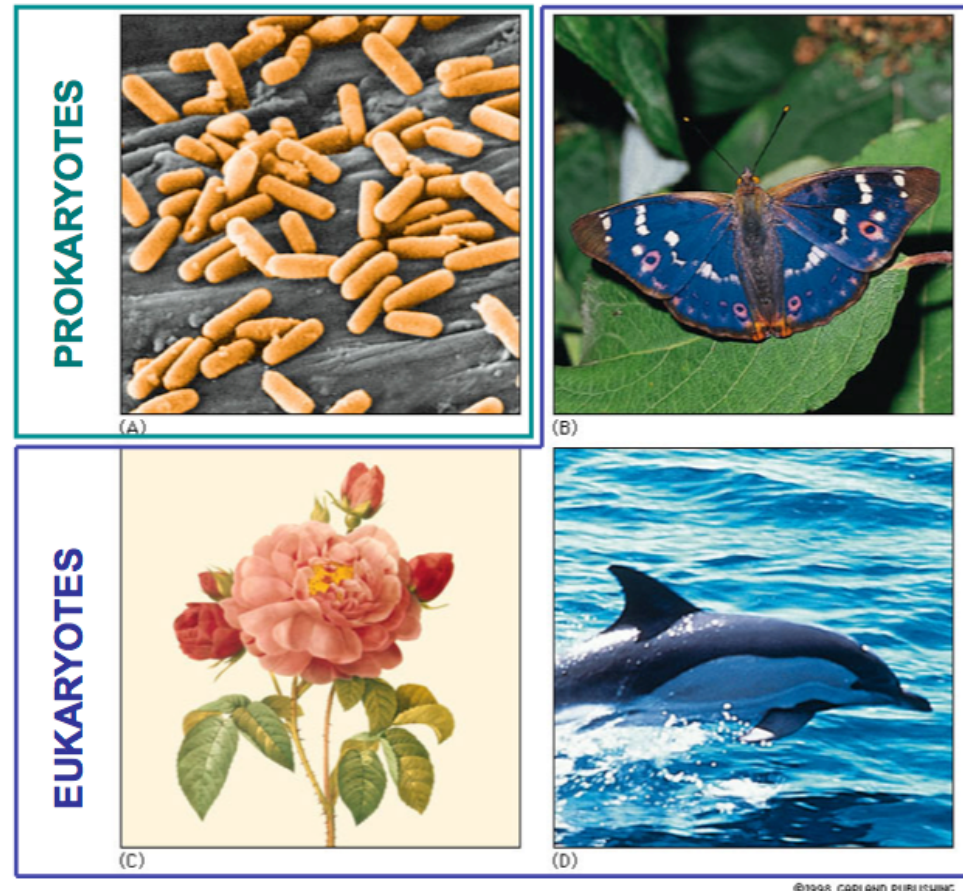


# The cell

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Cells are the fundamental working units of every living system  
Smallest structural unit of an organism capable of independent functioning

All organisms  
are made of 1  
or more cells



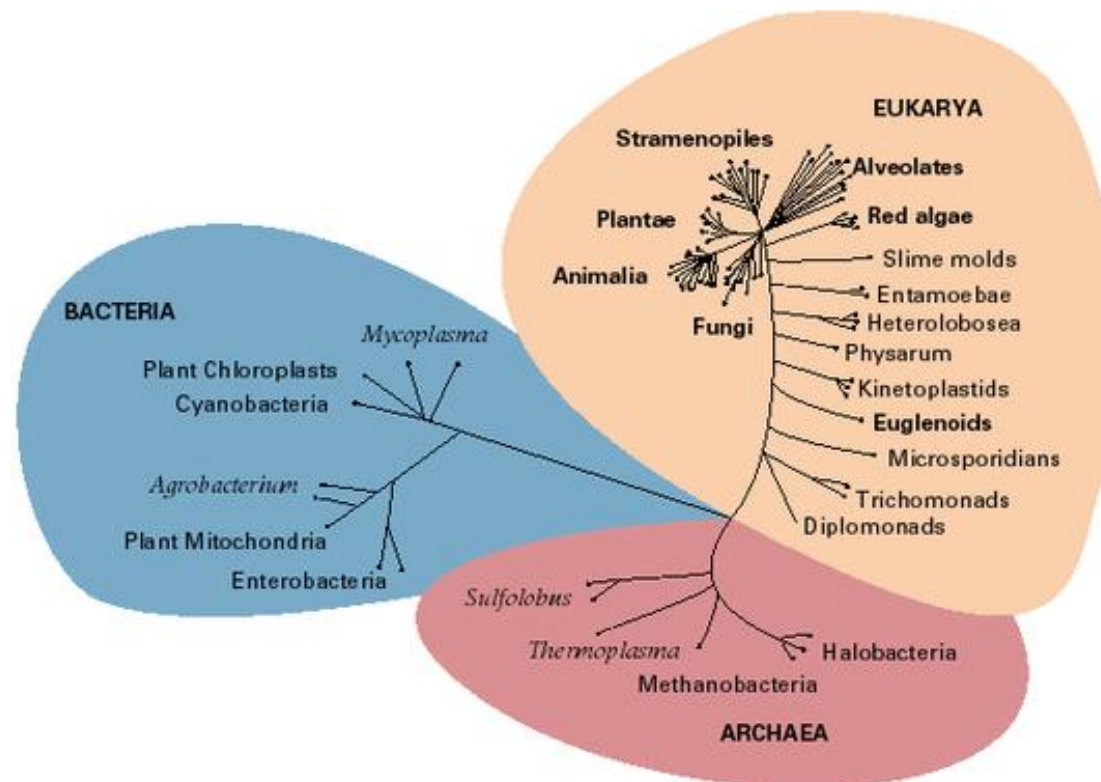
# Prokaryotes and eukaryotes

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According to most recent evidence, there are three main branches to the tree of life

Prokaryotes which include Archaea (“ancient ones”) and Bacteria

Eukaryotes (Eukarya) which include plants, animals, fungi, and certain algae



## Main differences

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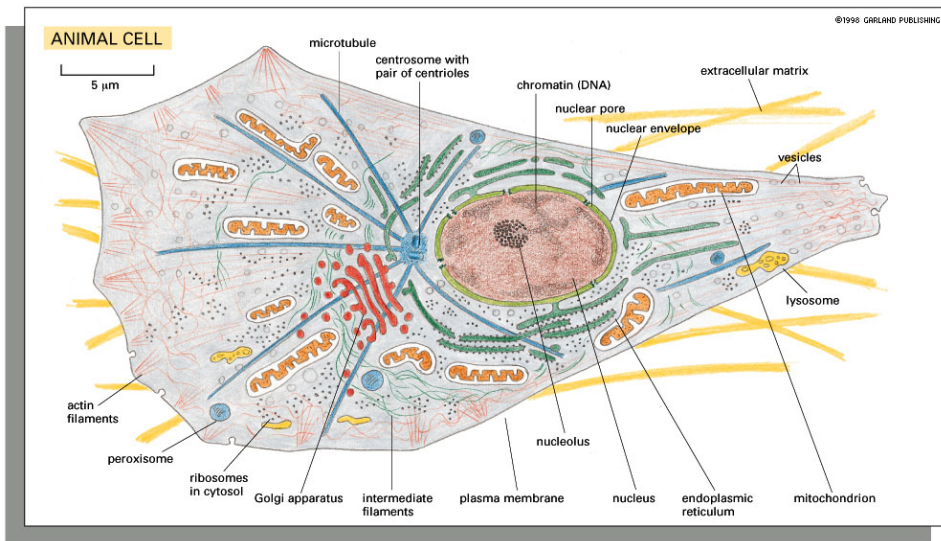
<b>Prokaryotes</b>	<b>Eukaryotes</b>
Single cell	Single or multi cell
No nucleus	Nucleus
One single piece of circular DNA = one single chromosome	Chromosomes
No organelles	Organelles

**Organelle = Specialised compartment with a specific function**

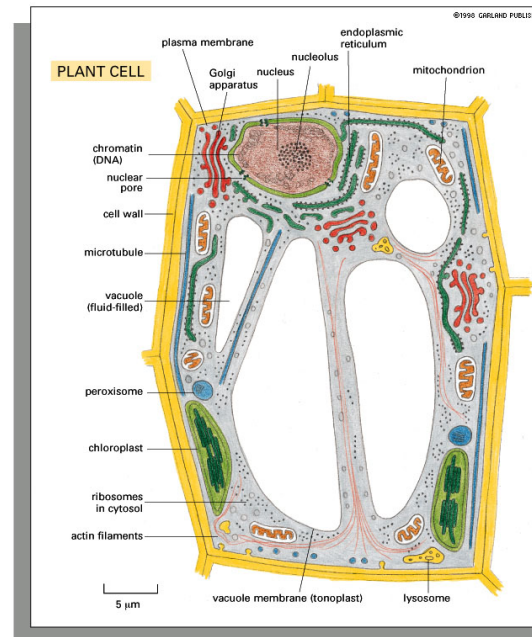


# Examples of cells

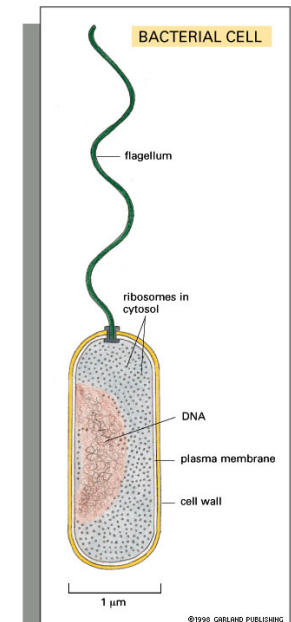
## Animal



## Plant



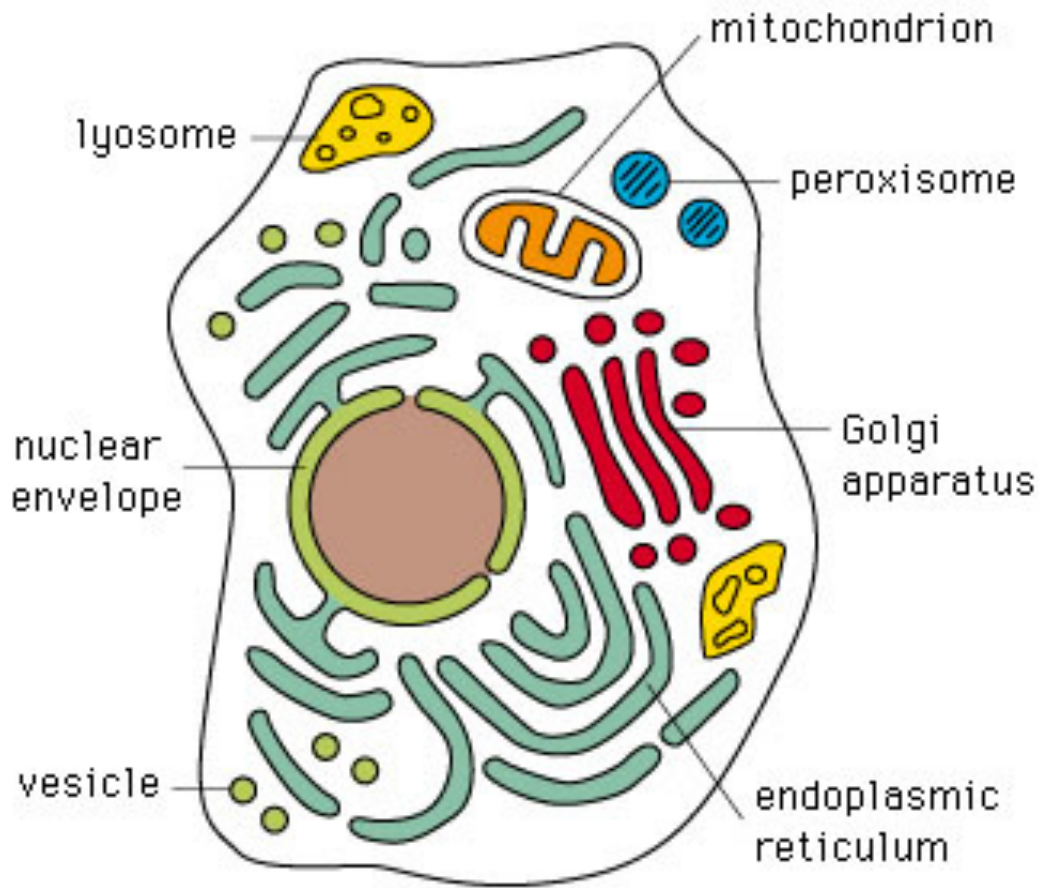
## Bacterium



# Compartmentation of the eukaryote cell:

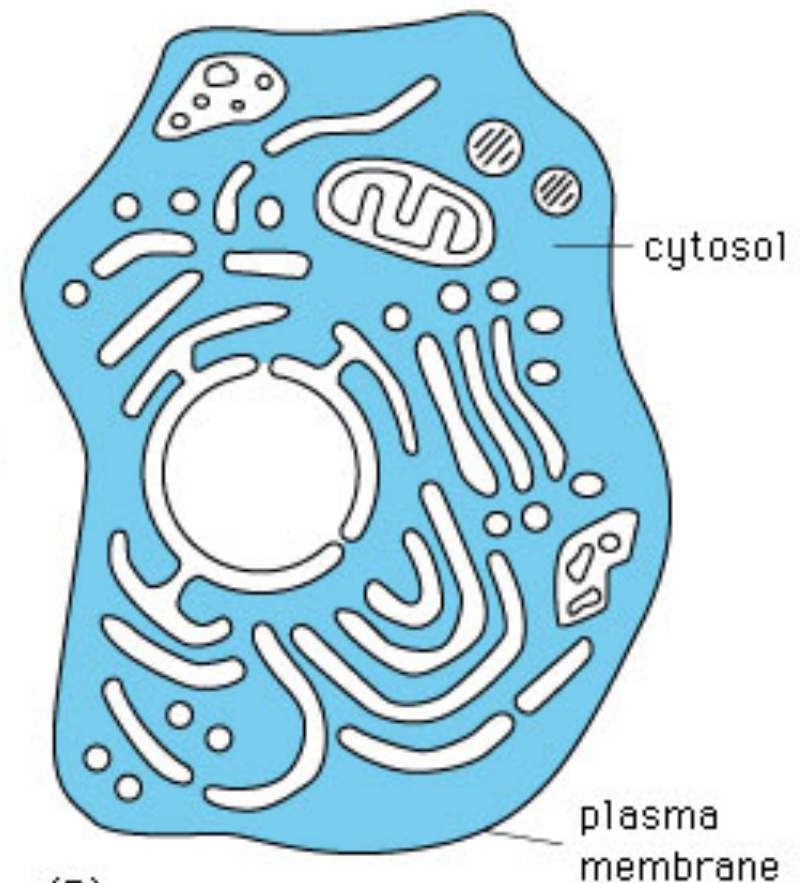
## Various organelles

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(A)

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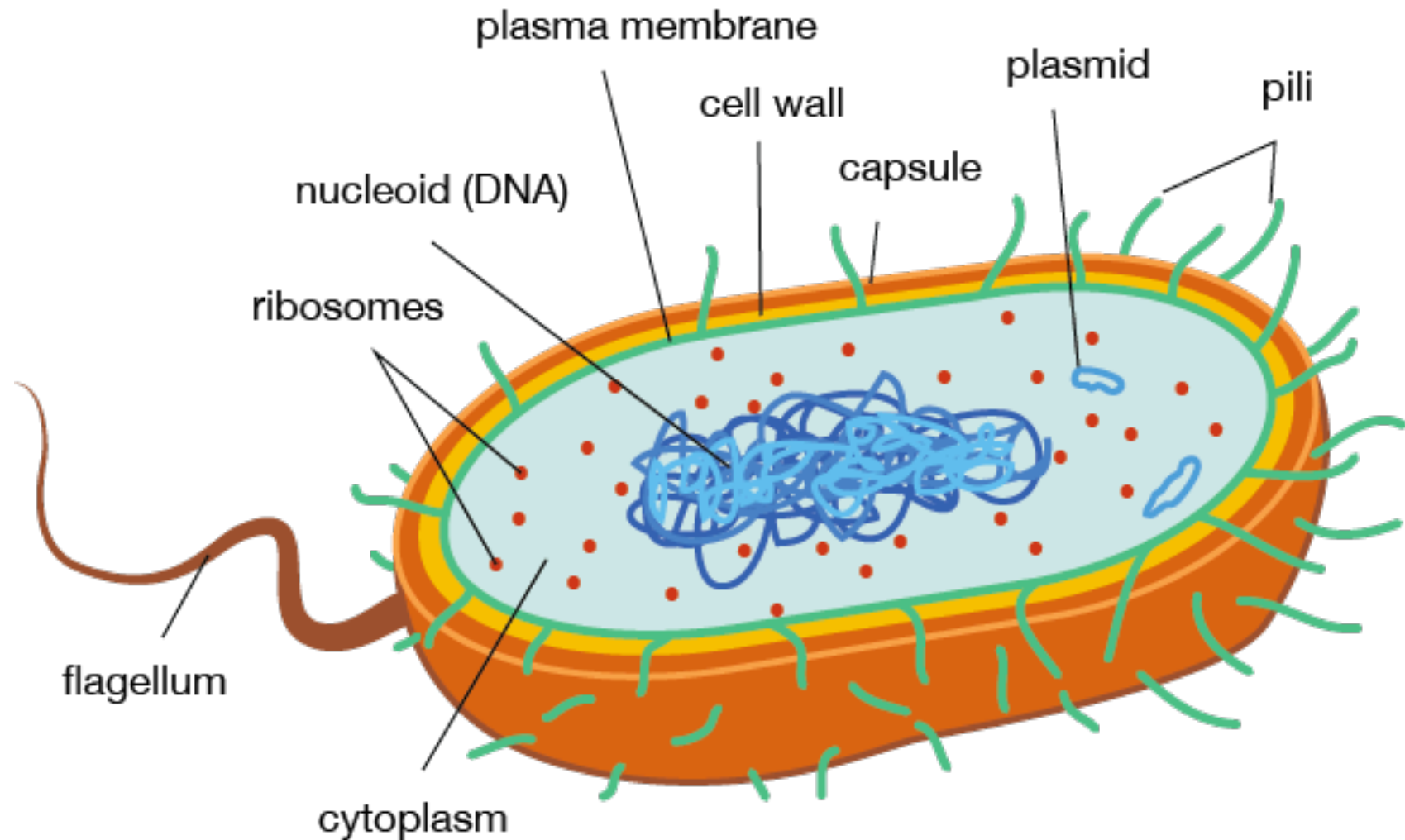
(B)

