

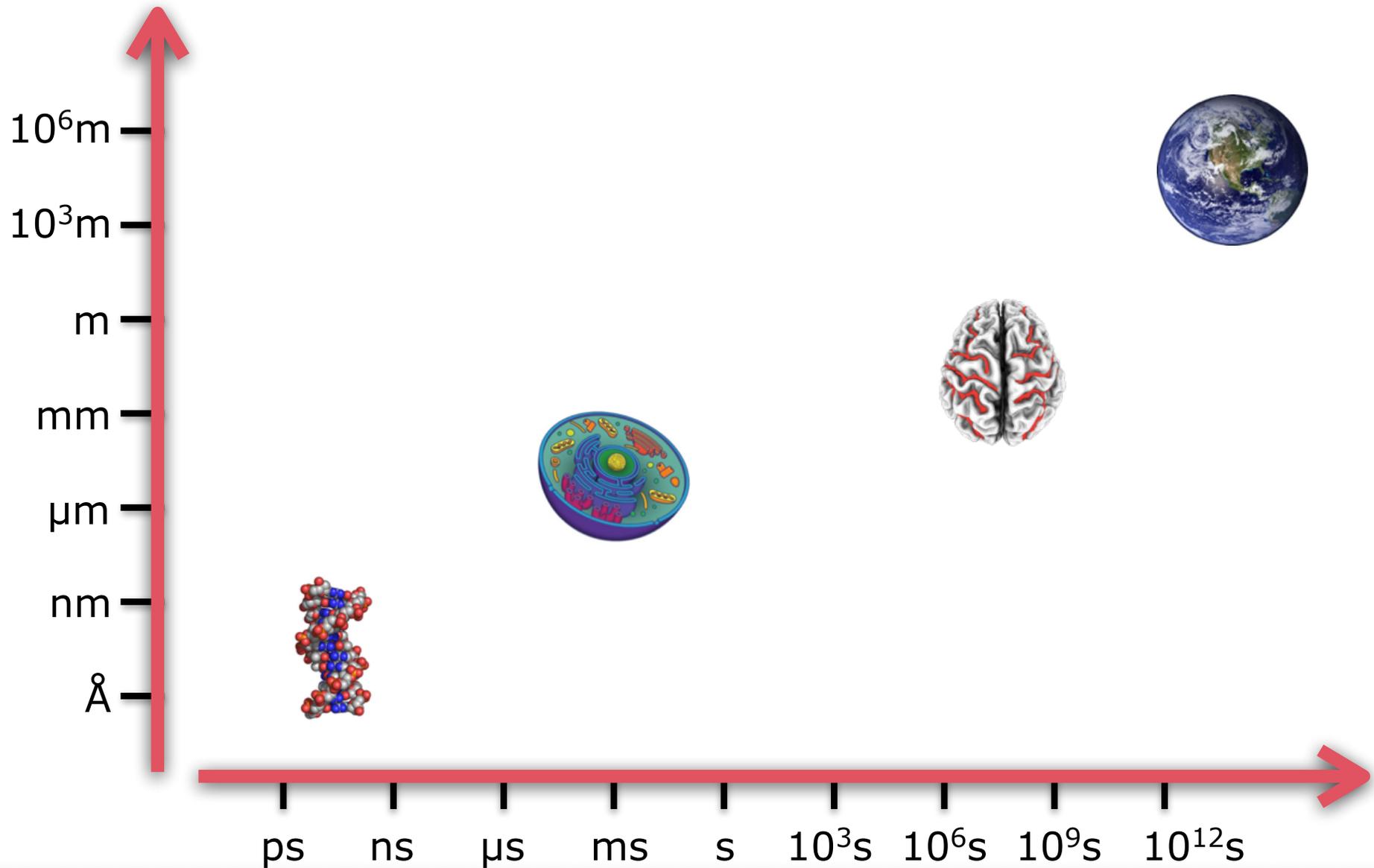
# Tutorial 1

# Geometry, Topology, and Biology

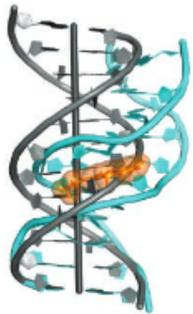
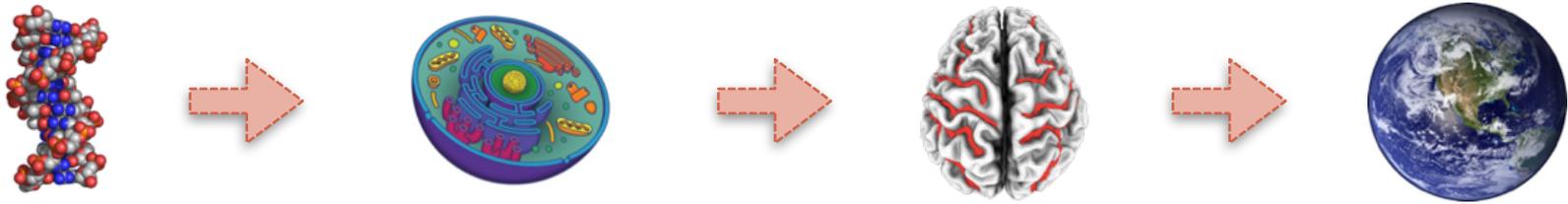
**Patrice Koehl and Joel Hass**

University of California, Davis, USA  
<http://www.cs.ucdavis.edu/~koehl/IMS2017/>

# Biology = Multiscale ....



# Biology = Quantitative Science ....



Acetylaminofluorene

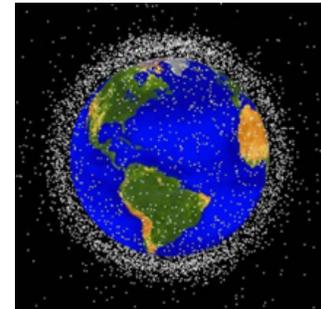
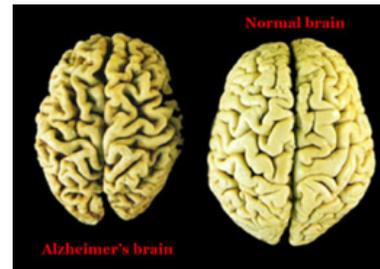


Normal Red Blood Cell

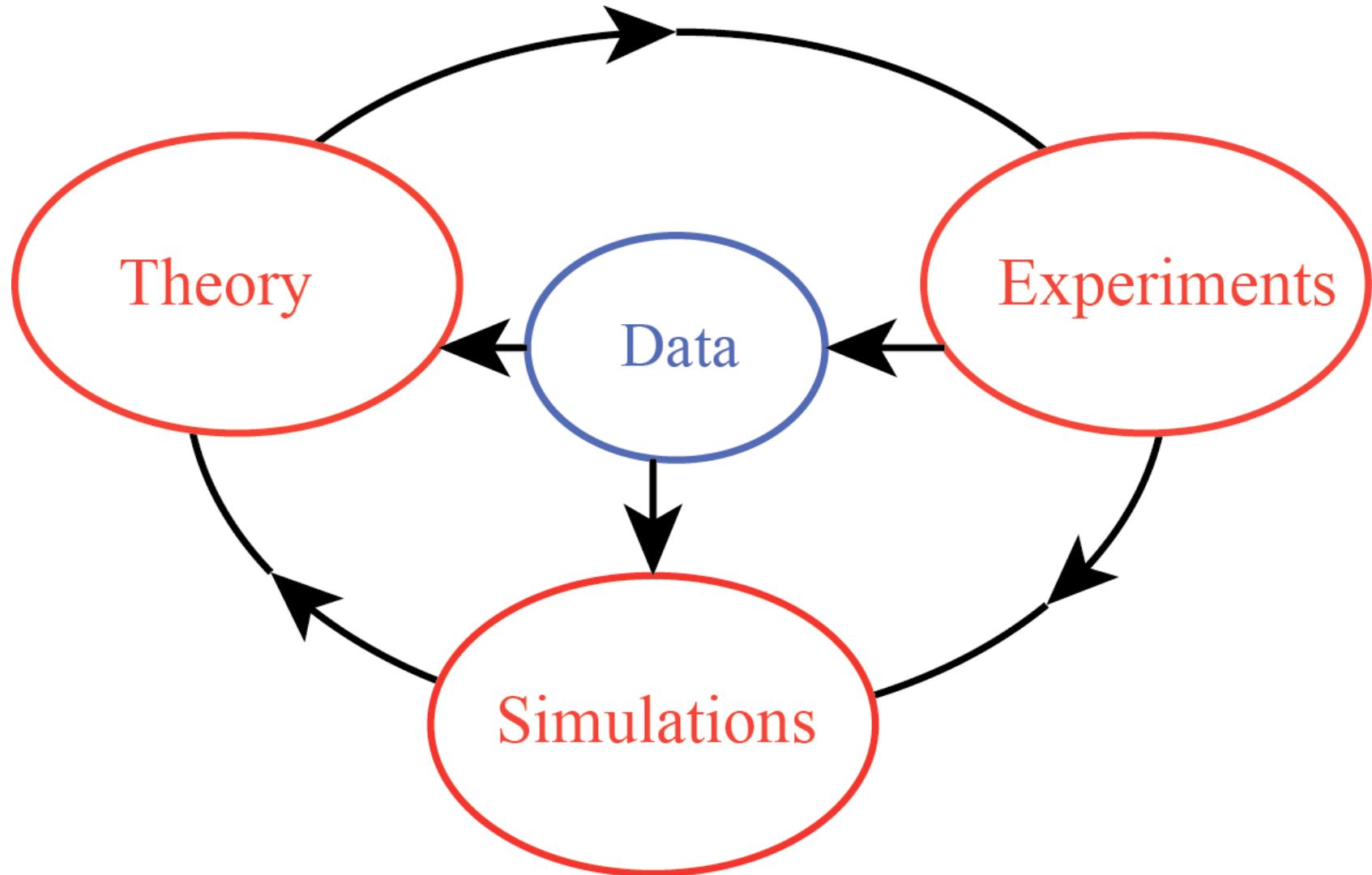


Sickle Cell

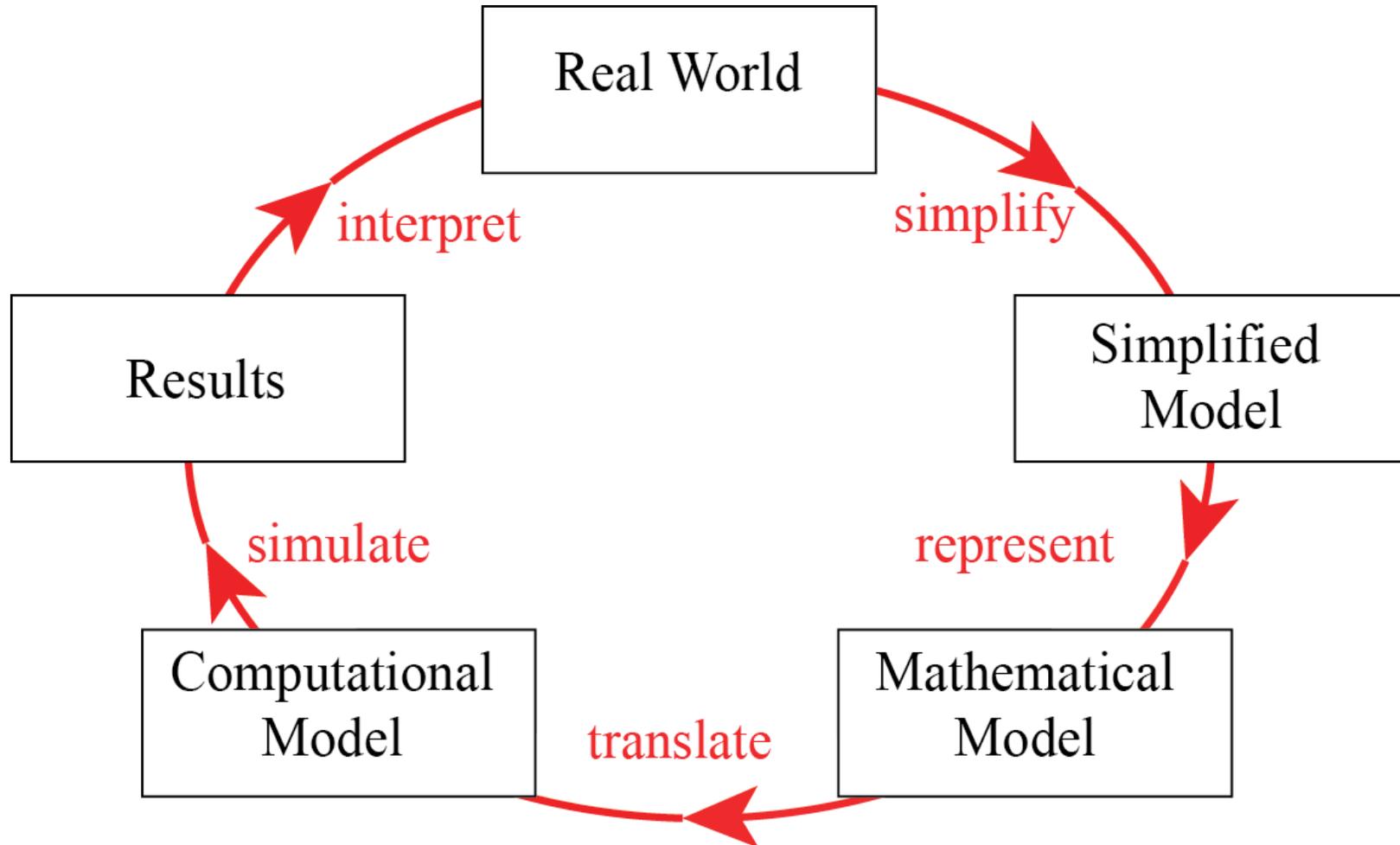
KidneyHealth - All rights reserved.



# Biology = Data Science ....

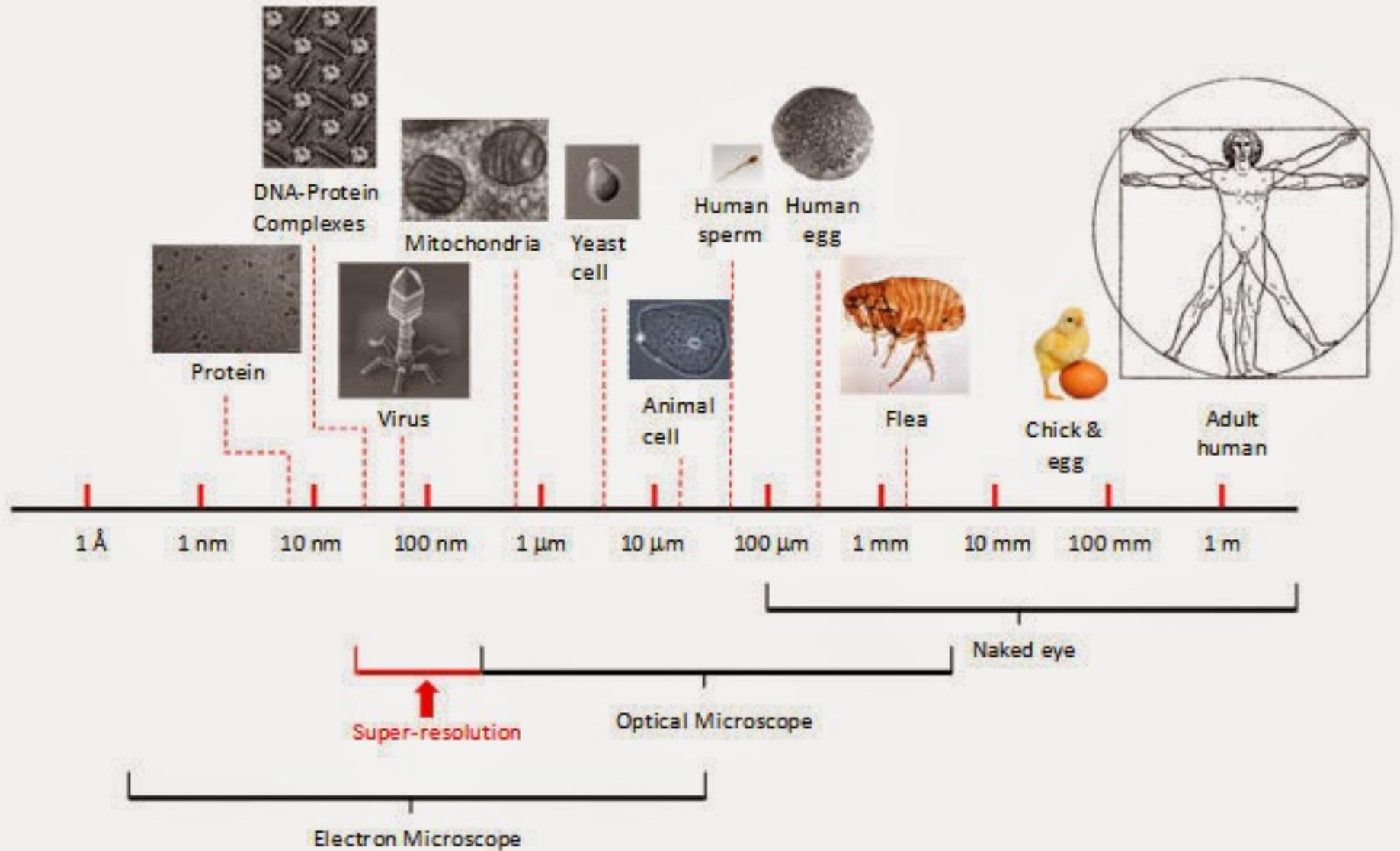


# Biology = Quantitative Science ....



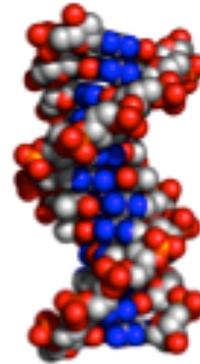
# Mathematical Modeling

- Is often used in place of experiments when they are *too large, too expensive, too dangerous, or too time consuming*.
- Can be useful in “what if” studies; e.g. to investigate the use of *pathogens* (viruses, bacteria) to control an insect population.
- Is a modern tool for *scientific investigation*.



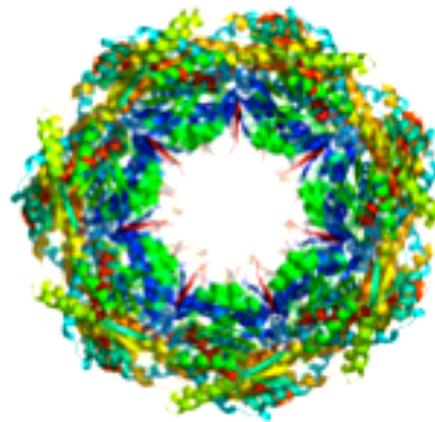
# The Cell

Blueprint: parts + design



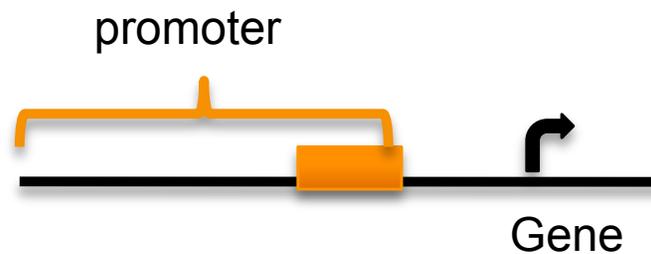
*DNA, genes*

Assembly



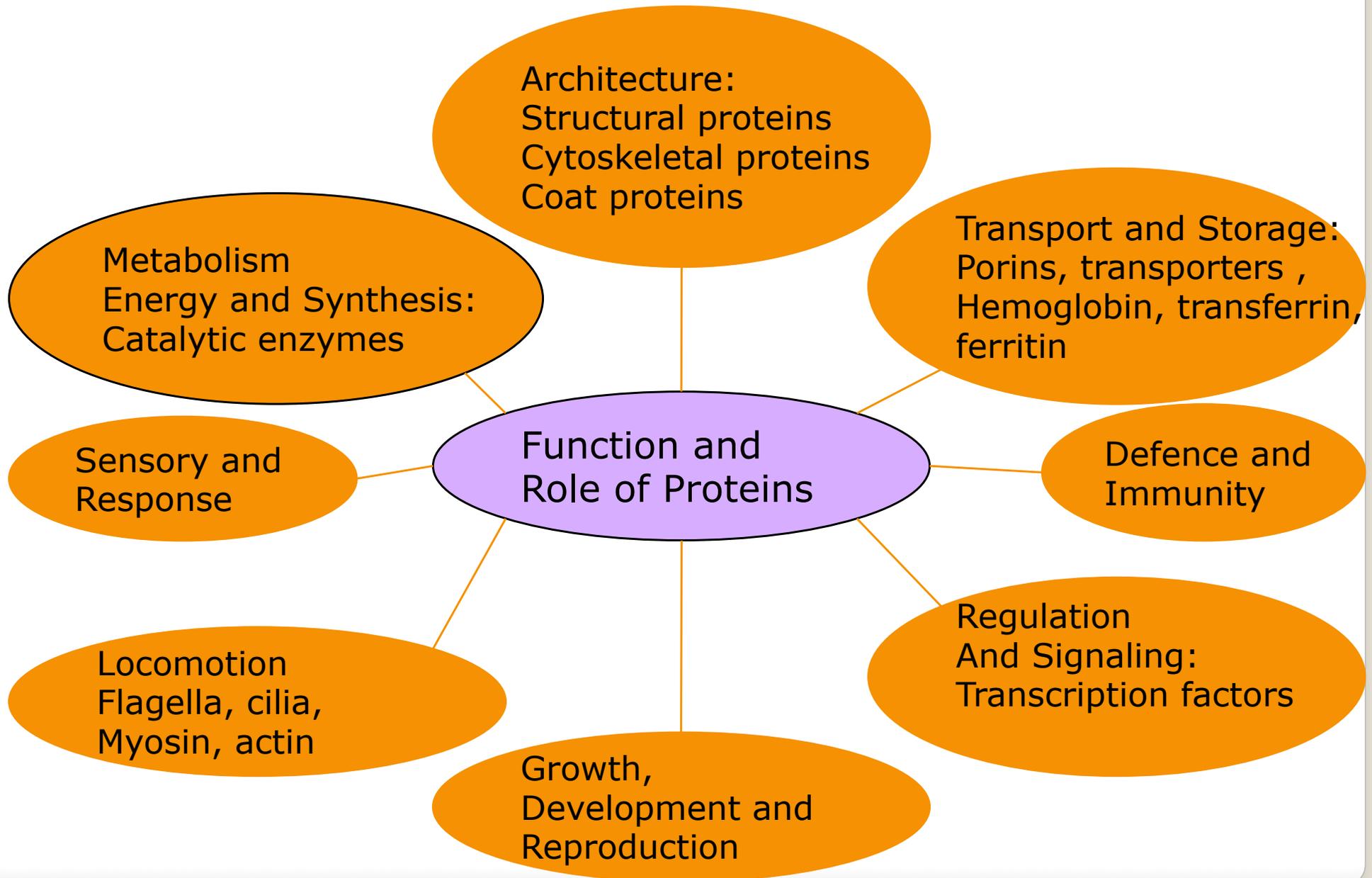
*Proteins,  
nanomachines*

Operation "manual"