## Main functions of the different compartments just to show that they vary greatly

Nucleus	contains main genome DNA and RNA synthesis
Cytosol	contains many metabolic pathways protein synthesis
Endoplasmic reticulum (ER)	synthesis of most lipids synthesis of proteins for distribution to many organelles and plasma membrane
Golgi apparatus	modification, sorting, and packaging of proteins and lipids for either secretion or delivery to another organelle
Lysosomes	intracellular degradation
Endosomes	sorting of endocytosed material
Mitochondria	ATP synthesis by oxidative phosphorylation
Chloroplasts	ATP synthesis and carbon fixation by photosynthesis
Peroxisomes	oxidation of toxic molecules

Meanwhile in prokaryotic cells,  
the picture is much different

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# **In both cases: Main composition of a cell**

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**70% water**

**23% macromolecules**

**Proteins**

**Polysaccharides**

**Lipids**

**7% small molecules**

**Salts**

**Lipids**

**Amino acids**

**Nucleotides**

# Genetic information is stored in DNA – Deoxyribonucleic Acid

Consists of two biopolymer strands coiled around each other to form a double helix

The structure and the four genomic letters of the DNA code for all living organisms

The letters, called “nucleotides” or also “bases”, are:

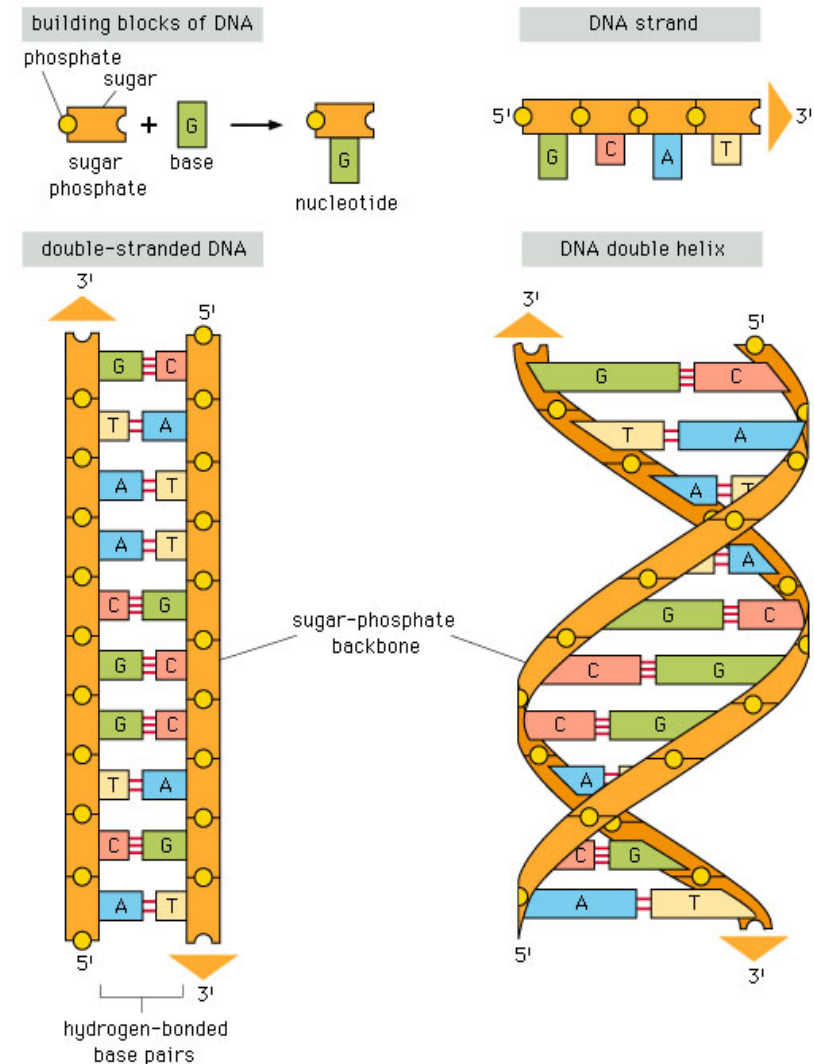
Adenine – A

Guanine – G

Thymine – T

Cytosine – C

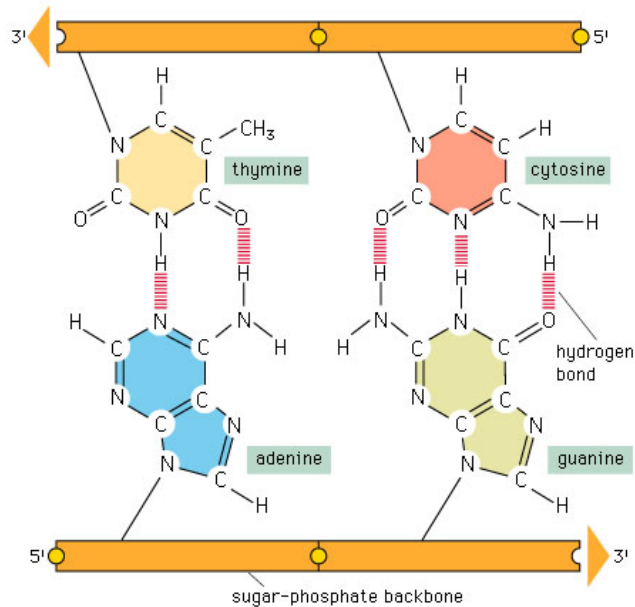
which pair A with T and C with G on the complementary strands



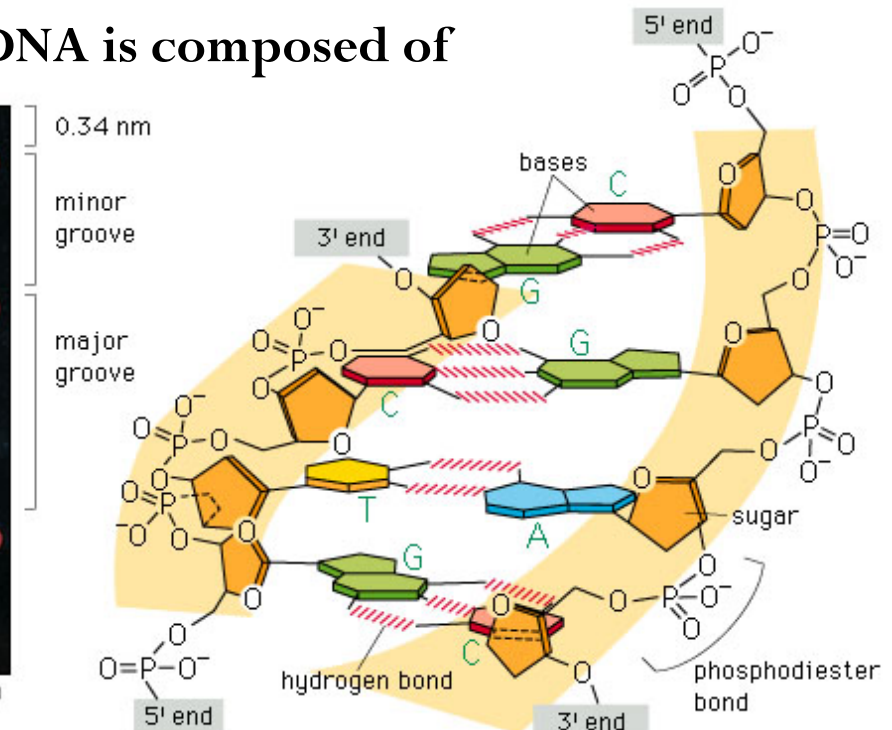


# DNA has an orientation

Actually, the double helix structure of DNA is composed of  
a base (A,C,G,T)  
a sugar molecule  
a phosphate group



(A)



(B)

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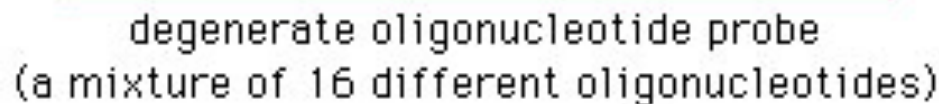
DNA always reads from 5' end to 3' end for  
transcription replication (see later)

5' ATTAGGCC 3'

3' TAAATCCGG 5'

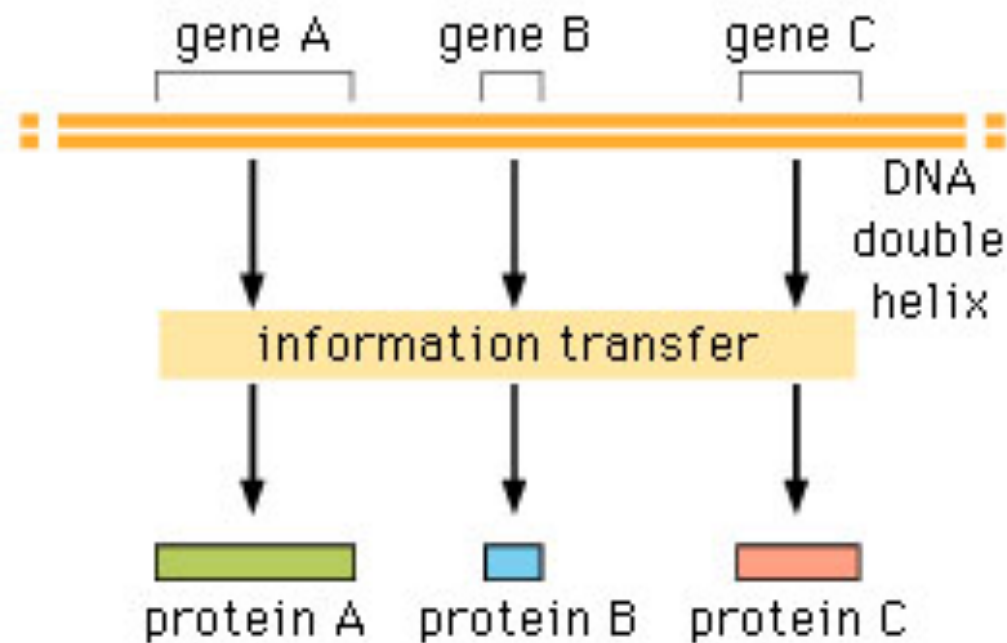
GCA	AGA									UUA					AGC					
GCC	AGG									UUG					AGU					
GCG	CGA						GGA			CUA				CCA	UCA	ACA			GUA	
GCU	CGC						GGC		AUA	CUC				CCC	UCC	ACC			GUC	UAA
	CGG	GAC	AAC	UGC	GAA	CAA	GGG	CAC	AUC	CUG	AAA		UUC	CCG	UCG	ACG		UAC	GUG	UAG
	CGU	GAU	AAU	UGU	GAG	CAG	GGU	CAU	AUU	CUU	AAG	AUG	UUU	CCU	UCU	ACU	UGG	UAU	GUU	UGA
Ala	Arg	Asp	Asn	Cys	Glu	Gln	Gly	His	Ile	Leu	Lys	Met	Phe	Pro	Ser	Thr	Trp	Tyr	Val	stop
A	R	D	N	C	E	Q	G	H	I	L	K	M	F	P	S	T	W	Y	V	

protein sequence of a small portion  
of the Factor VIII protein



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# Actually portions of chromosomes called genes encode proteins



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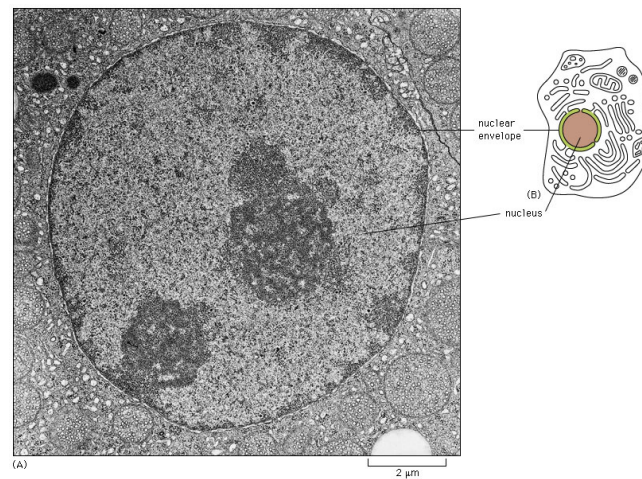
CCCTGTGGAGCCACACCCTAGGGTTGGCCA
ATCTACTCCAGGAGCAGGGAGGGCAGGAG
CCAGGGCTGGGCATAAAAGTCAGGGCAGAG
CCATCTATTGCTTACATTGCTTCTGACAC
AACTGTGTTCACTAGCAACTCAACAGACA
CCATGGTGCACCTGACTCCTGAGGAGAAGT
CTGCCGTACTGCCCTGTGGGGCAGGTGA
ACGTGGATGAAGTTGGTGGTGAAGCCCTGG
GCAGGTTGGTATCAAGGTTACAAGACAGGT
TTAAGGAGACCAATAGAACTGGGCATGTG
GAGACAGAGAAGACTCTTGGGTTTCTGATA
GGCACTGACTCTCTCTGCCATTATGGTCTAT
TTTCCACCCCTTAGGCTGCTGGTCTAC
CCTTGGACCCAGAGGTTCTTGAAGTCCTTT
GGGATCTGTCCACTCCTGATGCTGTATG
GGCAACCTTAAGTGAAGGCTCATGGCAG
AAAGTGCTCGGTGCCCTTATGATGGCCTG
GCTCACTGGACAACCTCAAGGGCAGCTTT
GCCACCTGAGTGAGCTGCACTGTGACAG
CTGCACCTGGATCTGAGAACTTCAGGCTG
AGTCTATGGGACCTTGATGTTTCTTTCC
CCTCTTTTCTATGTTAAGTTCATGTCAT
AGGAGGGGAGAAGTAAACAGGTACAGTTT
AGAAATGGGAAACAGACGAATGATTGATCA
GTGTGGAAGTCTCAGGATCGTTTATGTTTC
TTTTATTGCTGTTCATAACAATTGTTTC
TTTTGTTAATCTTCTTCTTTTCTTTTTC
CTTCTCCGCAATTTTACTATTATACCTAA
TGCTTAACTTGTGTATAACAAAGGAAA
TATCTCTGAGATACATTAACTAACTTAAA
AAAACTTTACACAGCTGCTAGTACATT
ACTATTGGAAATATGTGTCTTATTTGC
ATATTCATAATCTCCCTACTTTATTTCTT
TTATTTTAAATGATACATAATCAATATAC
ATATTATGGGTTAAAGTGTAAGTTTAA
TATGTGTACACATATTGACCAATCAGGCT
AATTTTGCATTGTAAATTTTAAAAAAGCT
TCTCTCTTTTAAATATCTTTTGTGTTATC
TTATTCTAATACTTTCCCTAATCTCTTTC
TTTCAGGGCAATAATGATCAATGTATCAT
GCCTCTTTGCACCATTTCAAGAAATAACAG
TGATAATTTCTGGTTAAGGCAATAGCAAT
ATTTCTGCATATAAATATTTCTGCATATAA
ATTGTAACTGATGAAGAGGTTTCATATG
CTAATAGCAGCTACAATCCAGCTACCATTC
TGCTTTTATTTATGGTTGGGATAAGGCTG
GATTATTGTAGTCCAGCTAGGCCCTTTT
GCTAATCATGTTATACCTCTTATCTTCTT
CCACAGCTCCTGGGCAACGCTGCTGCTCTG
TGTGCTGGCCCATCACTTTGGCAAGAATT
CACCCACAGCTGAGGCTGCCTATCAGAA
AGTGTGGCTGGTGTGGCTAATGGCCCTGG
CCACAGATATCAATAGCTGCTTCTTCTG
TGTCGAATTTCTATTAAGGTTCTTTGTT
CCCTAAGTCCAACTACTAACTGGGGGATA
TTATGAAGGCCCTTGAGCATCTGGATTCTG
CCTAA7AAAAACATTTATTTCAATTGCAA
TGATG7ATTTAAATTTCTGAATATTTT
ACTAAAAAGGGAATGTGGGAGTCAGTGCA
TTTAAAAACATAAAGAAATGATGAGCTGTC
AAACCTTGGGAAATACACTATATCTTAAA
CTOCATGAAGAAGGTGAGGCTGCAACCAG
CTAATGCACATTTGCAACAGCCCTGATGC
CTATGCTTATTATCCCTCAGAAAAGGAT
TCTGTAGAGGCTTGAATTCAGGCTTAAG
TTTTGCTATGCTGTAATTTACATTACTTAT
TGTTTTAGCTGCTCATGAATGCTTTTC

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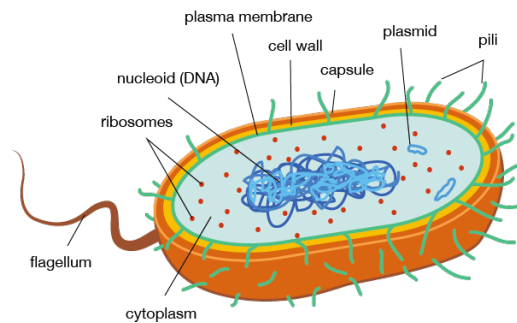
# Where genetic information is