*Processing:  
logic*

# Why Proteins?



# Protein Structure

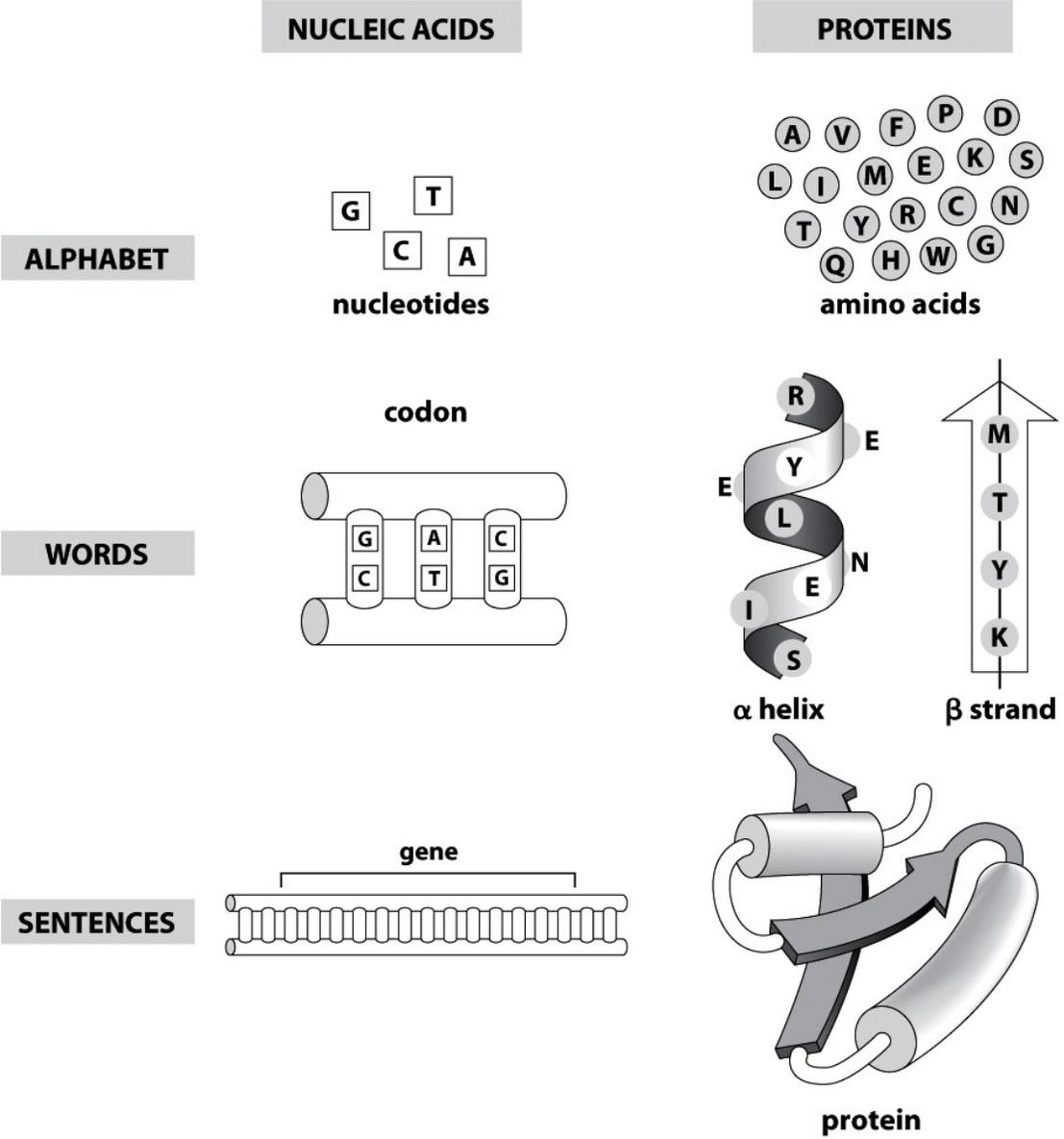


Figure 1.2 Physical Biology of the Cell (© Garland Science 2009)

# Observing biomolecules

*Methods for finding the 3D structure of a biomolecule:*

-X-ray crystallography

*(high resolution; finds structure of a protein in a crystal)*

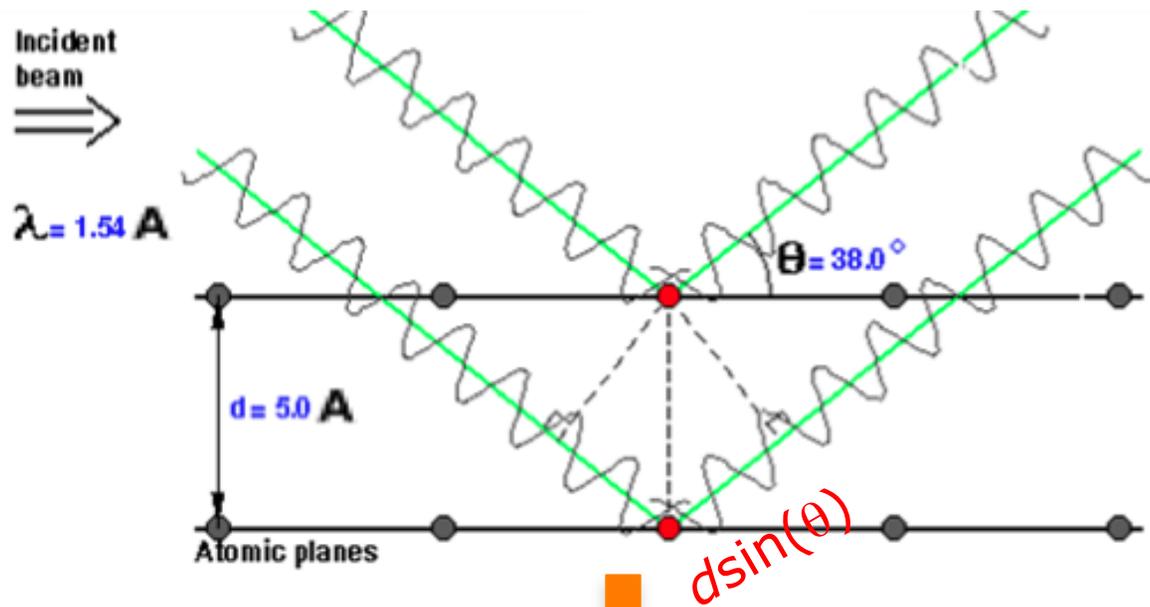
- NMR spectroscopy

*(high resolution; finds structure of a protein in solution)*

- Cryo EM

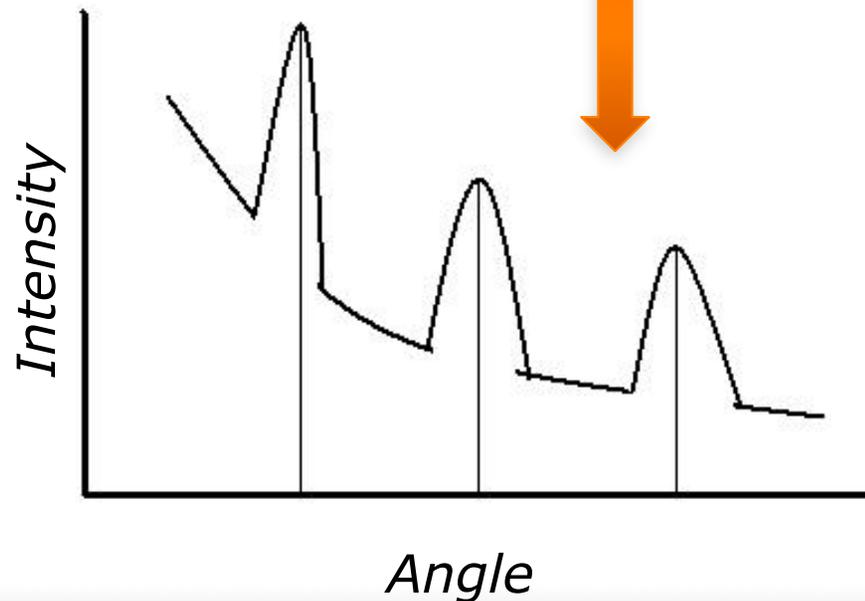
*(medium -high resolution; finds structure of large systems)*

# Proteins: X-ray Crystallography

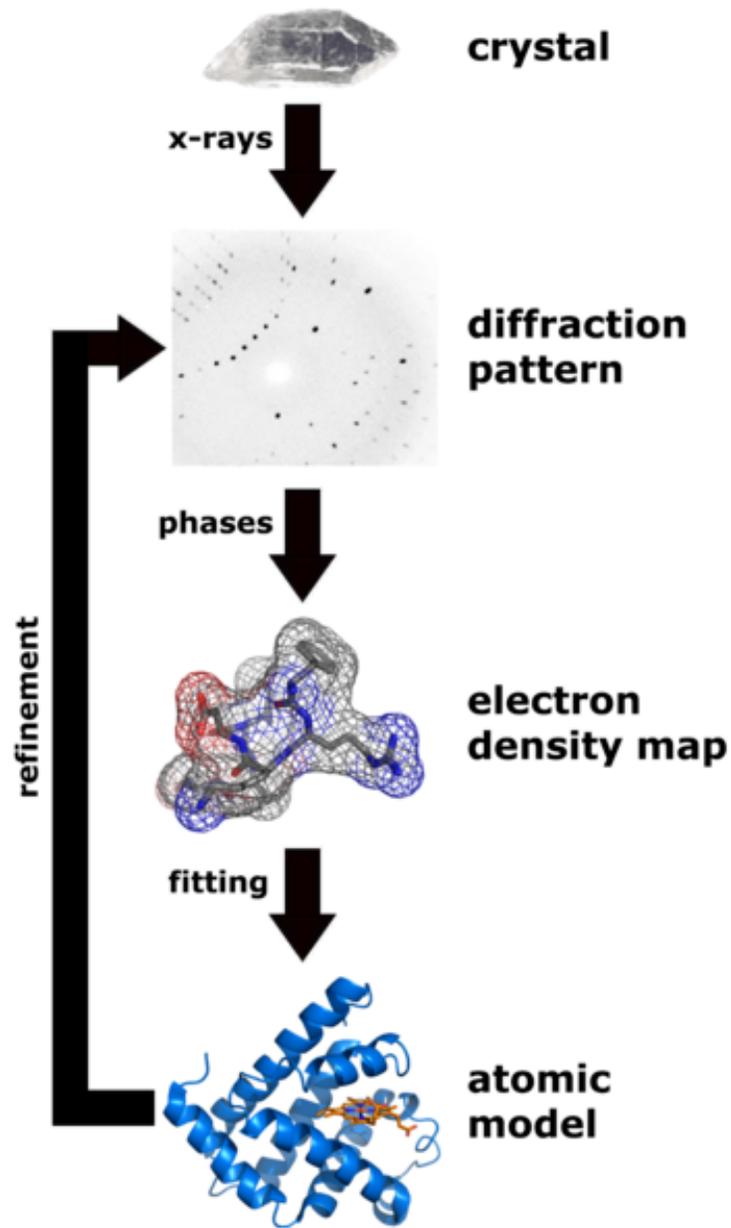


Bragg's Law:

$$2d \sin(\theta) = n\lambda$$



*From the "pattern of diffraction", i.e. the maximum of intensities observed, we can find the angles of diffraction and for each angle we get the corresponding  $d$  using Bragg's law*

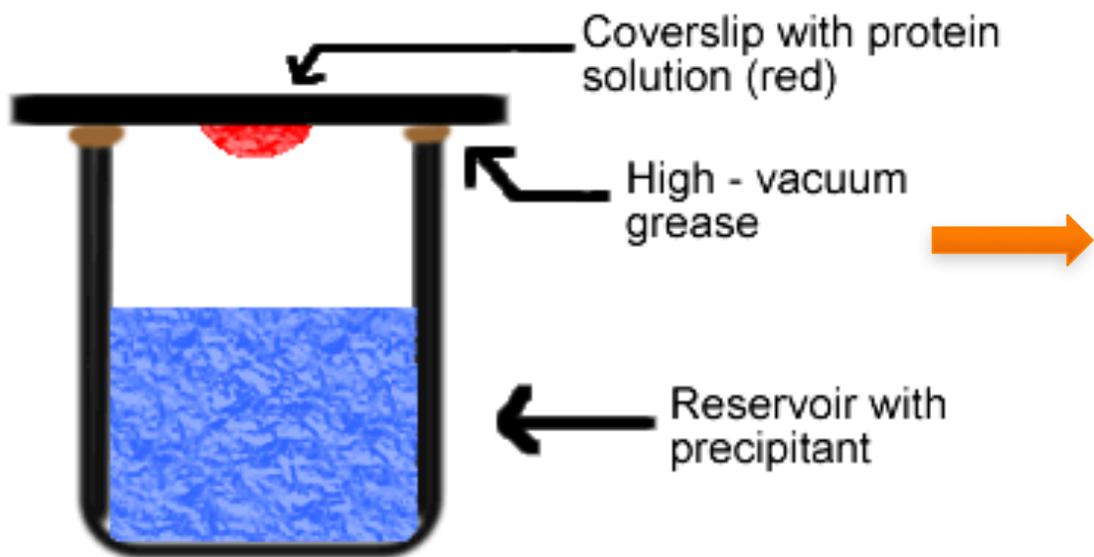


*General principle of X-ray crystallography applied to proteins:*

- 1) We need a crystal
- 2) From the diffraction pattern, we get the crystal organization
- 3) From the diffraction intensities, we get the electron densities
- 4) Once the electron density map we fit a structure that matches with this density
- 5) From the atomic model, we can compute a theoretical diffraction map; if it matches with the experimental one, we are done; otherwise refine

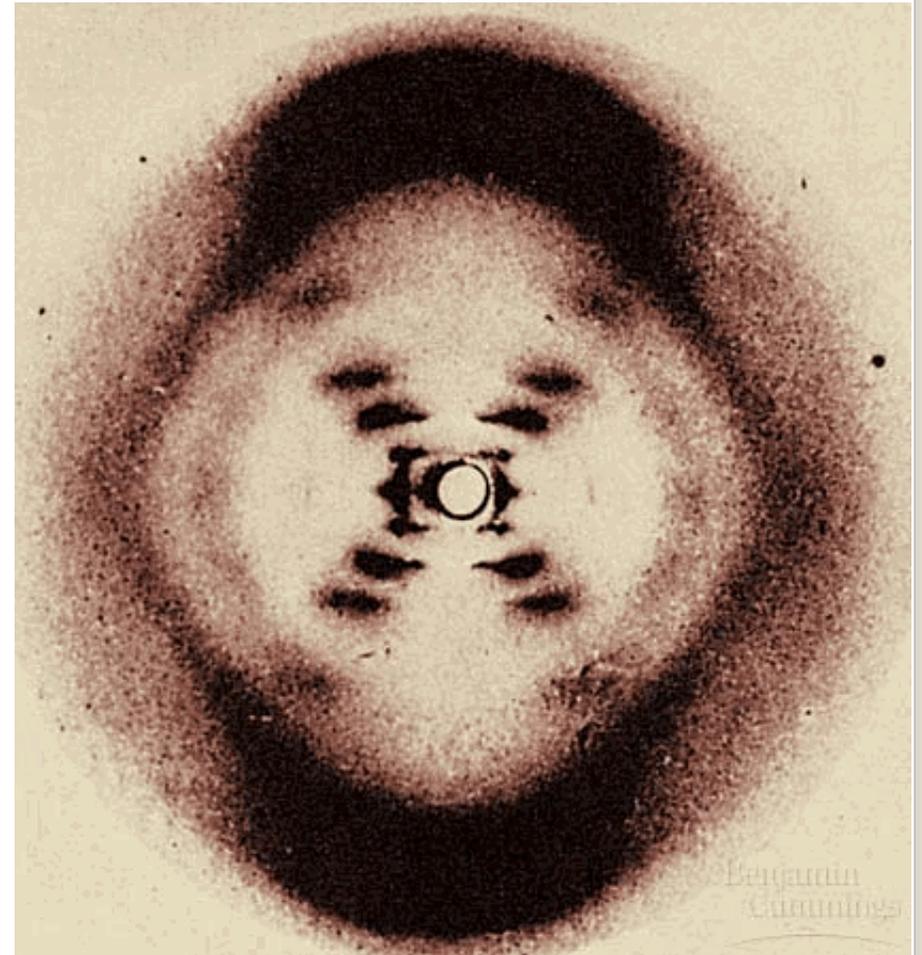
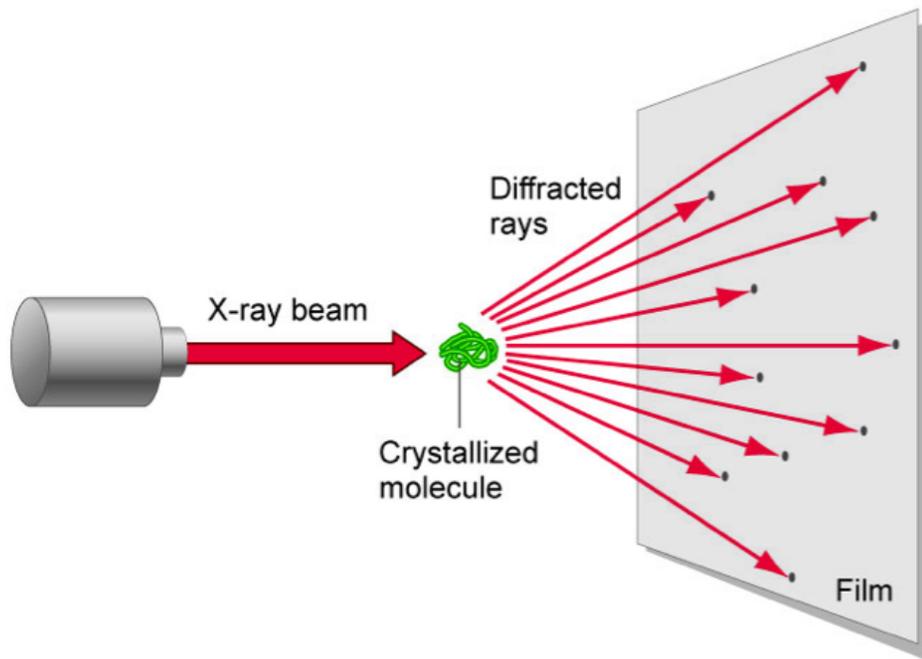
# Getting a crystal

The "hanging drop" method



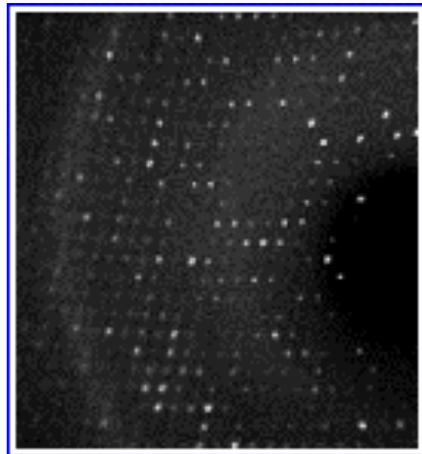
(<http://www.molbio1.princeton.edu/macro/about.html>)

# Getting the Diffraction Pattern

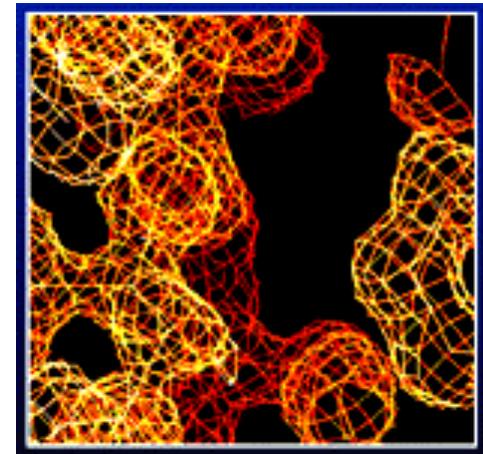
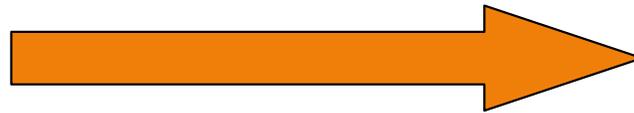