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In eukaryotes, the DNA is in the nucleus



In prokaryotes, the DNA is in the cytoplasm



## A very simplified and abstract view up to now

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Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

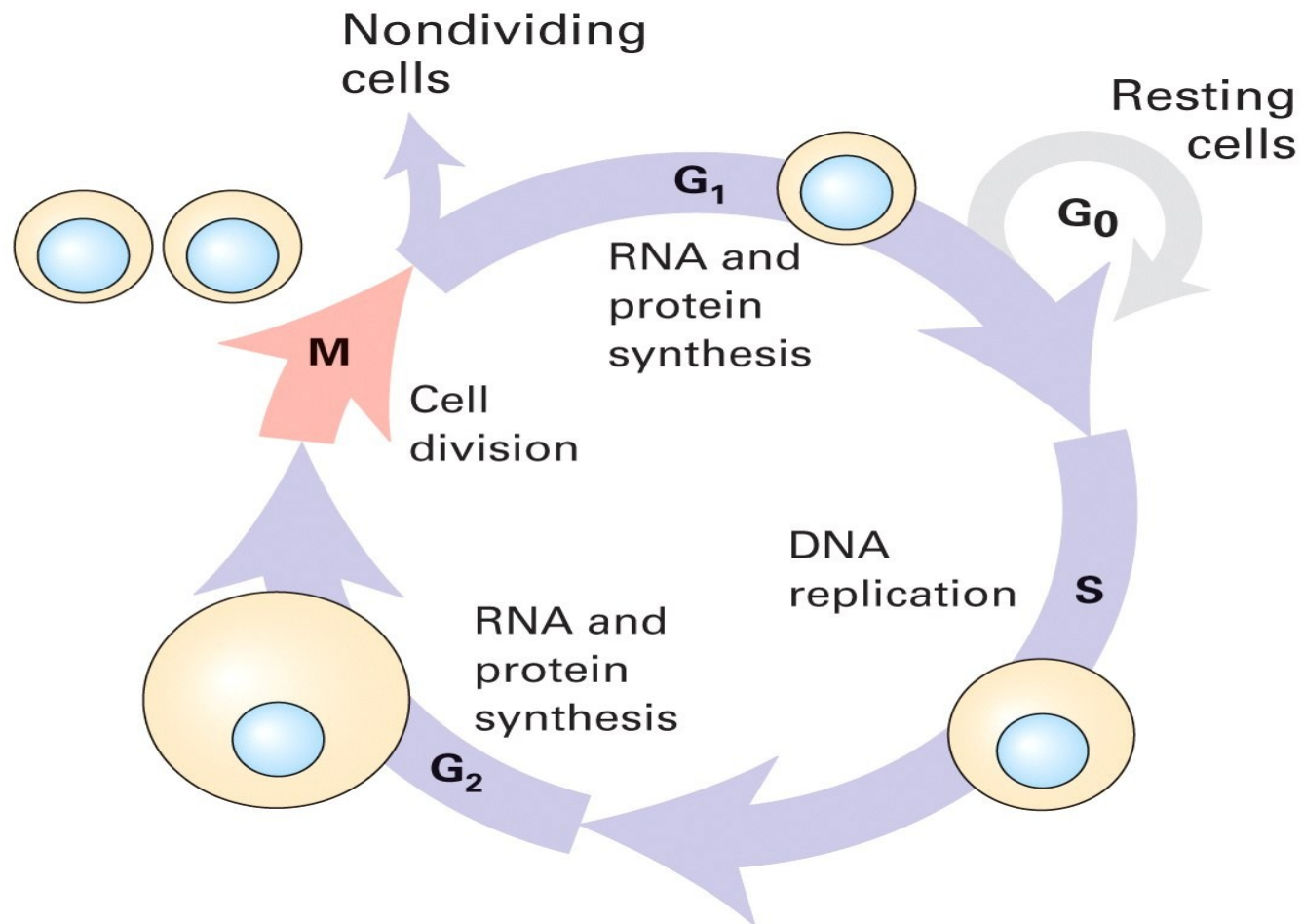
Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**

# All cells have common cycles

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They are born, they eat, they replicate, and they die





## Some cell-cycle times just to give an idea of how much they differ

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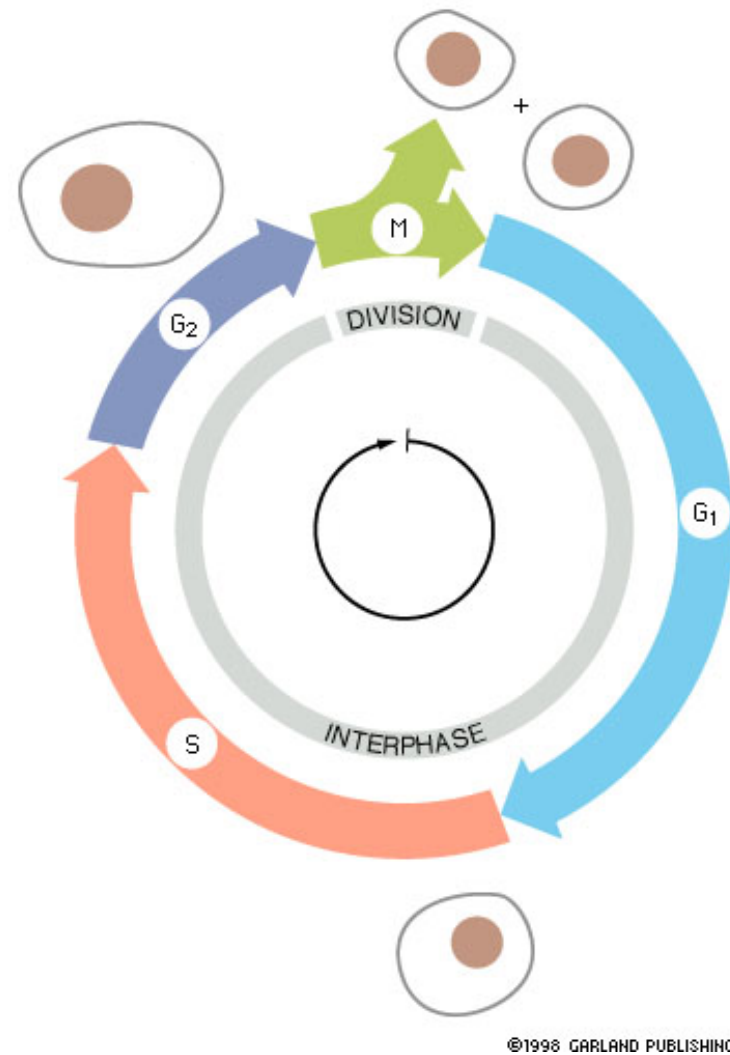
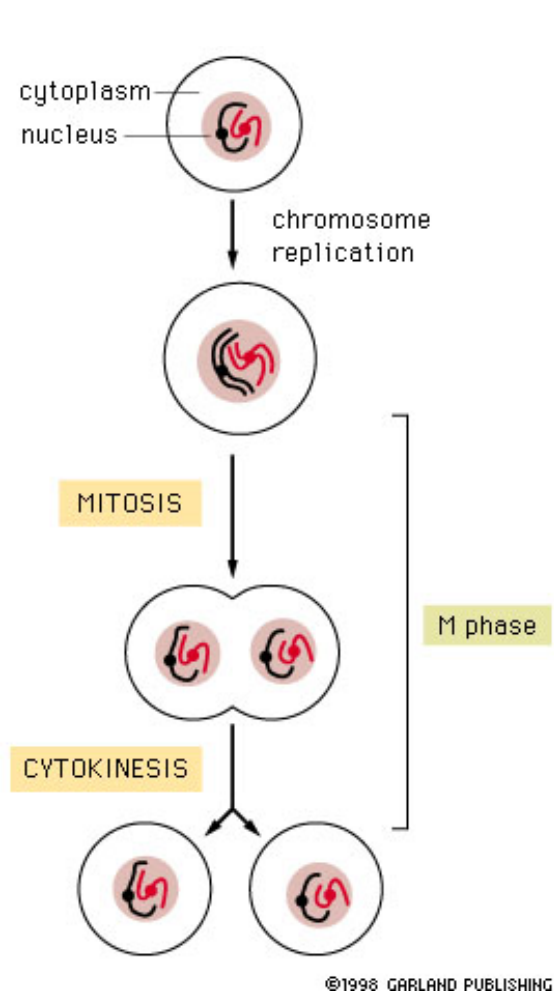
### Eukaryotic cell-cycle times

Cell Type	Cell-Cycle Times
Early frog embryo cells	30 minutes
Yeast cells	1.5-3 hours
Intestinal epithelial cells	about 12 hours
Mammalian fibroblasts in culture	about 20 hours
Human liver cells	about 1 year

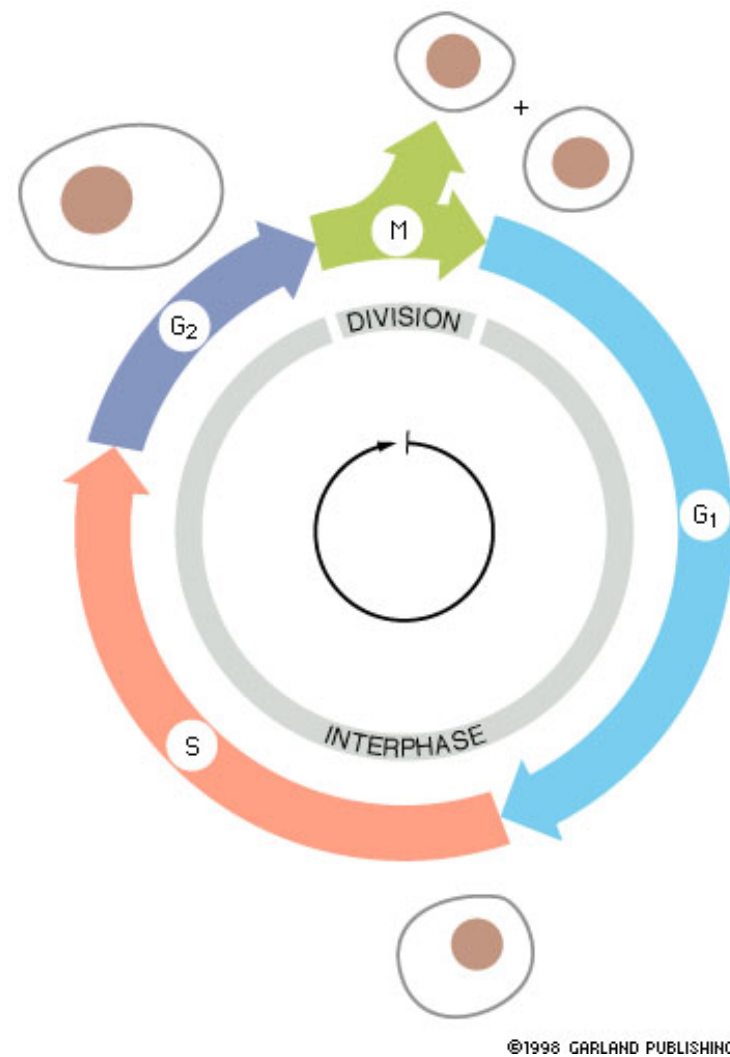
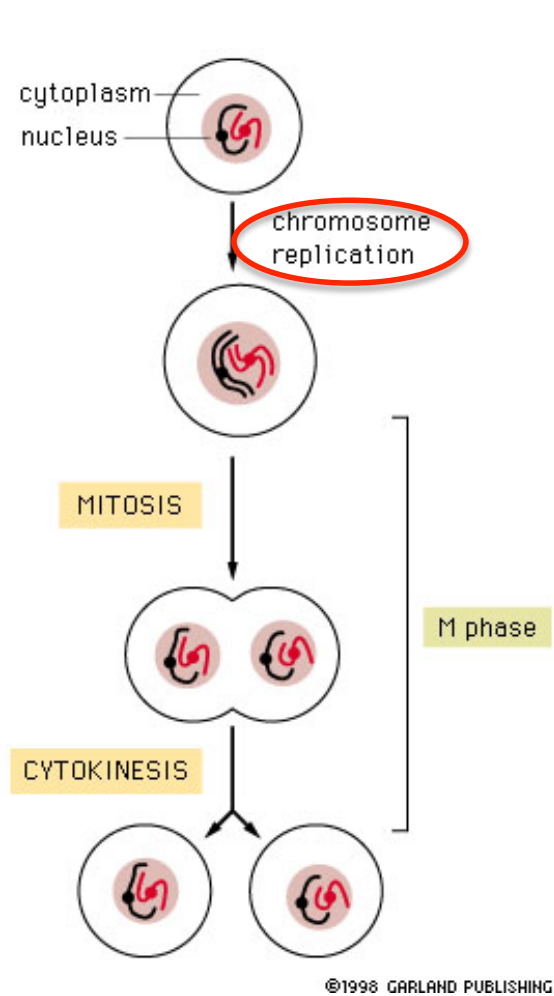
### Prokaryotic cell-cycle times

Rate at which bacteria grow and divide depends on the nature of the microbe, the ingredients of the medium in which it is grown, and the environmental conditions. *E. coli*, when grown in a rich medium, with plenty of aeration at 37°C is capable of dividing every 20 min