*Rosalyn Franklin:  
Diffraction pattern for DNA*

# From Diffraction to Electron Density Map

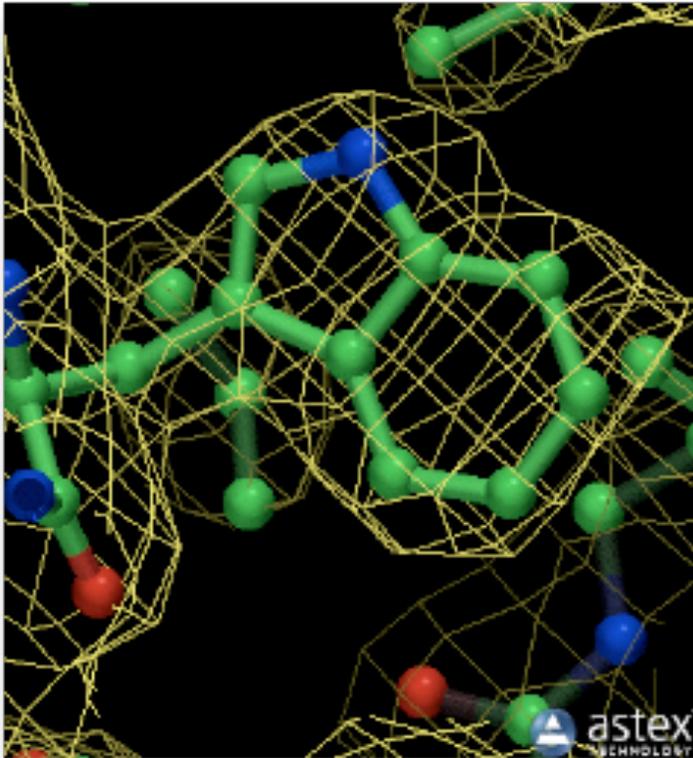


3D Fourier Transform

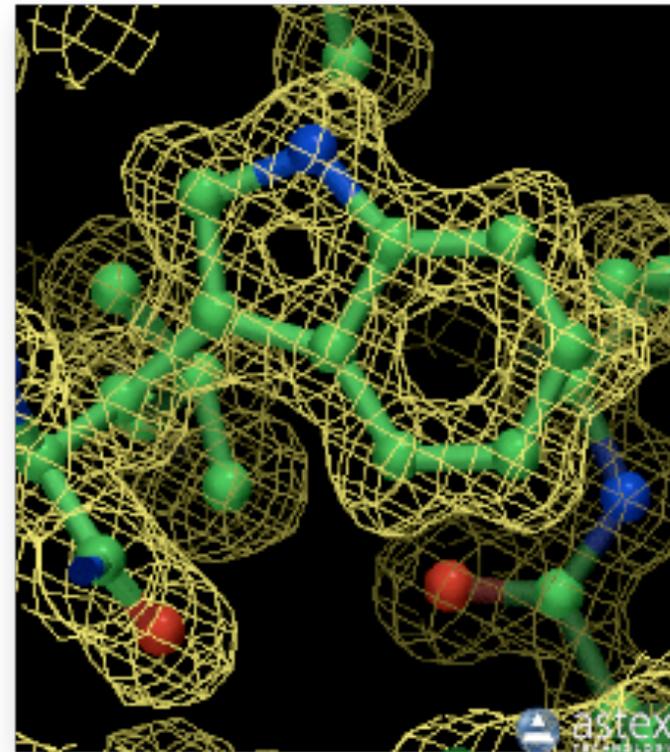


***One hidden problem:*** diffraction patterns provide intensities; for Fourier transform, need intensity and phase. A significant step in X-ray crystallography is the solve the “phase problem”.

# Fitting the structure: Influence of the resolution



2.6 Å resolution



1.2 Å resolution

# Resolution of X-ray structures

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## Resolution (Å)    Meaning

---

>4.0	Individual coordinates meaningless
3.0 - 4.0	Fold possibly correct, but errors are very likely.
2.5 - 3.0	Fold likely correct except that some surface loops might be mis-modelled.
2.0 - 3.0	Many small errors can normally be detected. Fold normally correct and number of errors in surface loops is small. Water molecules and small ligands become visible.
1.5 - 2.0	Many small errors can normally be detected. Folds are extremely rarely incorrect, even in surface loops.
0.5 - 1.5	In general, structures have almost no errors at this resolution. geometry studies are made from these structures.

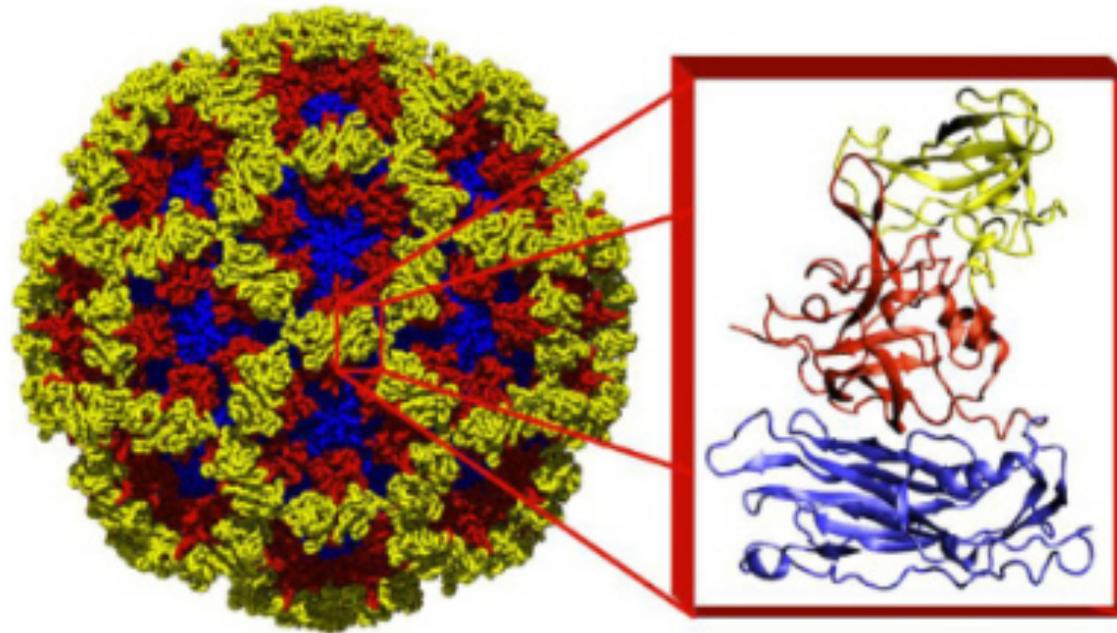
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*([http://en.wikipedia.org/wiki/Resolution\\_\(electron\\_density\)](http://en.wikipedia.org/wiki/Resolution_(electron_density)))*

# Large molecular assemblies: X-ray crystallography and Cryo-EM

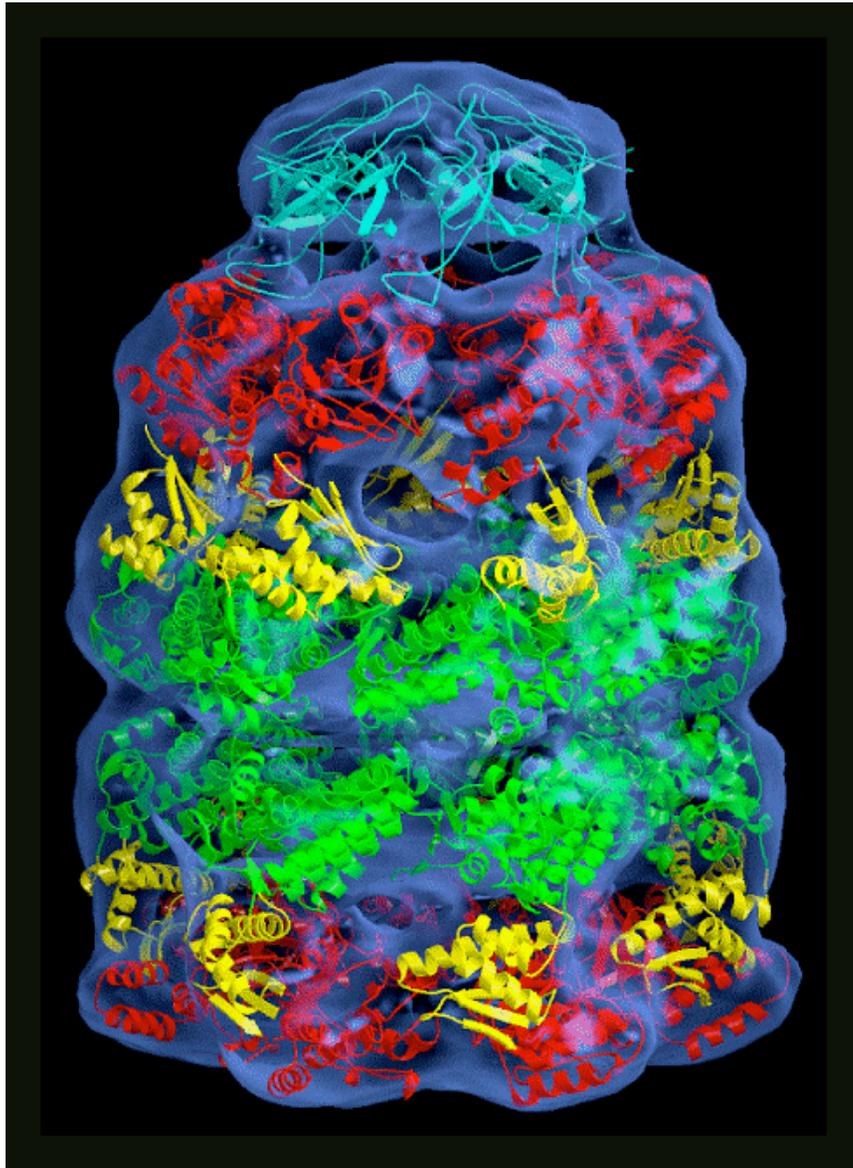
## ***X-ray structure***

(180 copies of  
the same protein)



(Norwalk virus: <http://www.bcm.edu/molvir/norovirus>)

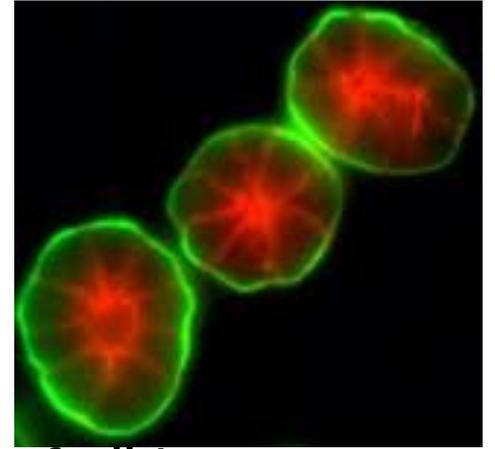
# Large molecular assemblies: X-ray crystallography and Cryo-EM



## ***Cryo-EM:***

- Microscopy technique; as such, do not need crystal (closer to physiological conditions)
- Not high-resolution enough to provide atomic details; used in combination with modeling

# The natural world of the cell



- The cell is the basic structural and functional unit of all known living organisms.
- The cell is the smallest unit of life
- The biological information contained in an organism is encoded in its DNA sequence
- Biological information encodes for diversity and function:  
**Information = Work**
- Cells are self-replicating: mother cell “generates” identical daughter cells



# The Cell

## 1. Quantum of life:

from 1 cell (bacteria), to  $10^{13}$  in a human

*(trivia: there are approx.  $10^{14}$  bacteria in our guts!*

*- we generate approx.  $10^{16}$  cells during our life time)*

## 2. Cells are “machines”:

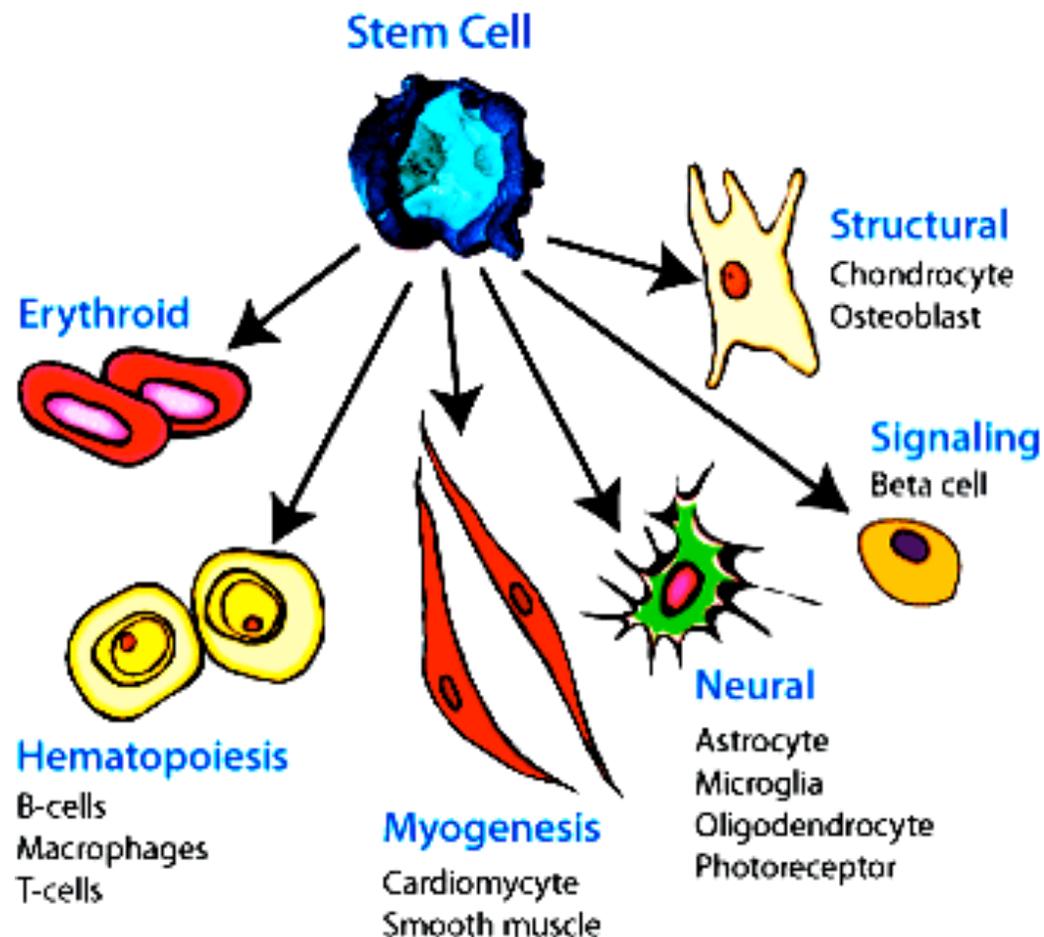
They can produce chemical or mechanical work. They take energy from their environment.

## 3. Cells self-replicate

## 4. Their blueprint is the DNA they contain

# The Cell

All cells of an organism contain the same information...however  
They may differ in aspect....and functions.



# Observing cells

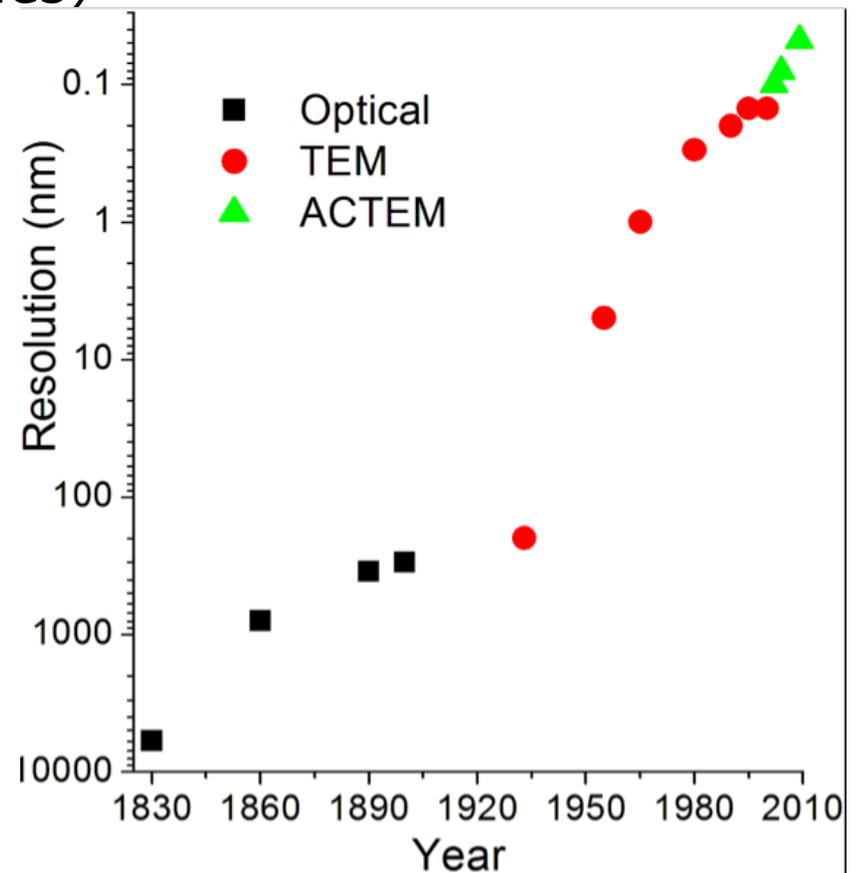
*Methods for finding the geometry of cells:*

- **Light microscopy**  
*(resolution 0.2  $\mu\text{m}$ ; see organelles)*
- **Fluorescence microscopy**  
*(see individual molecules inside the cells)*
- **Electron microscopy**  
*(high resolution)*

*Optical: light microscopy*

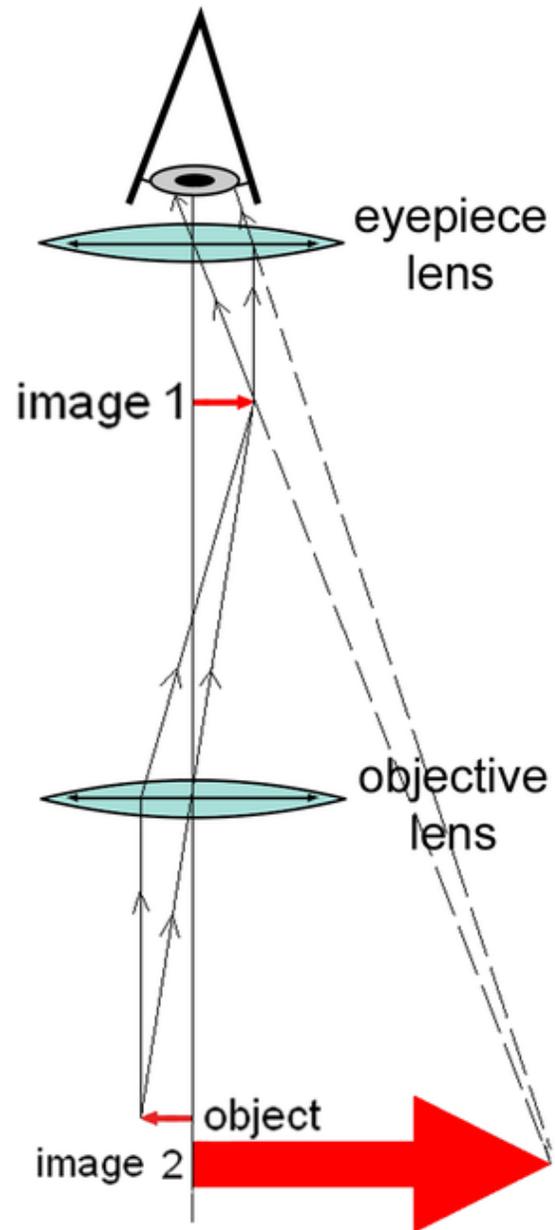
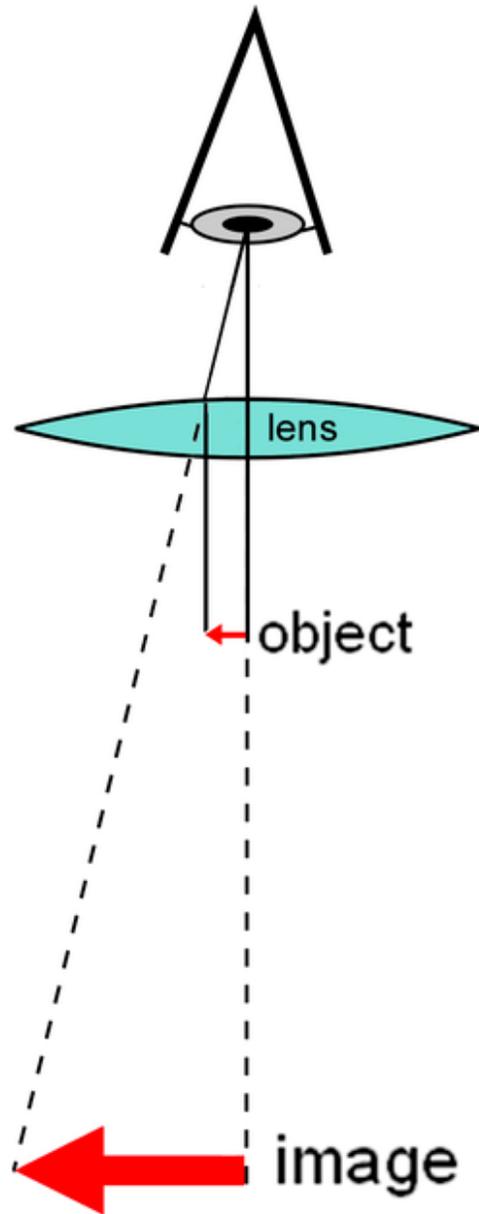
*TEM: Transmission EM*

*ACTEM: Aberration Corrected TEM*

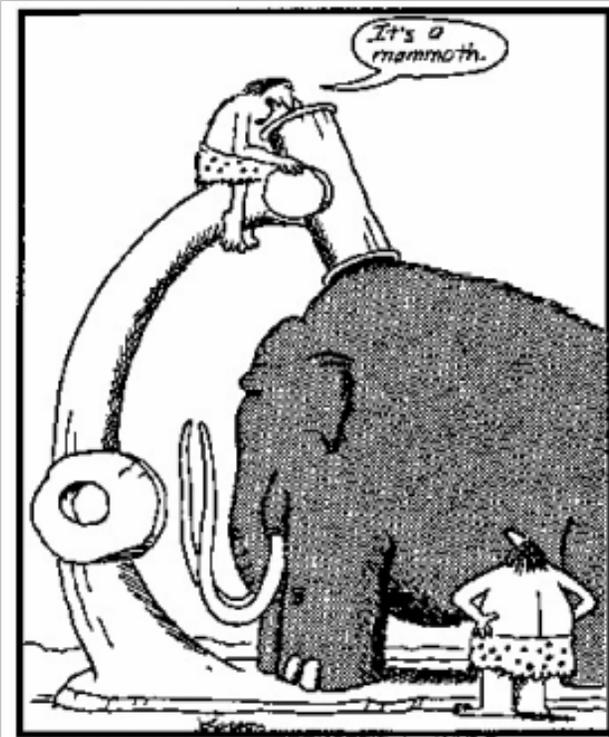


(from <https://en.wikipedia.org/wiki/Microscope>)