# Eukaryotic cell cycle

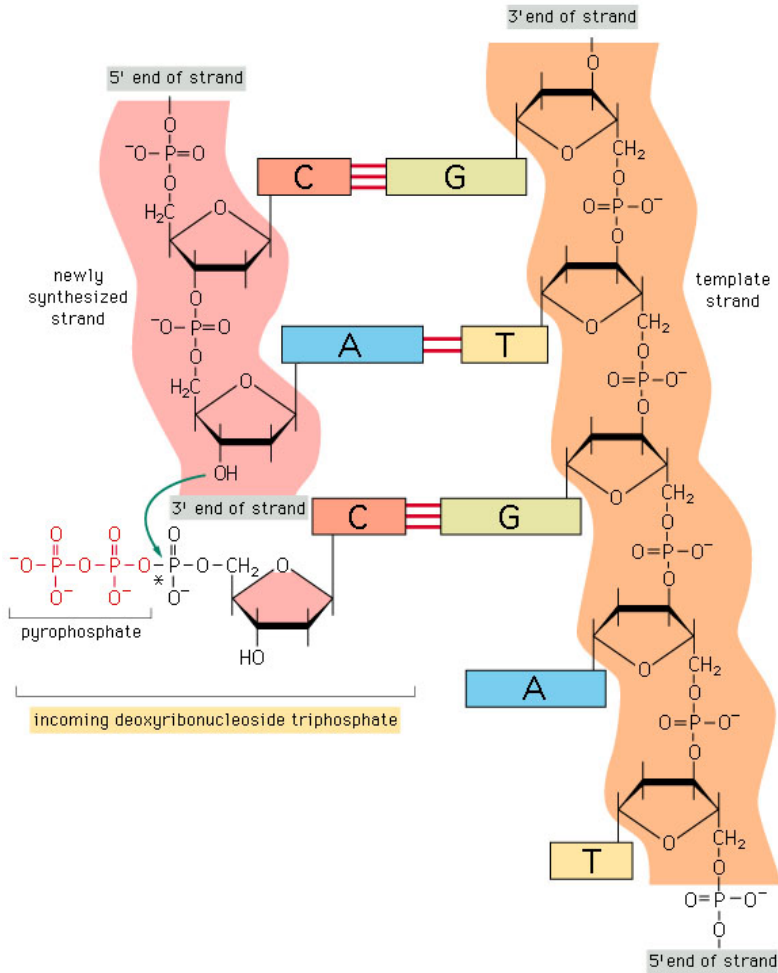


# Eukaryotic cell cycle

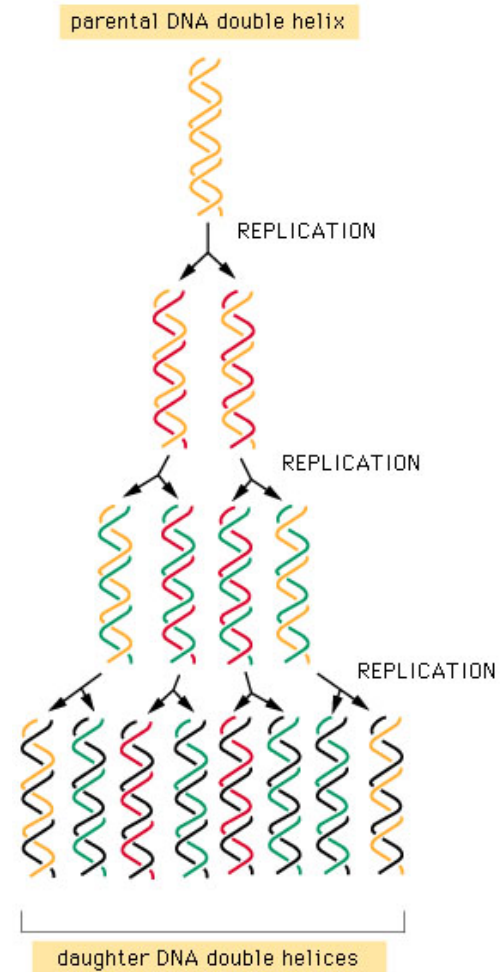


# DNA replication

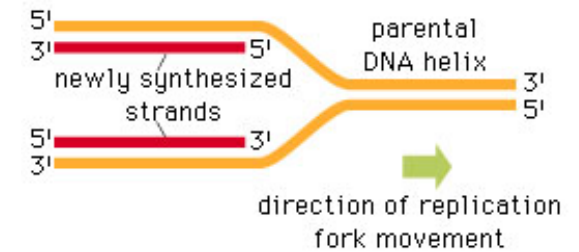
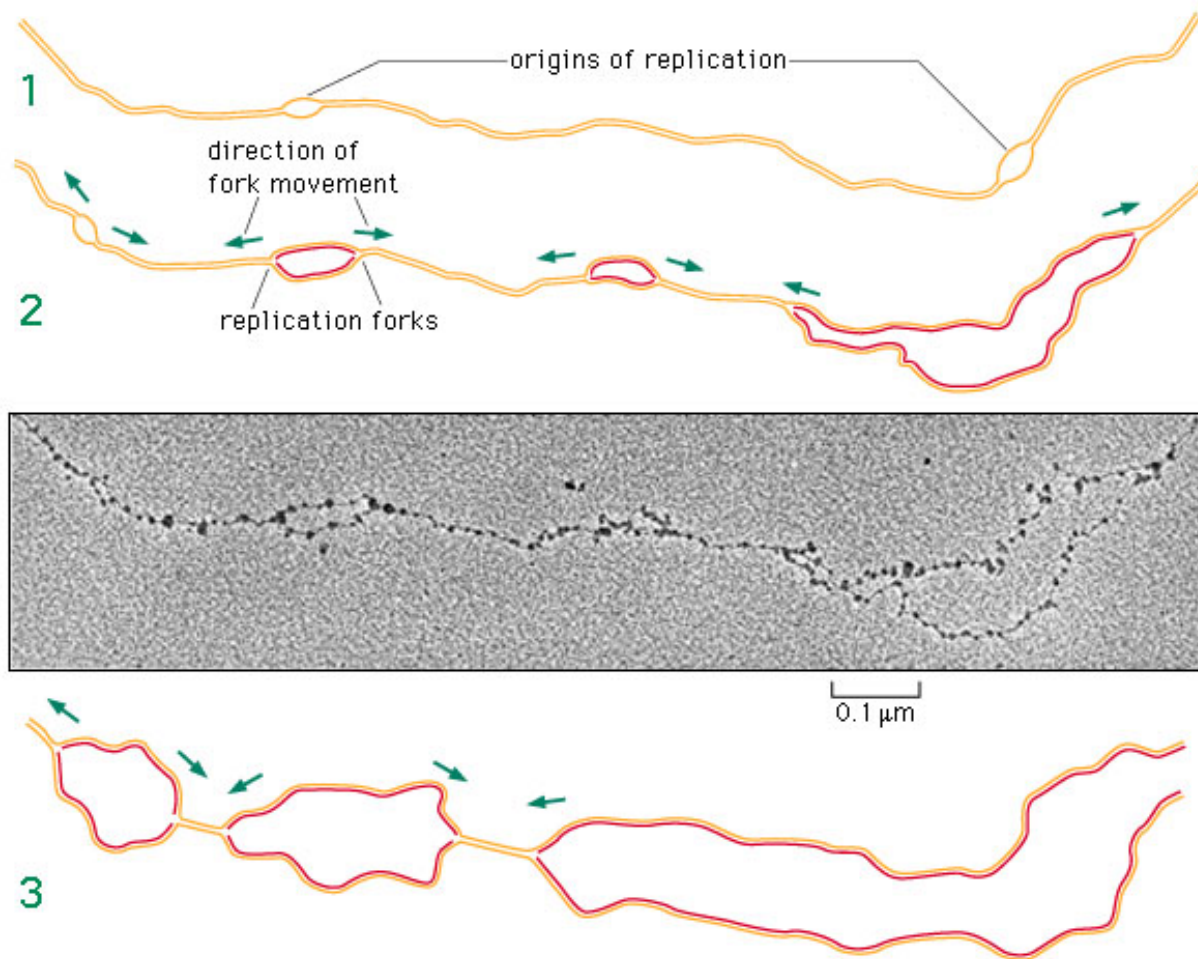
## Each strand serves as template



## Process is semi-conservative



# Replication of eukaryotic chromosomes

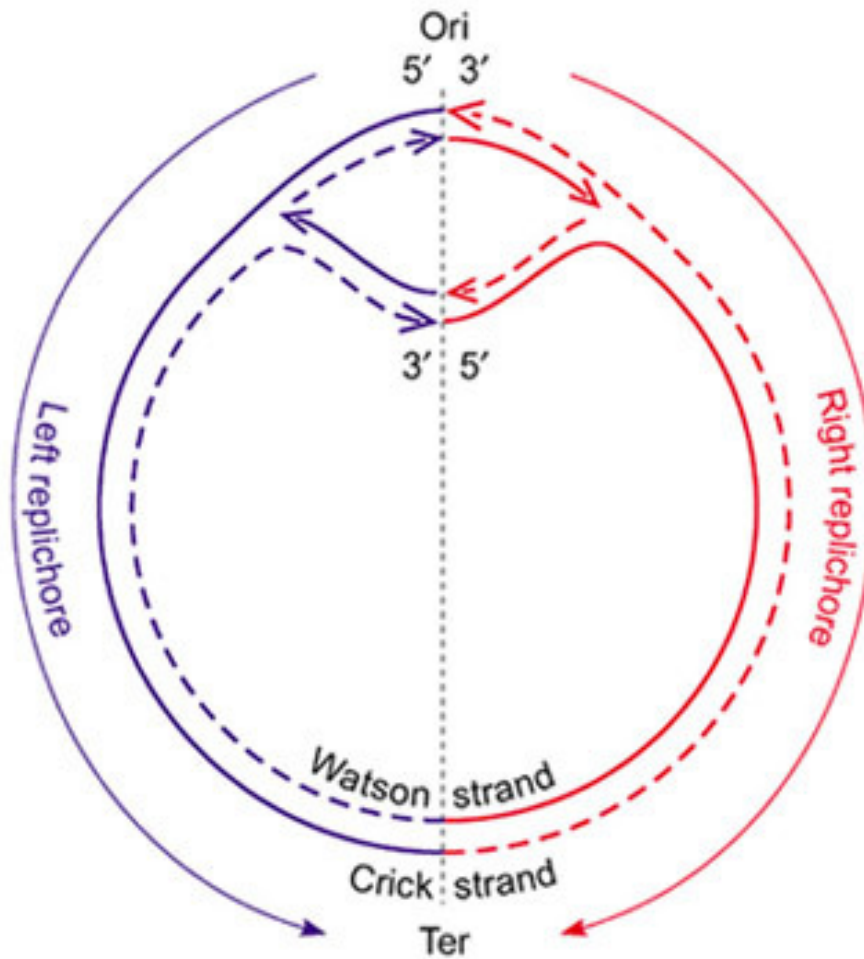


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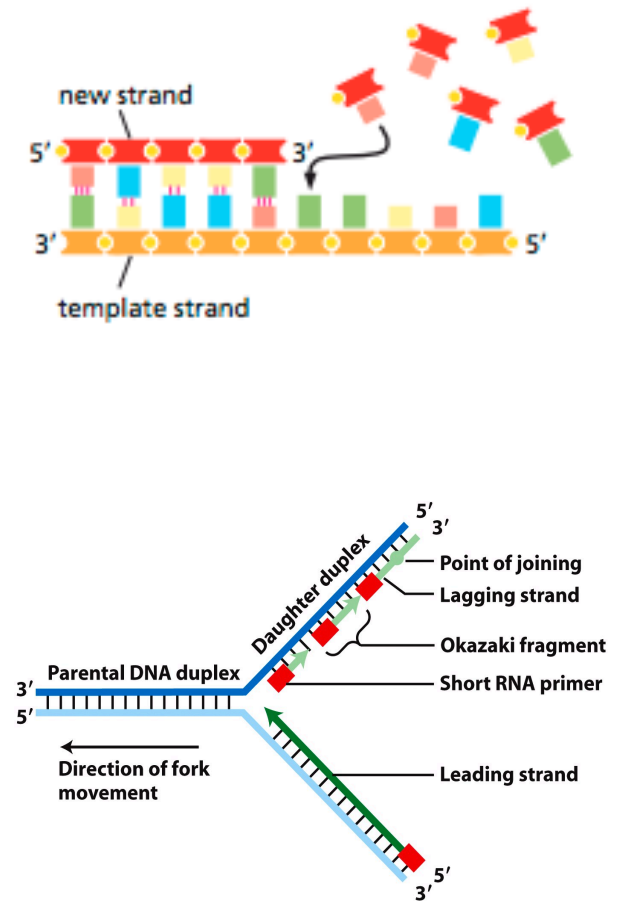
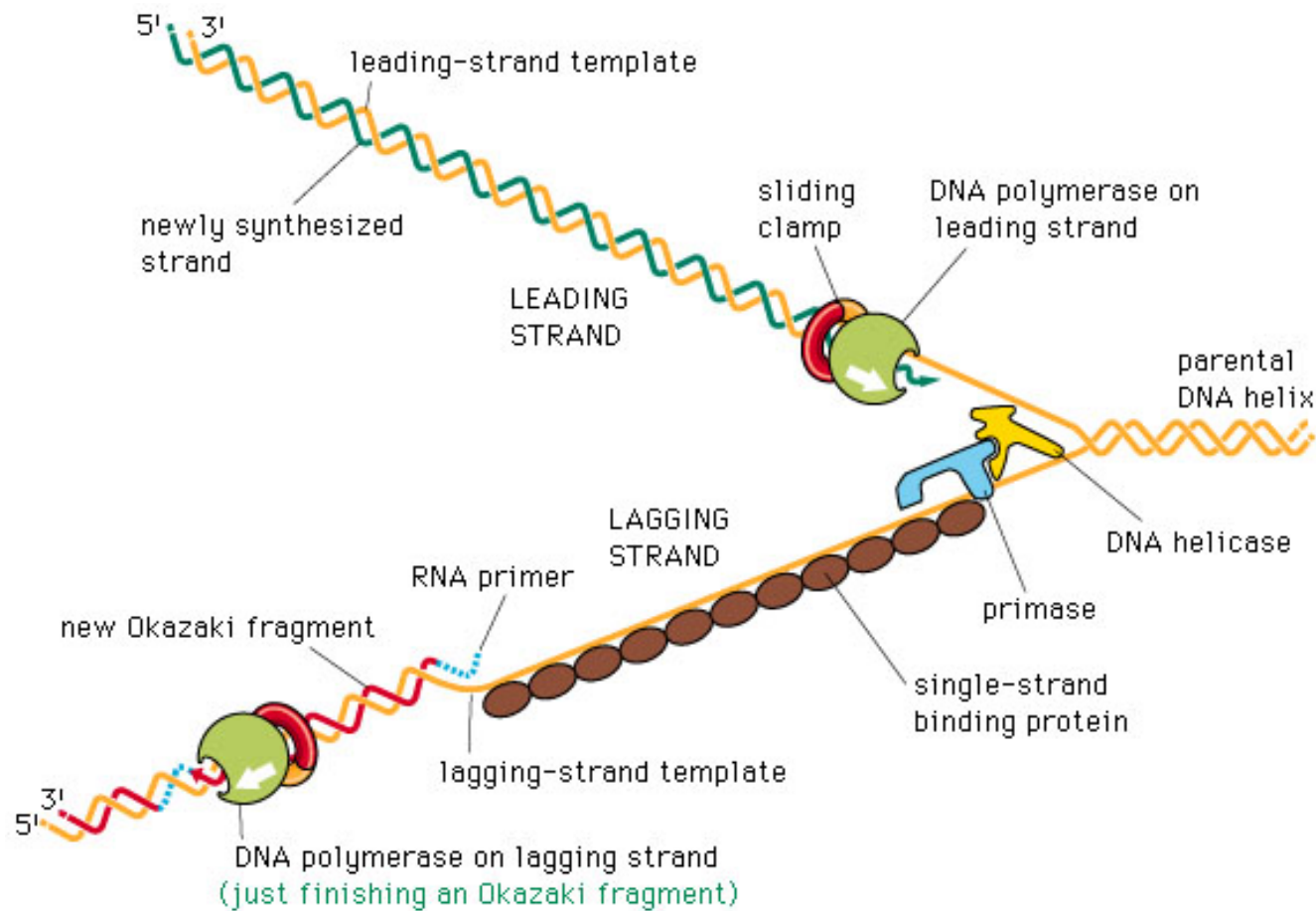
# Replication of prokaryotic chromosomes

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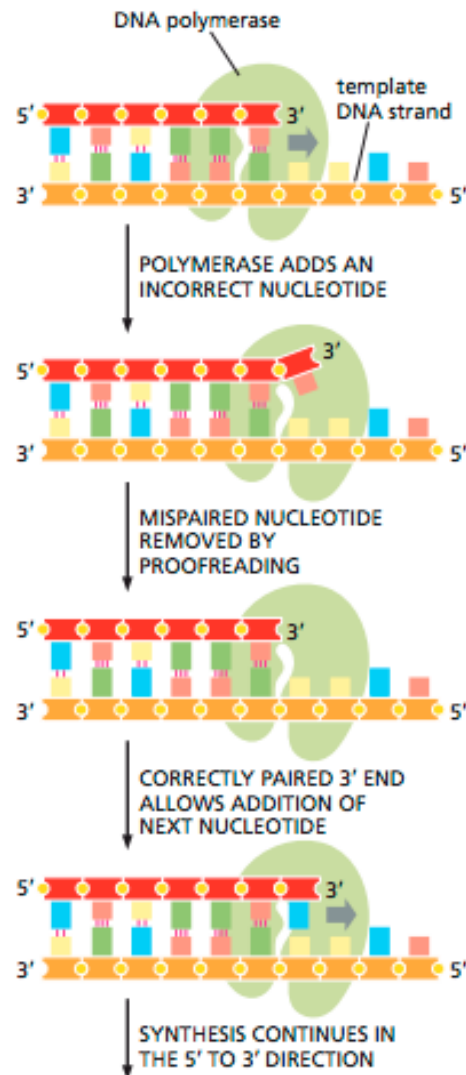


# The replication fork in more detail



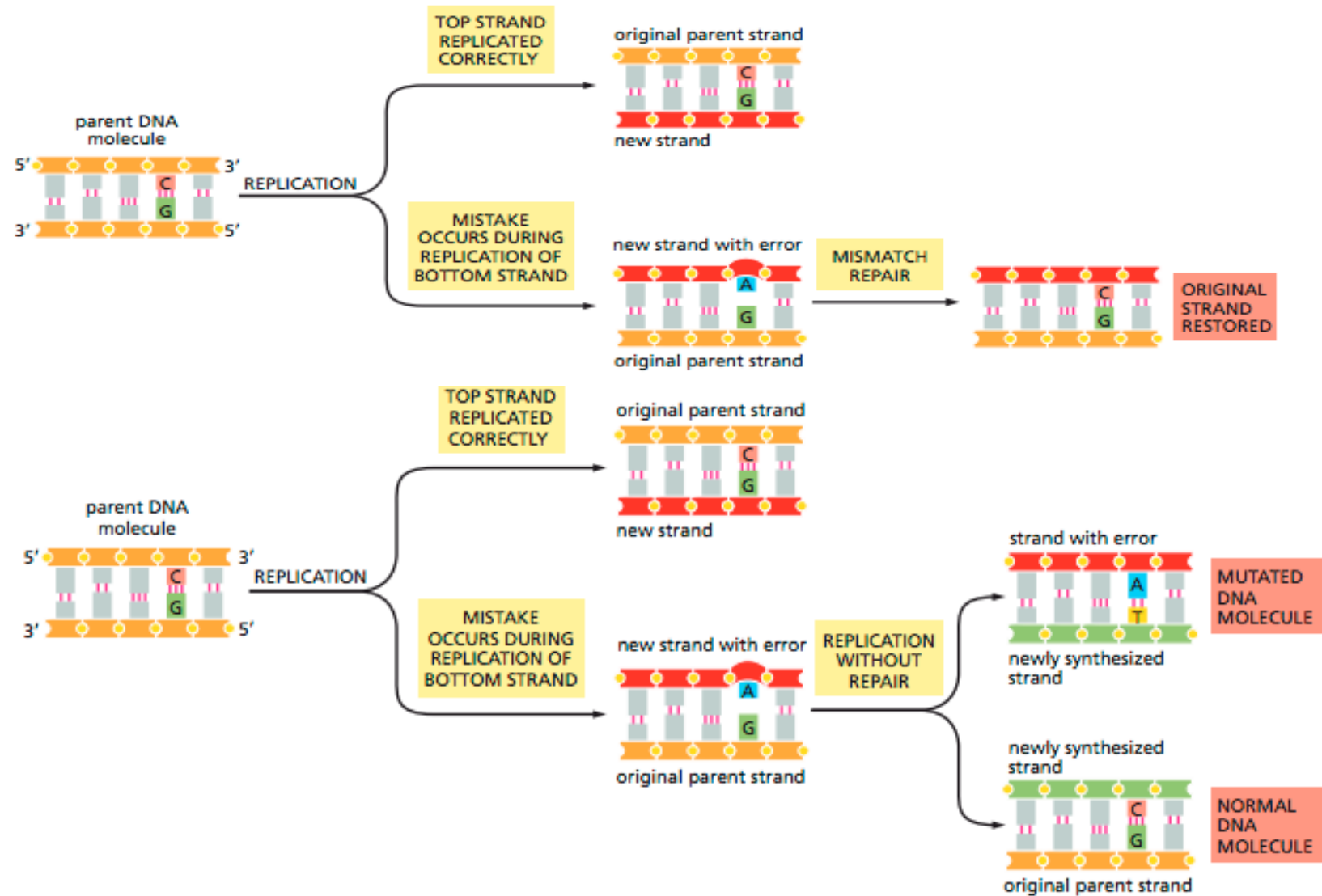
# There is proof reading during DNA synthesis

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However mistakes may remain

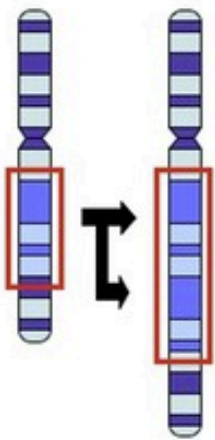
# DNA repair and DNA mutations during replication



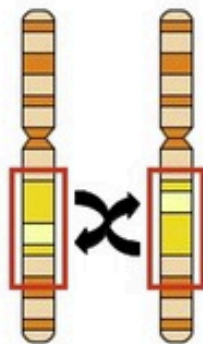
## Other types of mutations may happen at the chromosomal level

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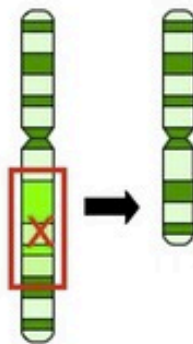
**Duplication**



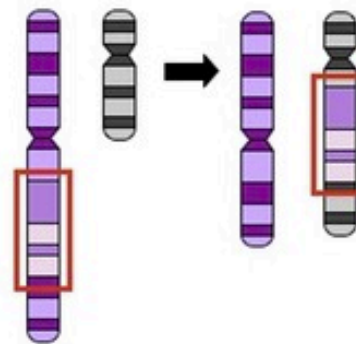
**Inversion**



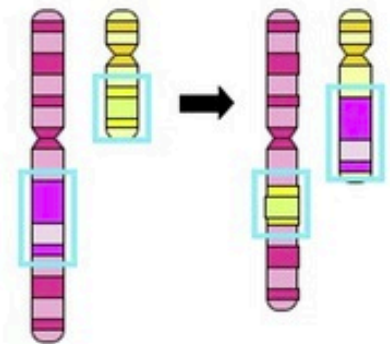
**Deletion**



**Insertion**



**Translocation**



## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**



# Evolution

---

Nucleus / cytoplasm = library  
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BUT... (see later)

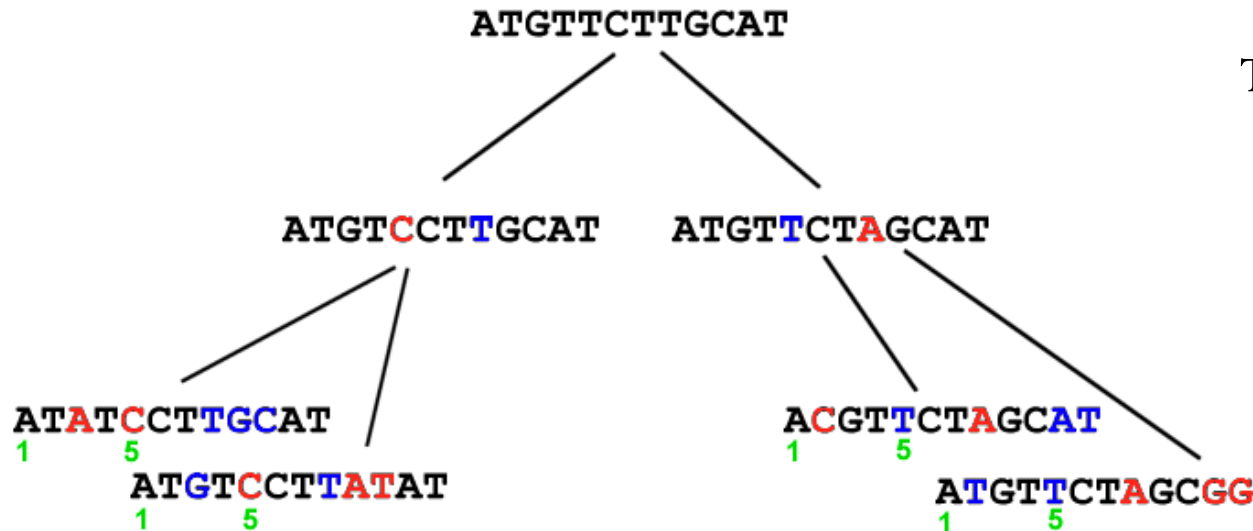
Almost every cell in an organism contains the same libraries and the same sets of books

BUT (again)... (see later...)

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT such books are never static! They are in fact continuously changing in a process that may even lead to the creation of new species!**

# Speciation



Two main cases of speciation

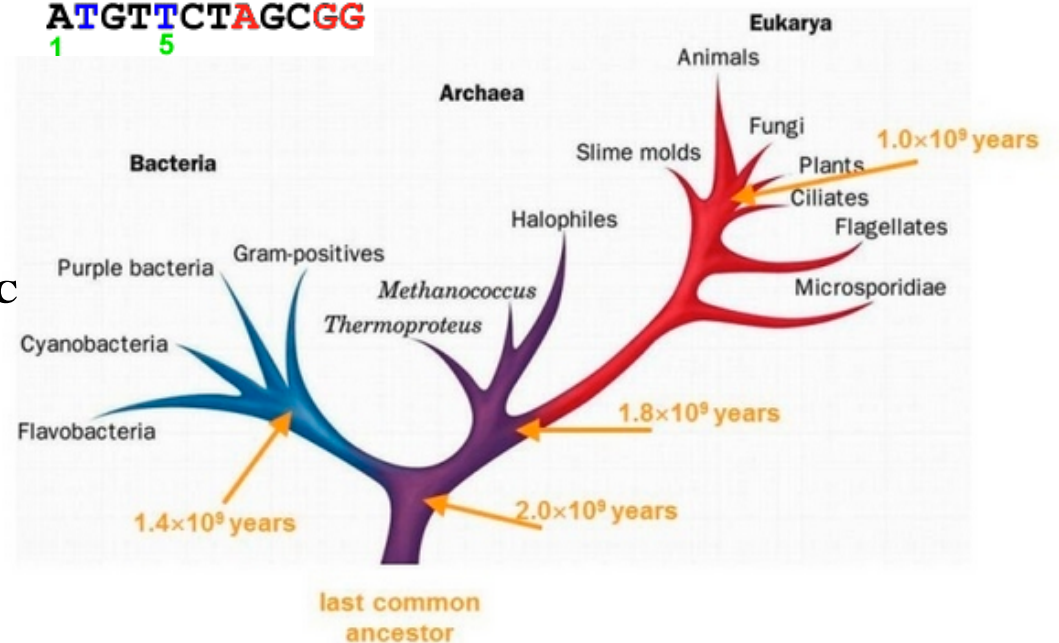
There is geographic separation

There is no geographic separation

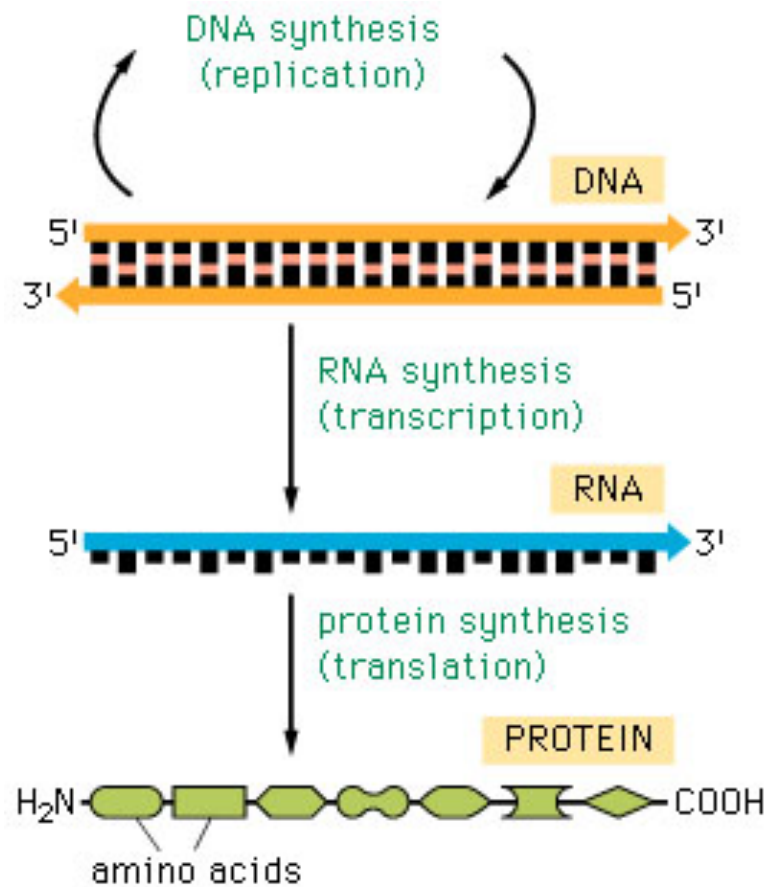
Species evolution usually represented in the form of a so-called phylogenetic tree

**BUT...**

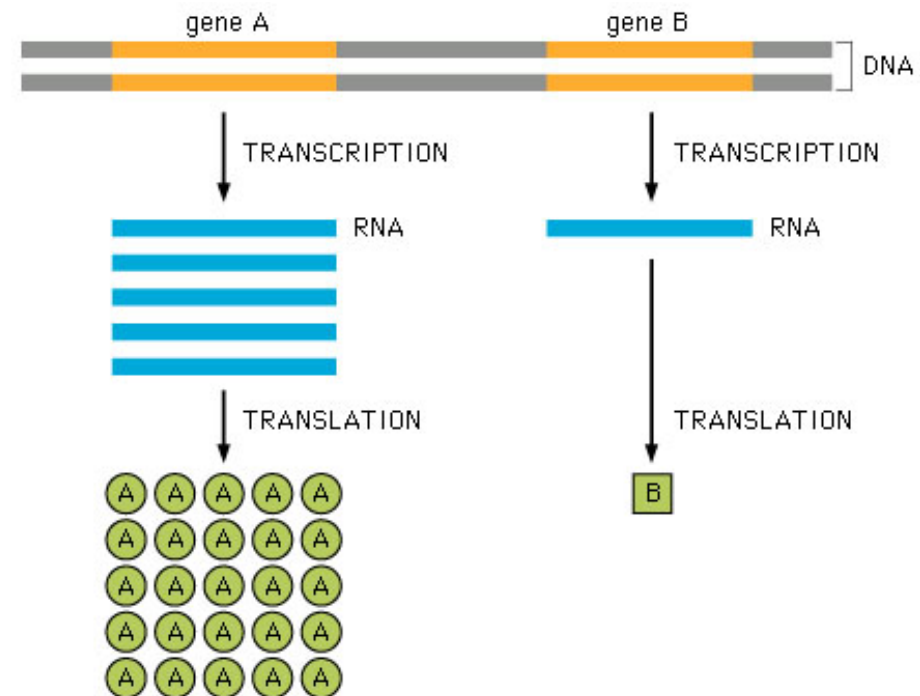
**More on it (much) later... (not today)**



# The (so-called) genetic dogma



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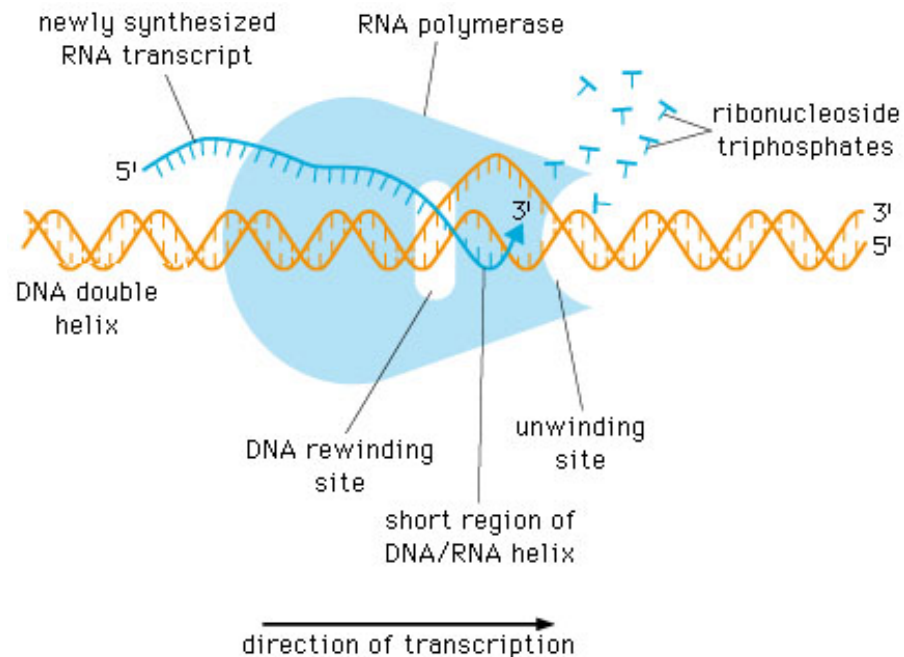


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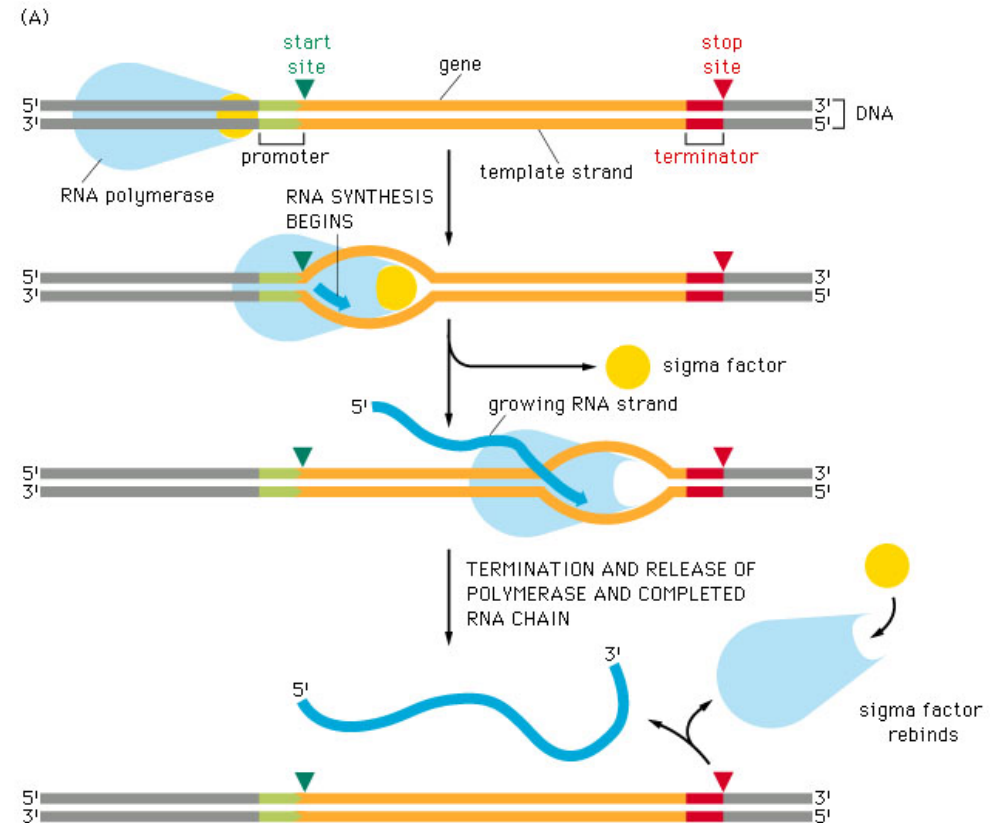
A gene is **expressed** in two steps:  
Transcription: RNA synthesis  
Translation: Protein synthesis

# Transcription by RNA polymerase

RNA polymerase = enzyme = protein / Sigma factor = protein

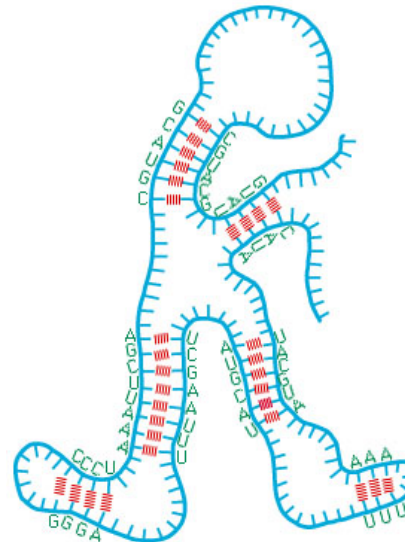
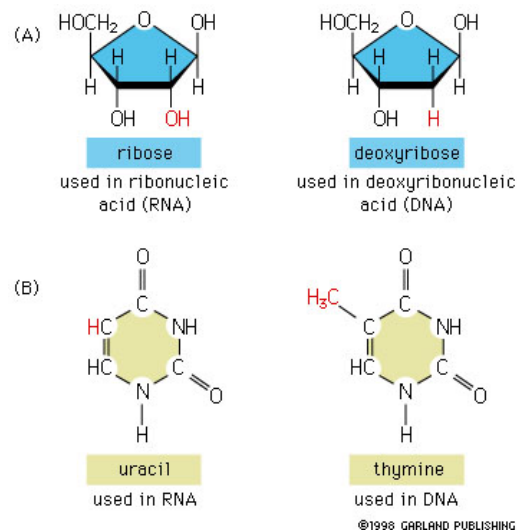


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# RNA versus DNA



mRNAs	codes for proteins
rRNAs	forms part of the structure of the ribosome and participates in protein synthesis
tRNAs	used in protein synthesis as an adaptor between mRNA and amino acids
Small RNAs	used in pre-mRNA splicing, transport of proteins to endoplasmic reticulum, and other cellular processes



## Remember when I said

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**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**

# RNA versus DNA

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT actually, there are other special types of “books” besides the genes**

Almost every cell in an organism contains the same libraries and the same sets of books