# Light Microscopes

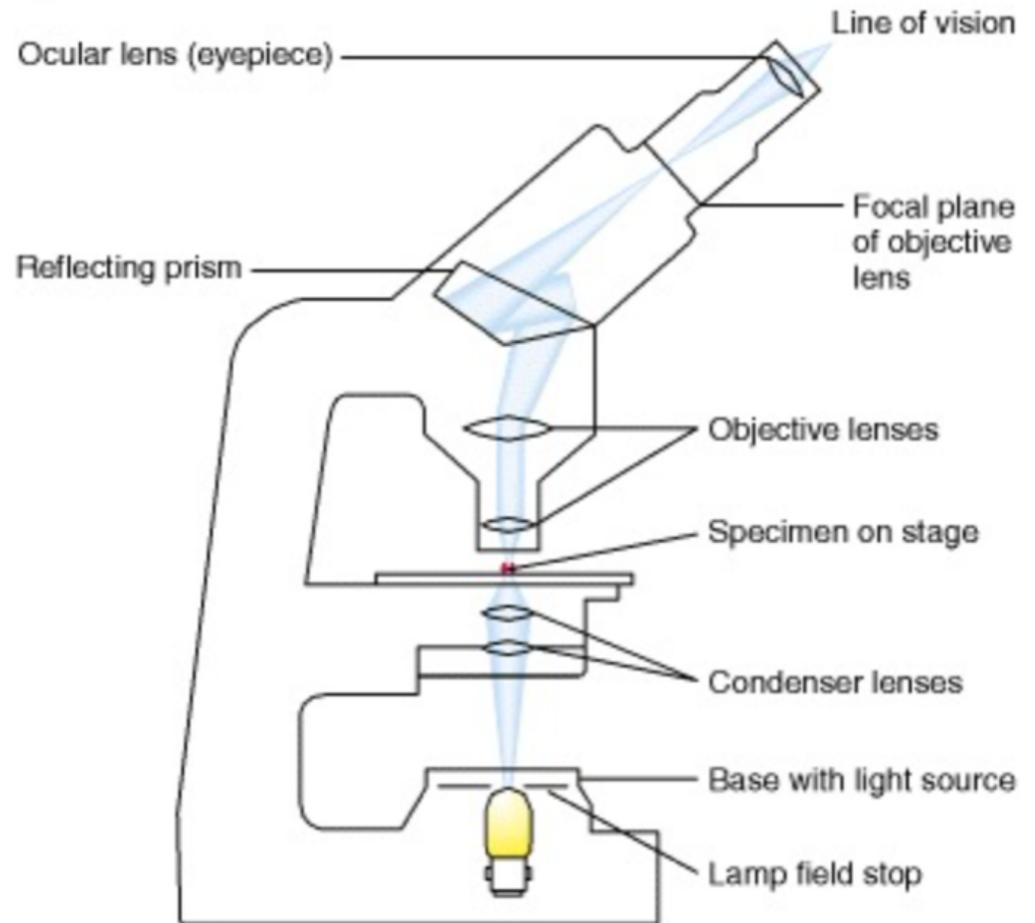


# Light Microscopes



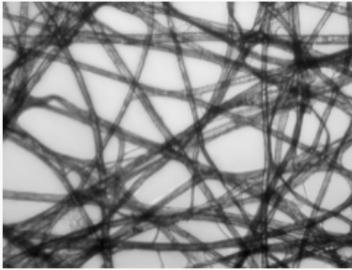
Early microscope

Gary Larson, "Far Side"

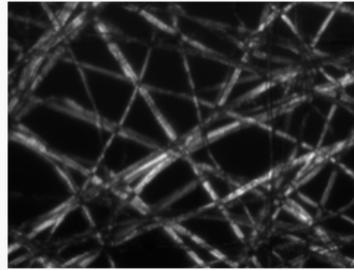


(from <https://www.ncbi.nlm.nih.gov/books/NBK21629/> )

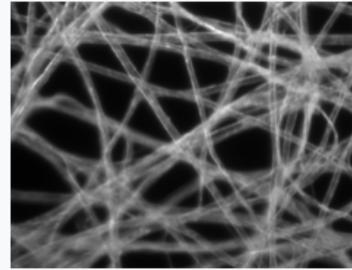
# Light Microscopes



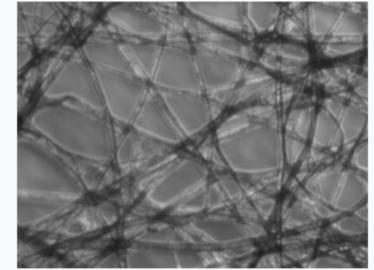
**Bright field** illumination, sample contrast comes from **absorbance** of light in the sample.



**Cross-polarized light** illumination, sample contrast comes from rotation of **polarized** light through the sample.



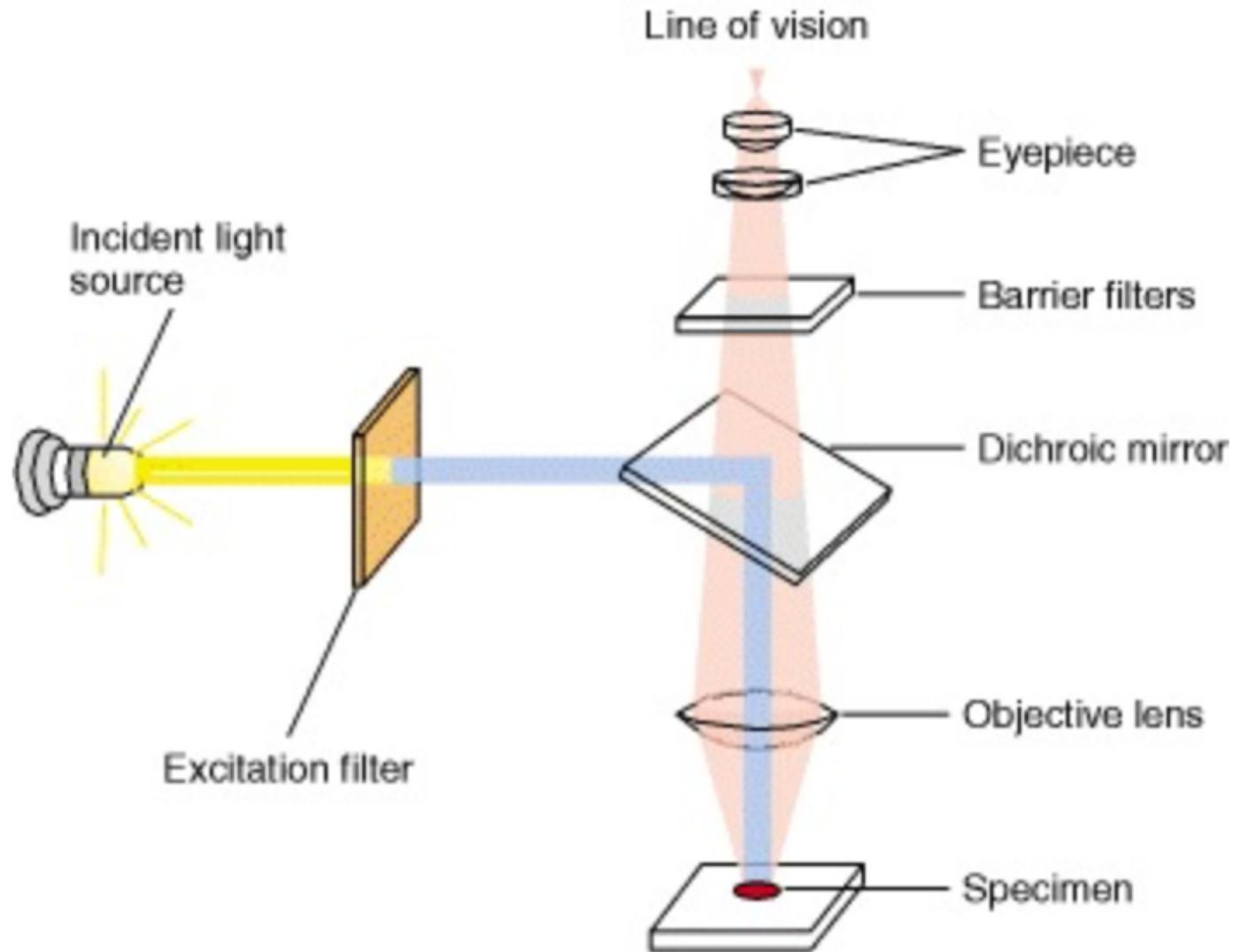
**Dark field** illumination, sample contrast comes from light **scattered** by the sample.



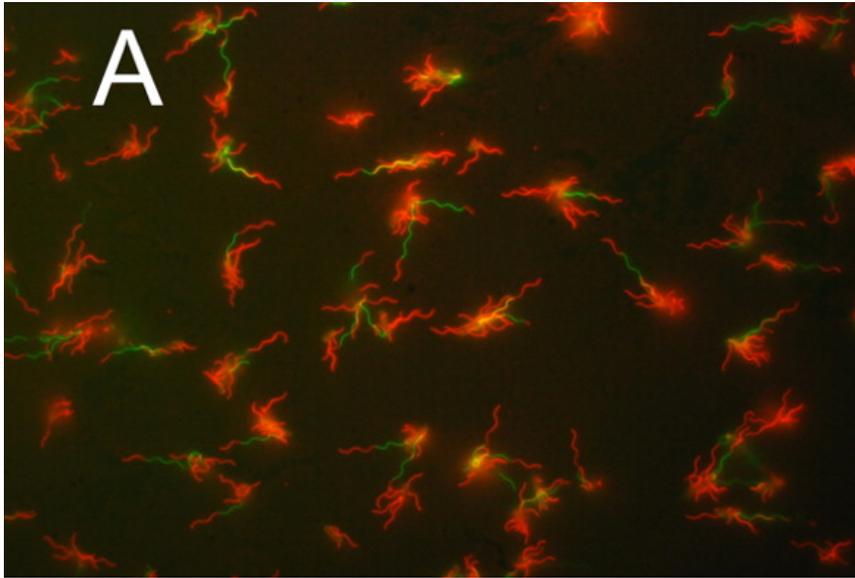
**Phase contrast** illumination, sample contrast comes from **interference** of different path lengths of light through the sample.

(from <https://en.wikipedia.org/wiki/Microscopy> )

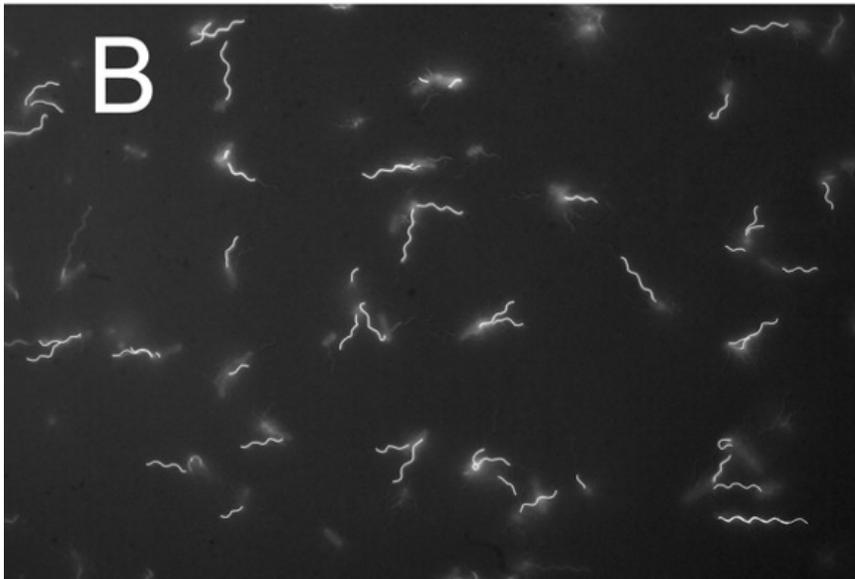
# Fluorescence Microscopy



(from <https://www.ncbi.nlm.nih.gov/books/NBK21629/> )