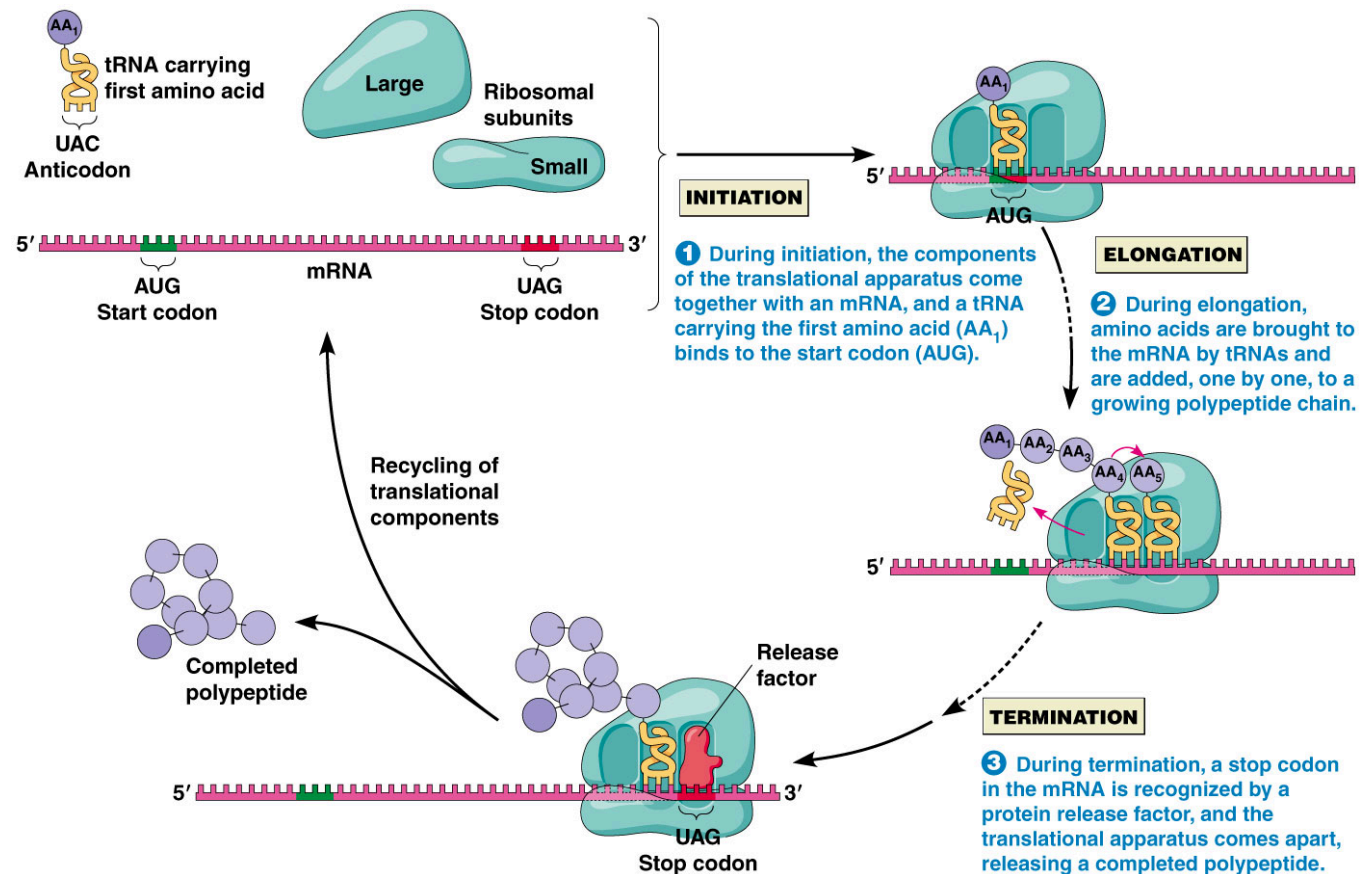
BUT (again)... (see later...)

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

BUT (once more time)... (see later...)

# Translation

Ribosome = complex proteins+RNAs



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## Interactions everywhere

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

BUT... (see later)

Almost every cell in an organism contains the same libraries and the same sets of books

BUT (again)... (see later...)

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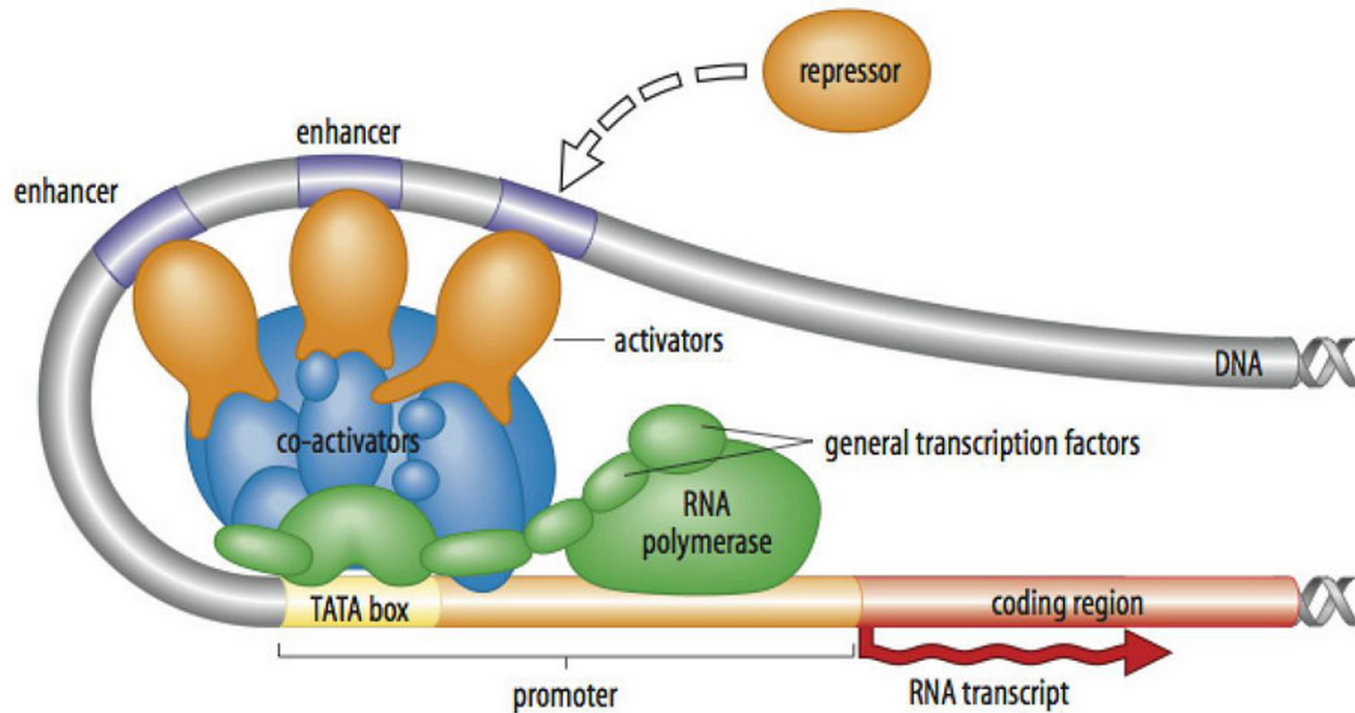
**BUT most functions require INTERACTION among different books**



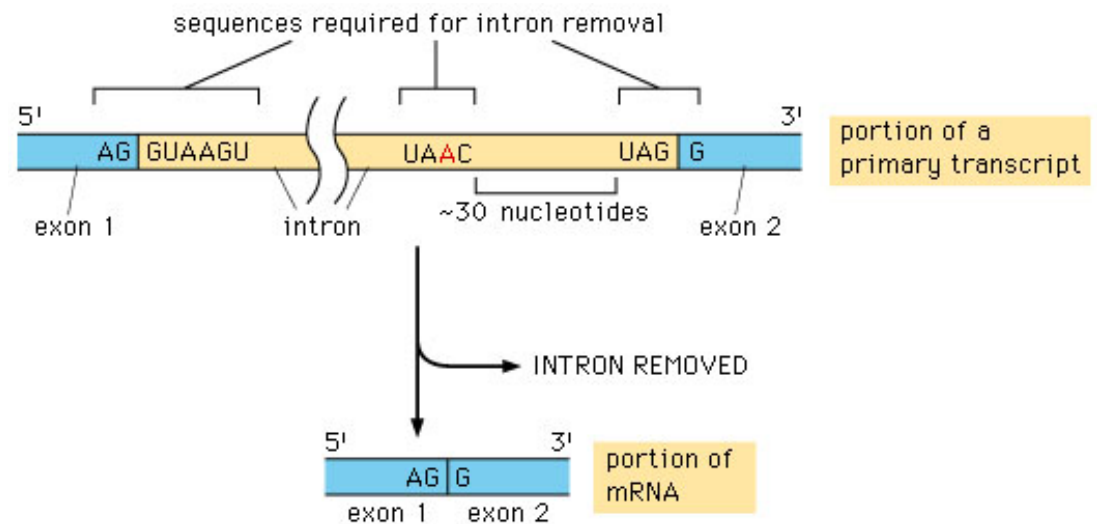
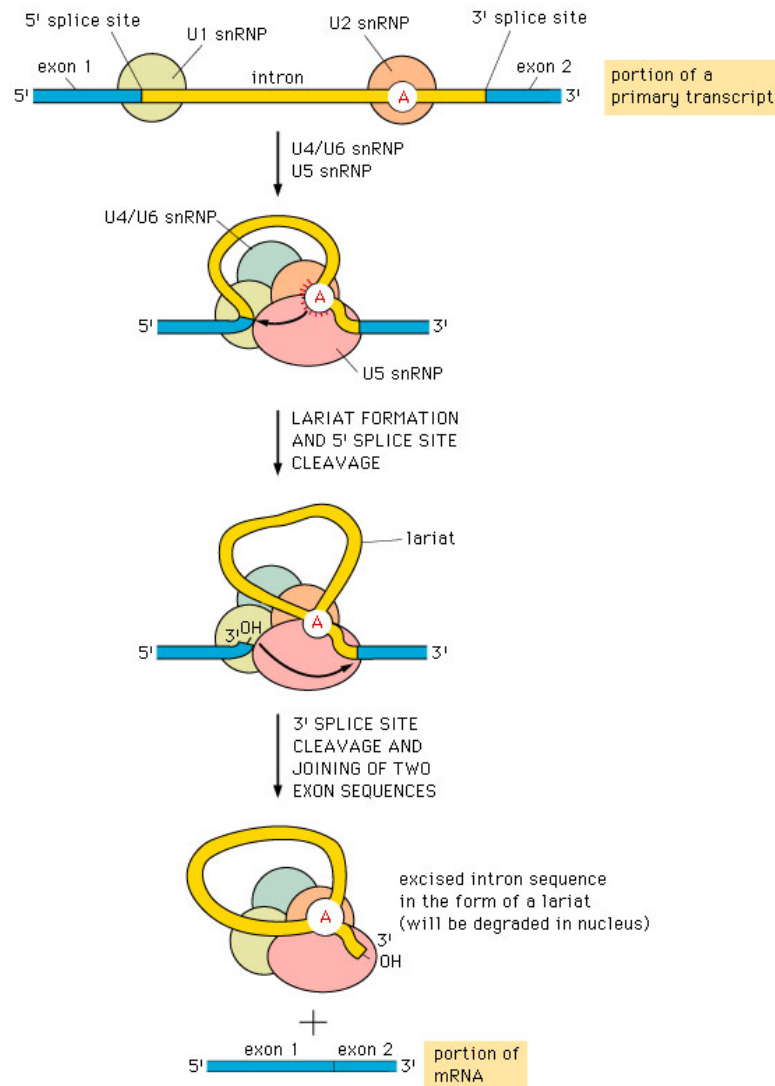
Indeed:

DNA, RNA, and proteins **INTERACT** among / between them through (sometimes highly specific) binding sites

---



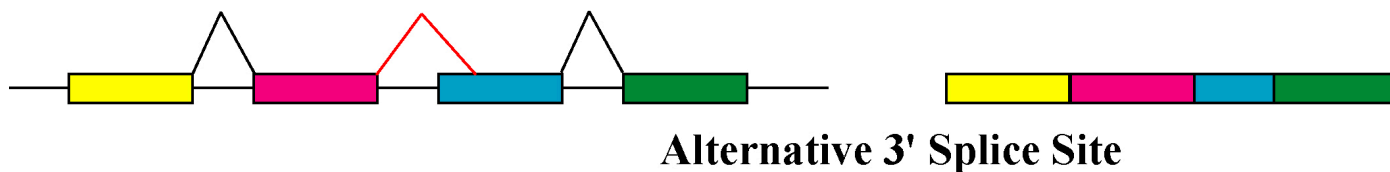
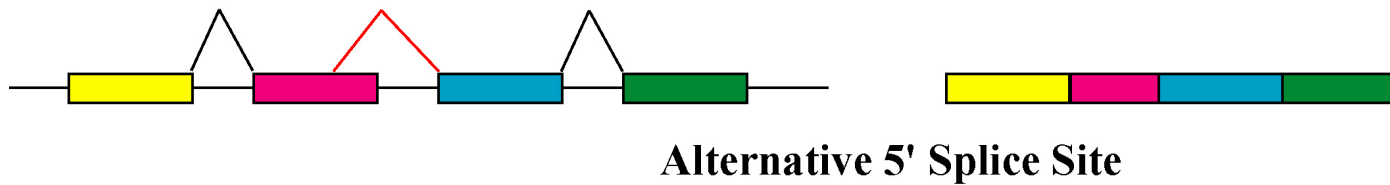
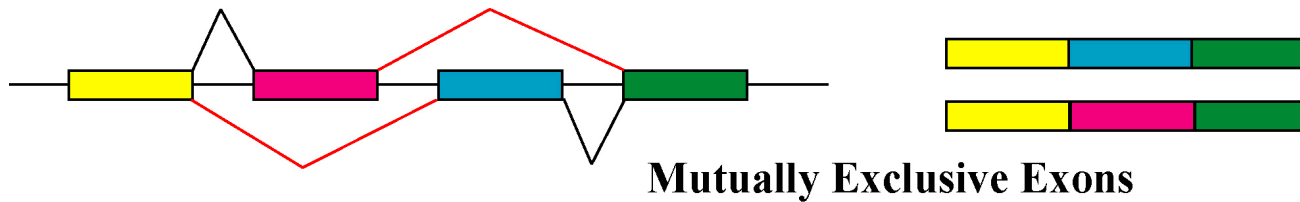
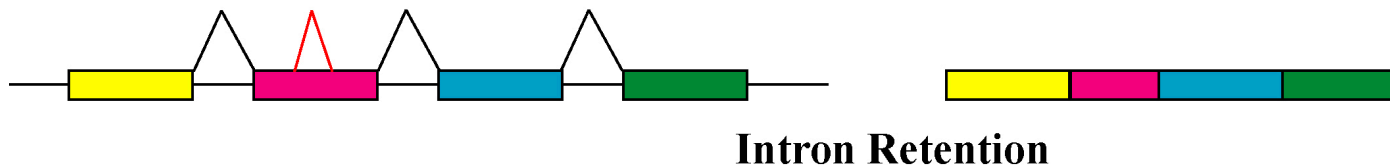
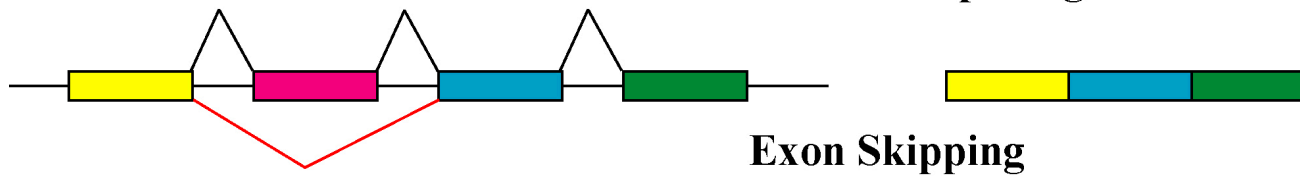
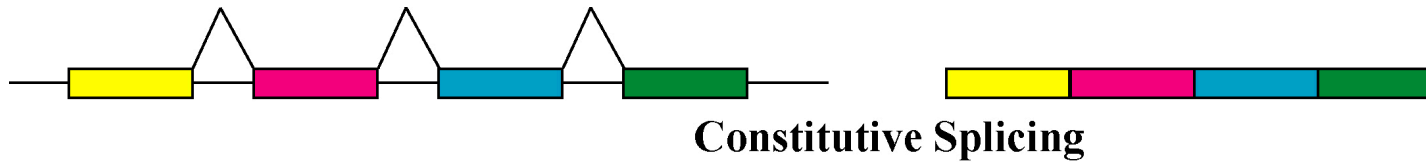
# Eukaryotic genes contain exons and introns



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# Splicing and alternative splicing

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## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**

# Biodiversity of proteins driven by alternative splicing

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

BUT... (see later)

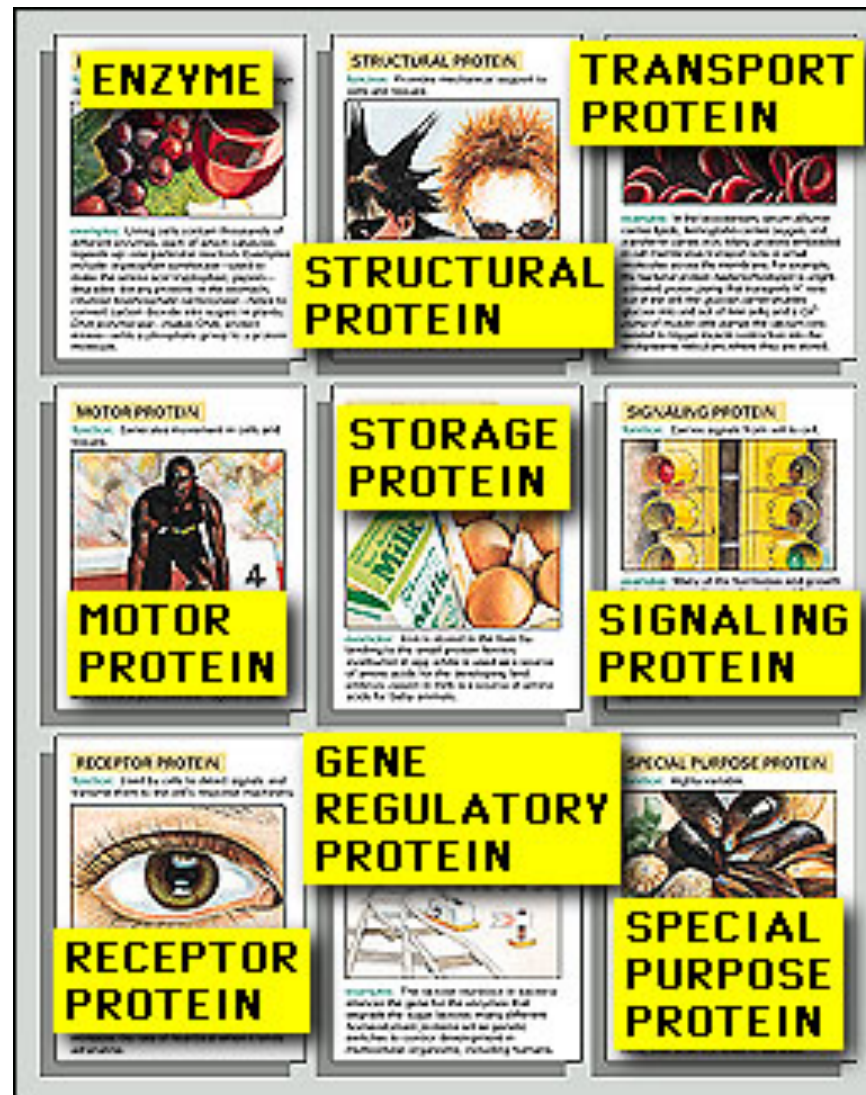
Almost every cell in an organism contains the same libraries and the same sets of books

**BUT even inside a same organism, the “final” books may vary greatly**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

BUT (once more time)... (see later...)

# Various functions of proteins

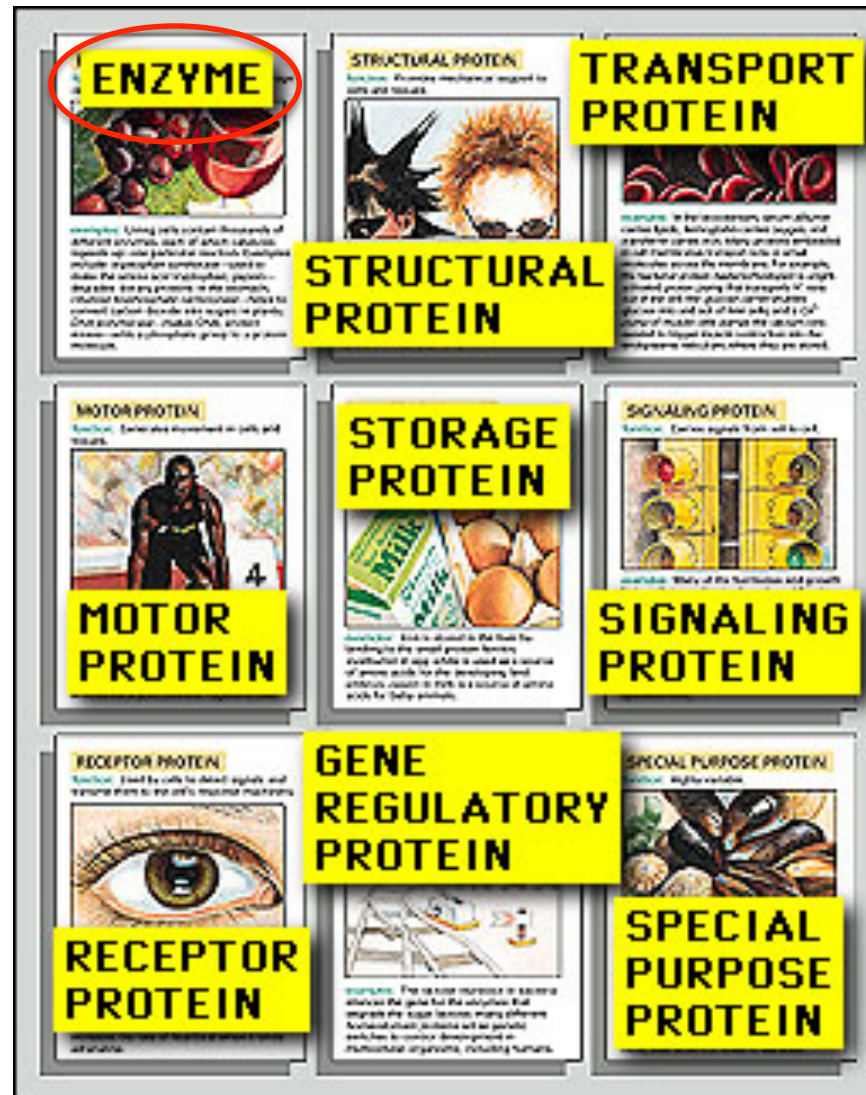




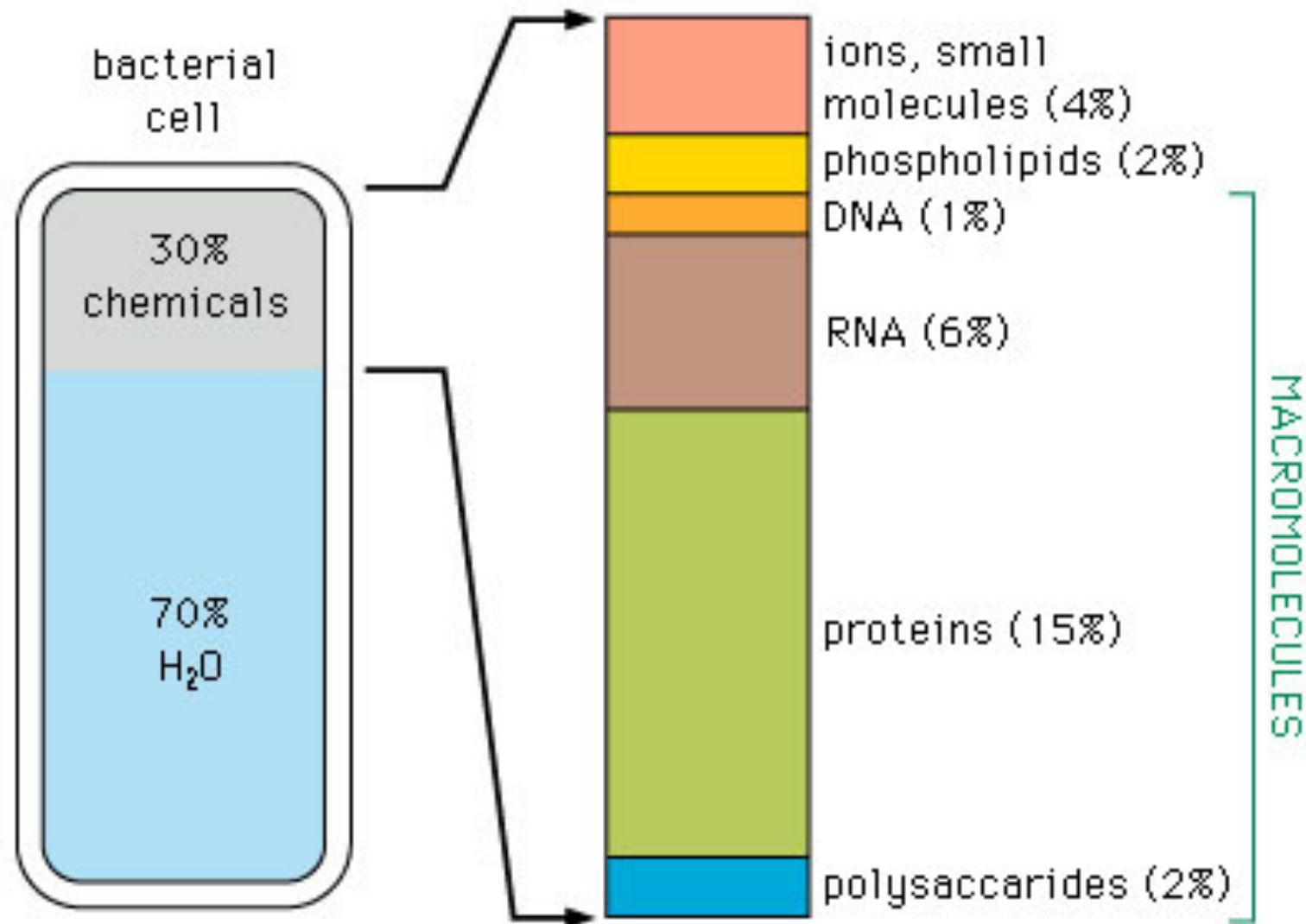
# Various functions of proteins

Crucial in  
metabolism

Metabolism = set  
of life-sustaining  
chemical  
transformations  
within the cells  
of organisms

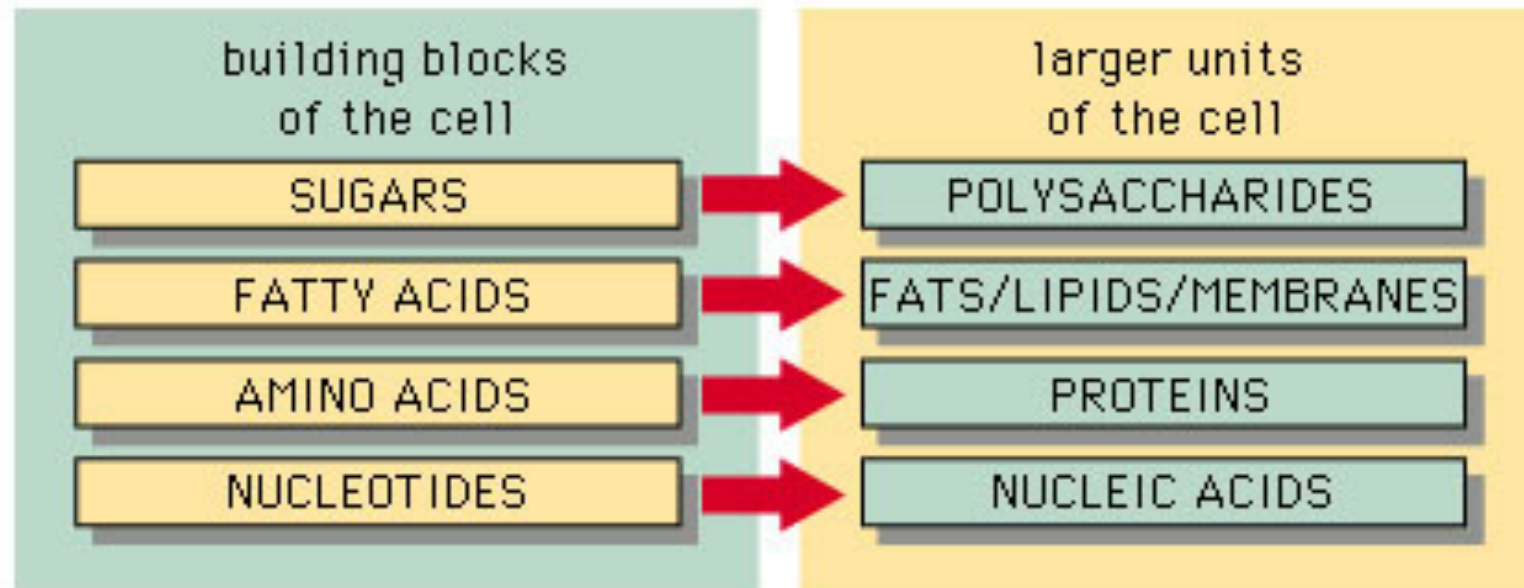


**Remember what was said before:  
macromolecules such as DNA, RNA, proteins and etc  
are abundant in cells**



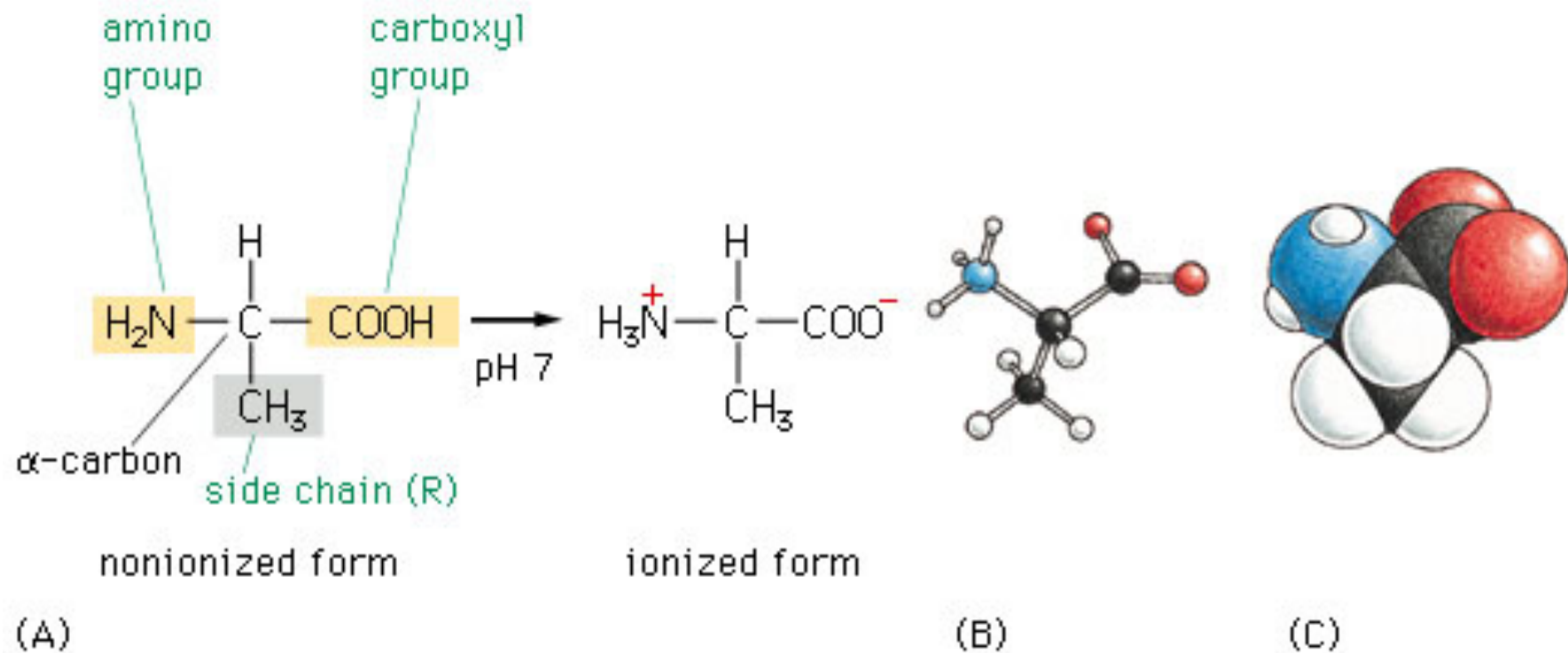
## However small molecules also have an important role: Four main families of small organic molecules in cells

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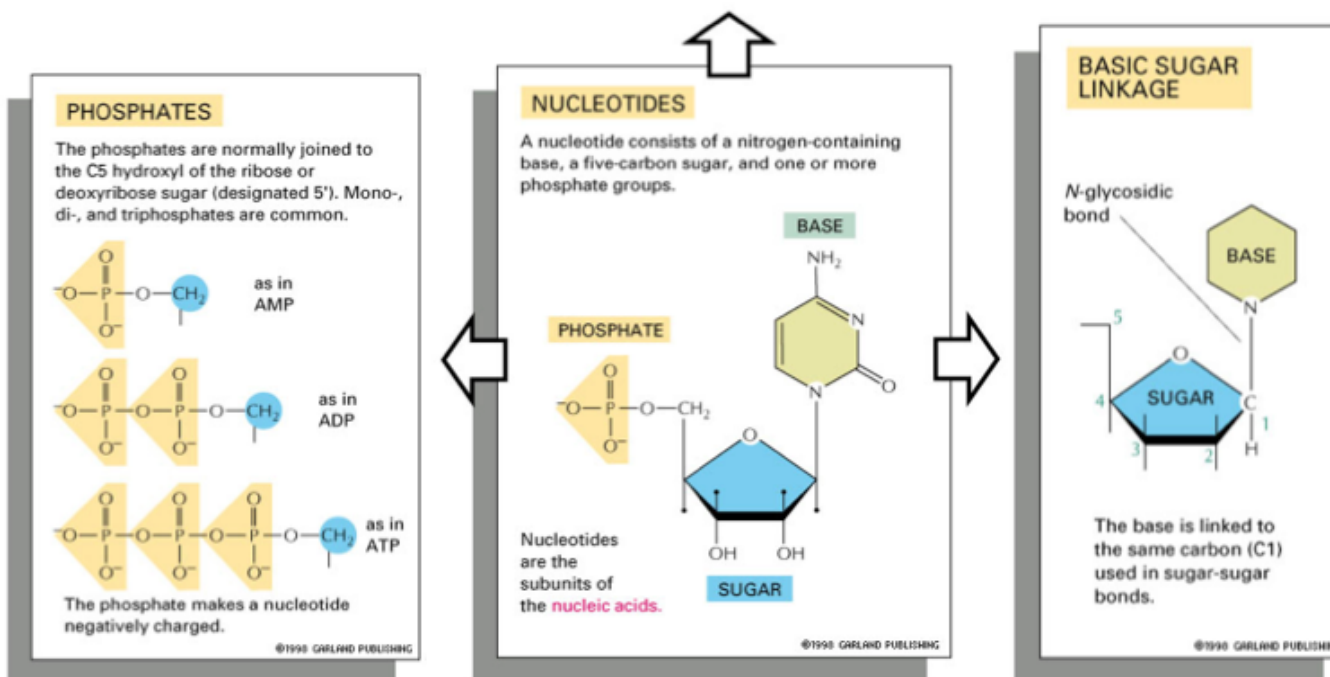
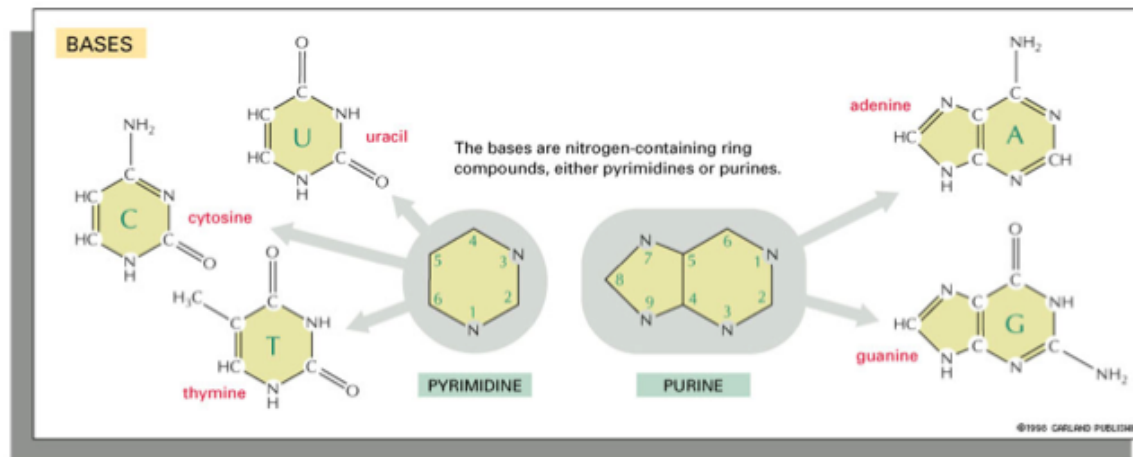


## Looking at two small molecules more in particular: Amino acids of which proteins are made

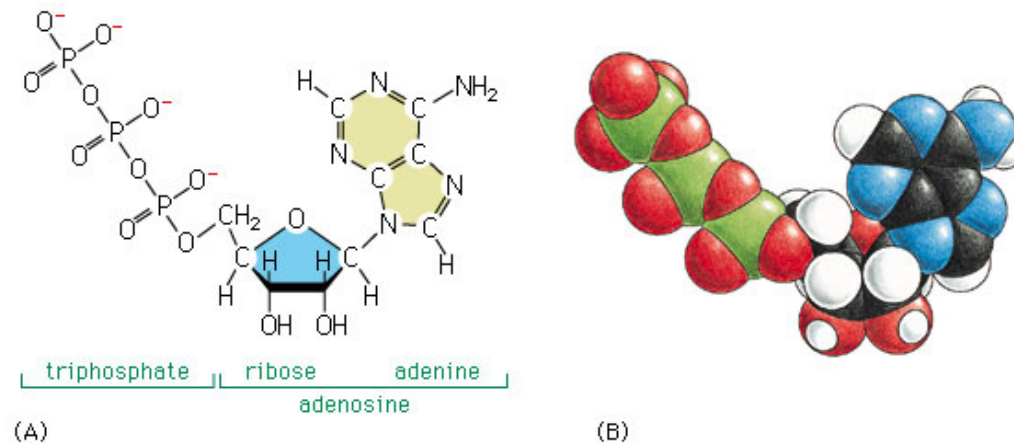
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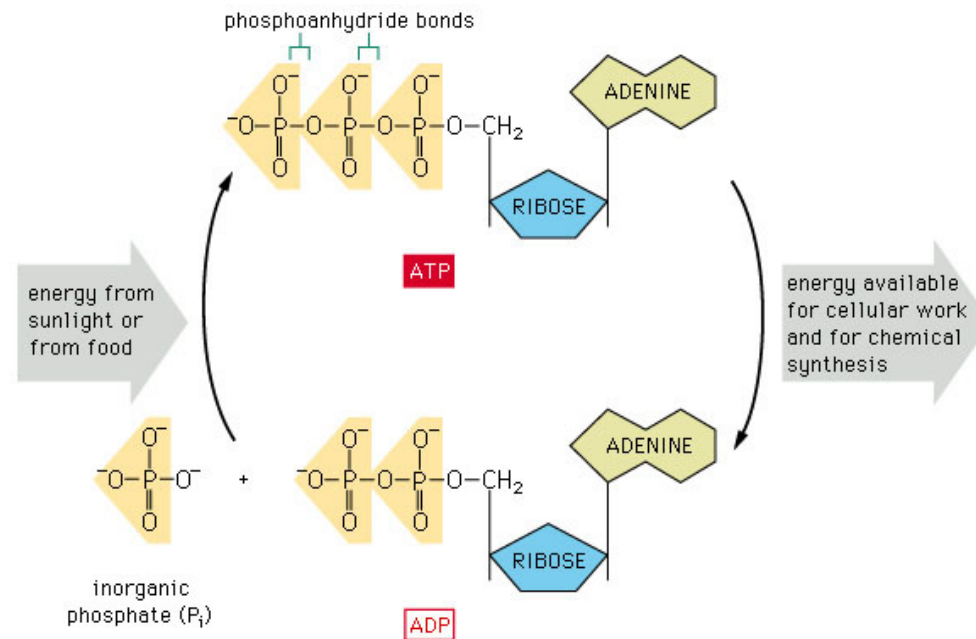
# Looking at two small molecules more in particular: Nucleotides of which DNA is made



But also many more small molecules  
among which, *e.g.*, one of special interest:  
**ATP: the energy carrier in the cell**



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## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**



## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT life is also chemistry**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT life is also chemistry**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT life is also chemistry**

**To conclude this (brief) introduction**  
**First, one more important information**

---

**DNA in a living cell is in a highly compacted and structured state**  
**Transcription is dependent on such structural state!**

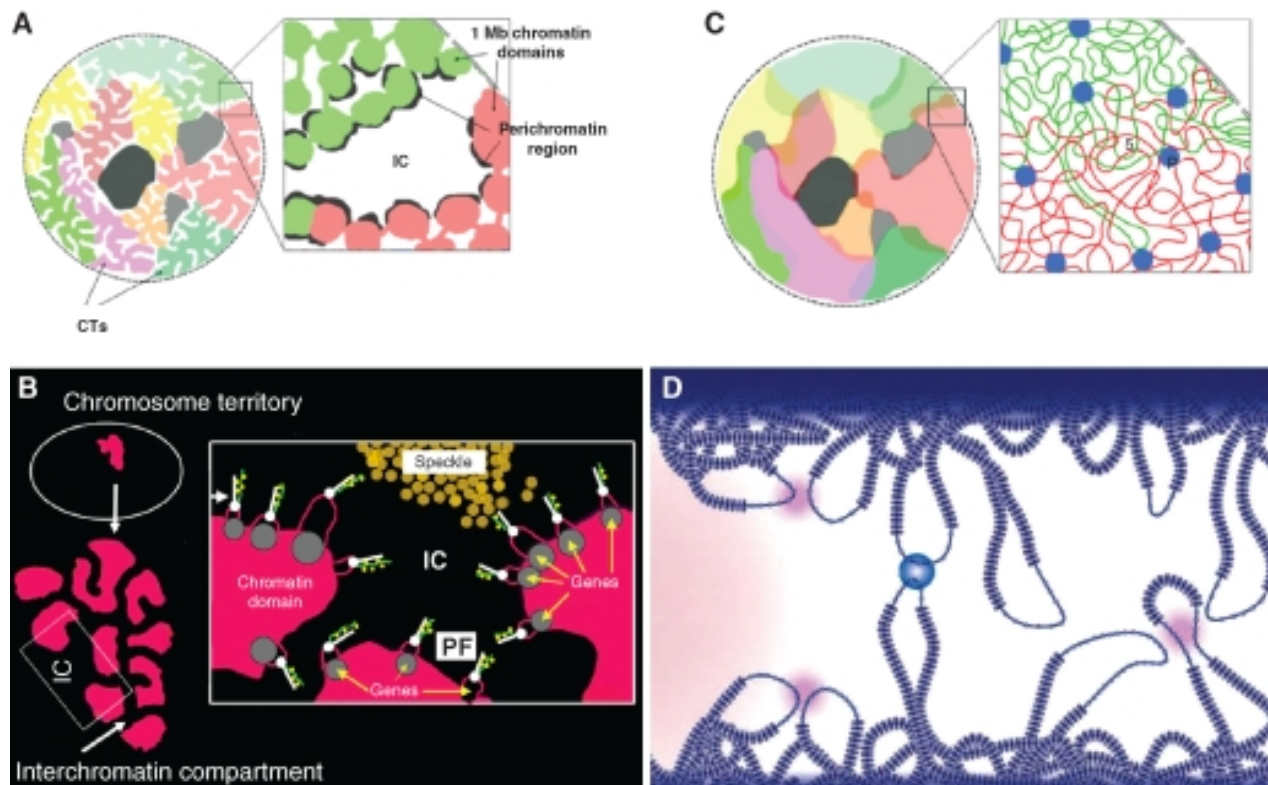
# To conclude this (brief) introduction

## First, one more important information

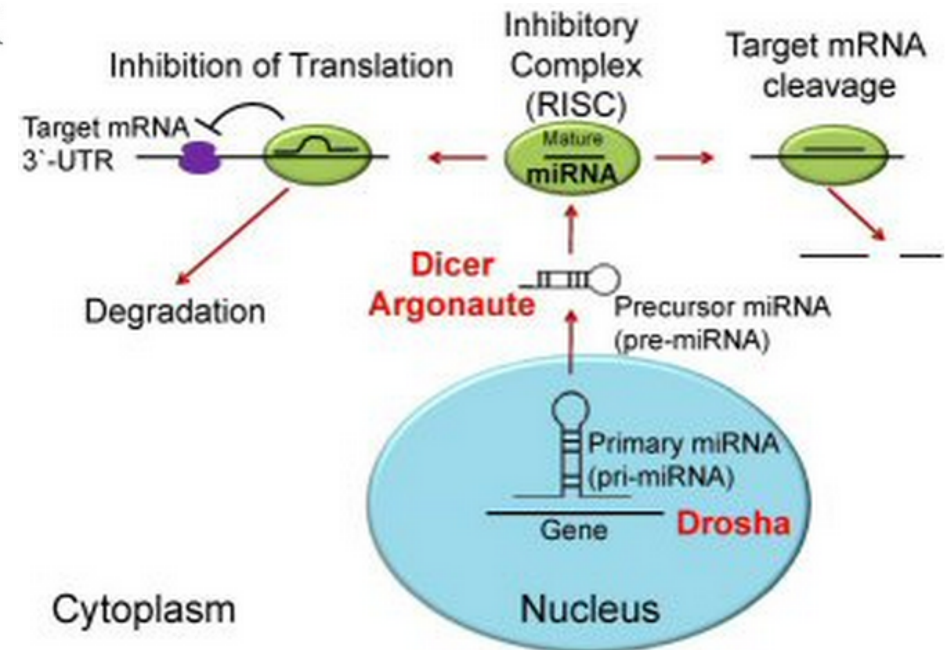
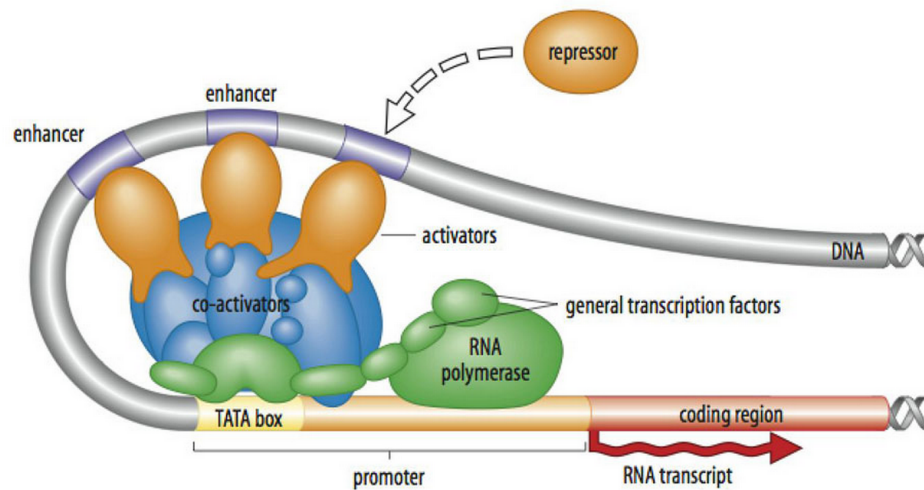
---

DNA in a living cell is in a highly compacted and structured state  
Transcription is dependent on such structural state!

Chromosomes are not like spaghetti inside the nucleus!



## And finally (perhaps the most important): Transcription and translation are REGULATED



## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

**BUT... (see later)**

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT (again)... (see later...)**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

**BUT (once more time)... (see later...)**

## Remember when I said

---

Nucleus / cytoplasm = library  
Chromosome(s) = bookshelves  
Genes = books

BUT... (see later)

Almost every cell in an organism contains the same libraries and the same sets of books

**BUT actually, every cell contains the same set of books (genes) indeed, but expressed in highly different ways!**

Books represent all the information (DNA) that each cell in the body needs so it can grow and carry out its various functions

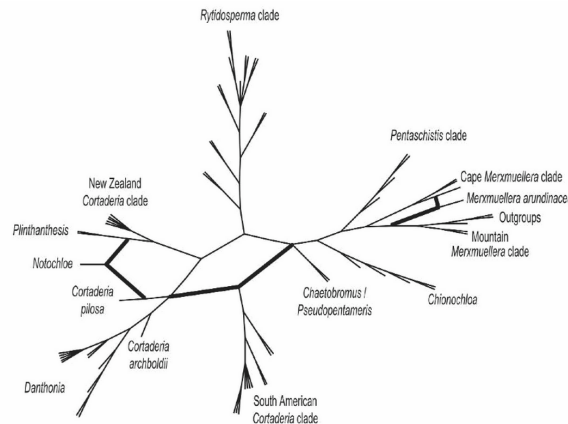
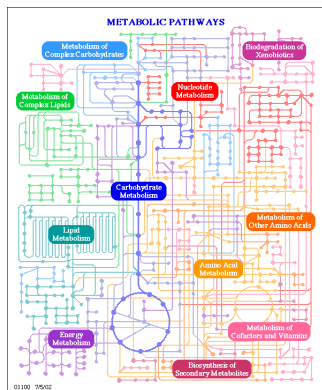
BUT (once more time)... (see later...)

The key abstract idea to retain for now however is:

**Interactions! Interactions everywhere!**

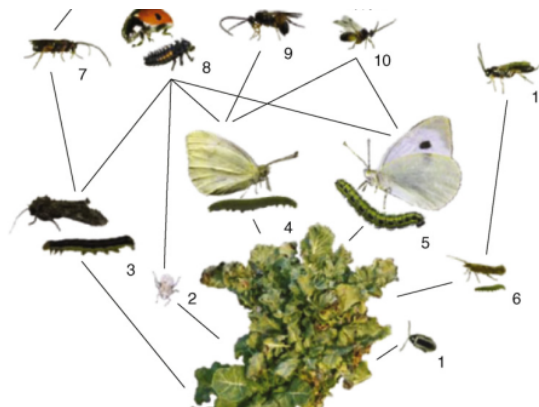
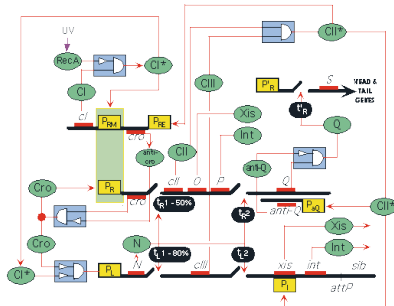
And so networks / graphs, as models or tools

Biochemical networks ...but also

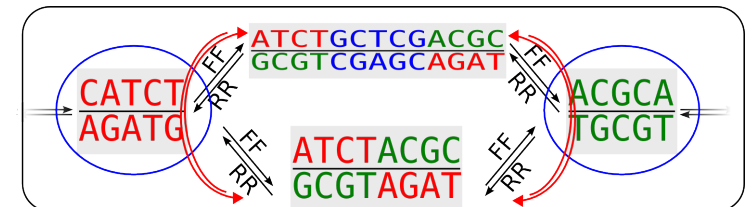


Evolutionary network

“Symbiotic” network



Ecological network



Besides graphs as ways of inferring information related to interactions



## **A few references for those curious to know more**

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**Molecular biology of the cell, Bruce Alberts & Alexander Johnson**

**What is life? Erwin Schrödinger**

**See also: [http://whatislife.stanford.edu/LoCo\\_files/What-is-Life.pdf](http://whatislife.stanford.edu/LoCo_files/What-is-Life.pdf)**

**The chemistry of life, Steve Rose**

**In French: La biologie buissonnière, Jacques Ninio**

**And many, many more**

**If interested in having more references, contact us!**