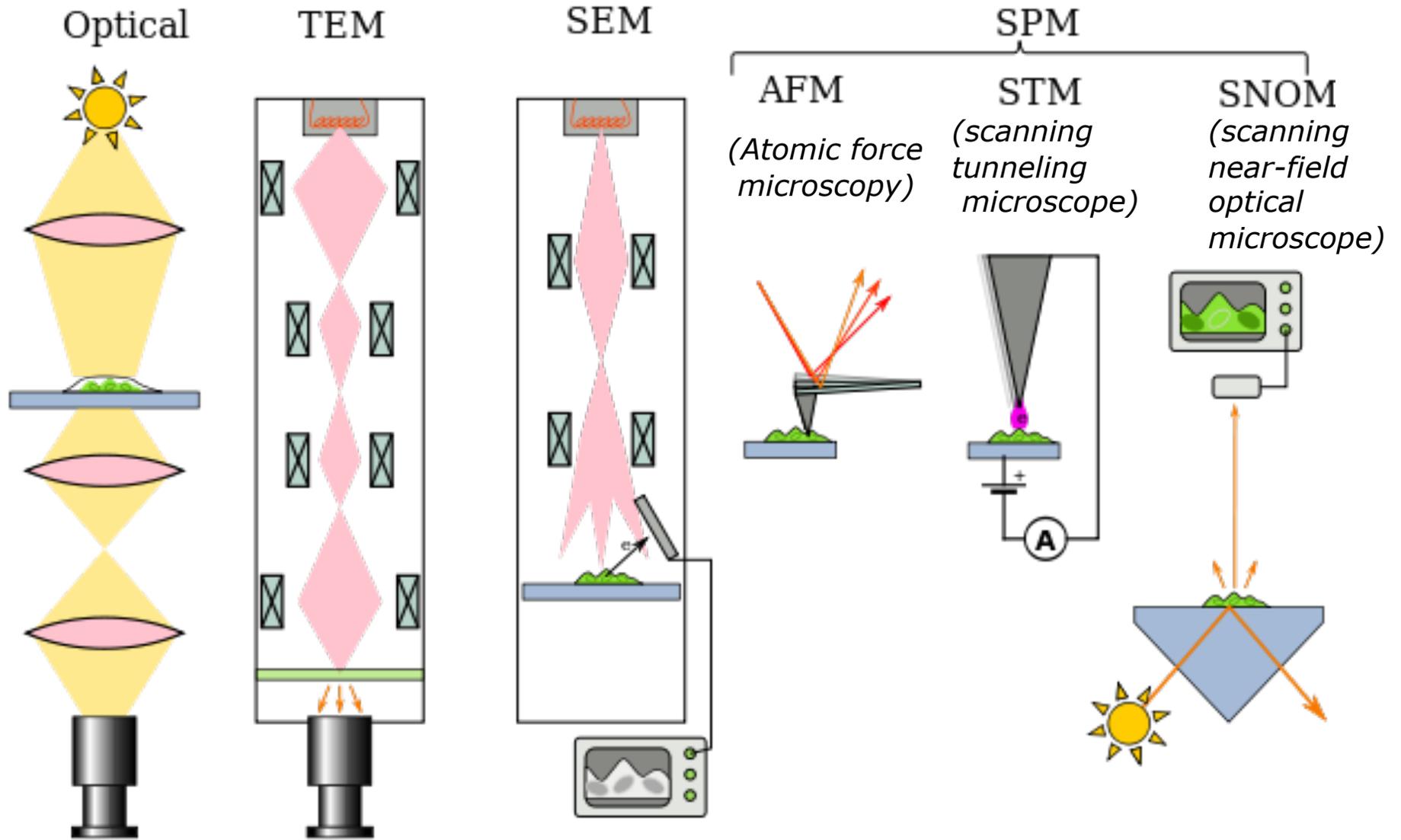
*Flagellar filament (green)  
from Ecoli (red)*



*Same image, with green shown  
in white and other colors in black*

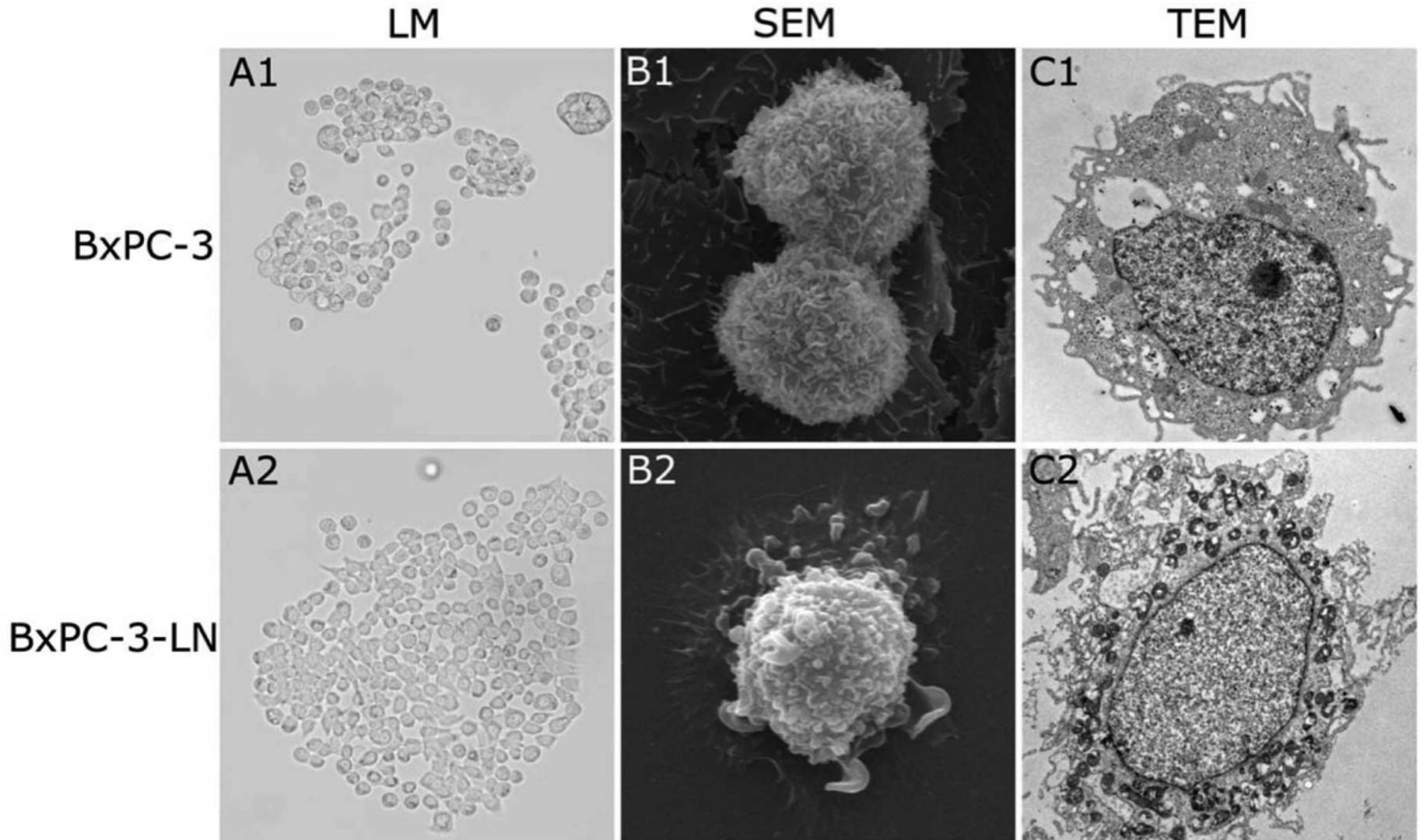
(from <http://jb.asm.org/content/194/10/2437/F1.expansion.html> )

# Microscopes



(from <https://en.wikipedia.org/wiki/Microscope>)

# Differences between Light Microscopes and Electron Microscopes



(from <https://www.spandidos-publications.com/10.3892/ijo.2012.1613> )

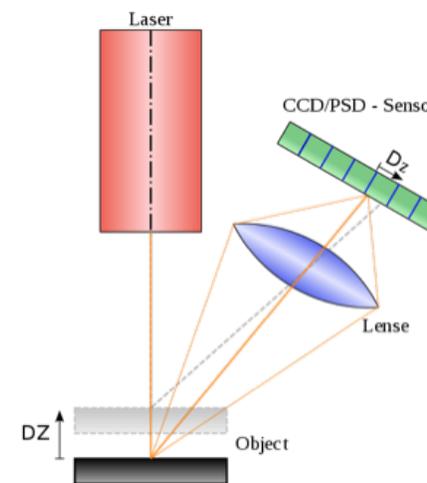
# Imaging larger objects: scanners

## 1) Surface scanners

### A) Contact scanners



### B) Laser scanner: time of flight



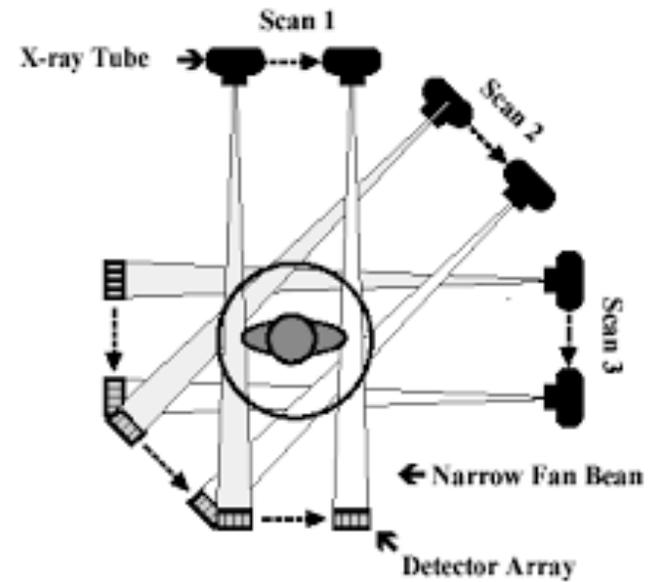
### C) Laser scanner: triangulation

(from [https://en.wikipedia.org/wiki/3D\\_scanner](https://en.wikipedia.org/wiki/3D_scanner) )

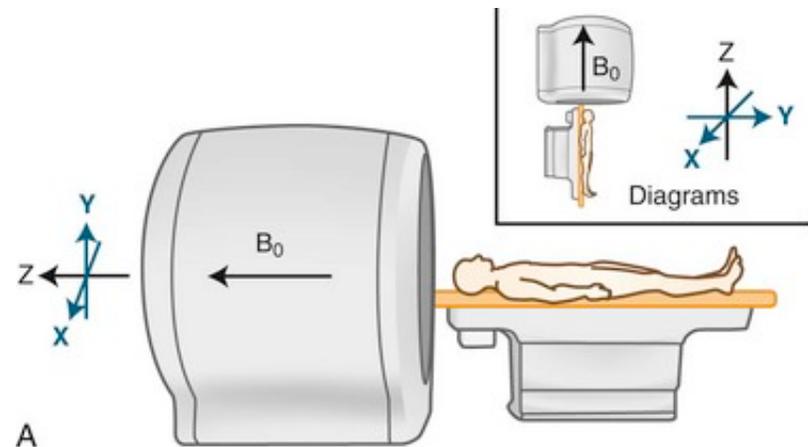
# Imaging larger objects: scanners

## 1) Volumetric Scanners

*X-ray computer tomography  
(CT scanners)*



*Magnetic Resonance  
Imaging (MRI)*



# Geometry and Topology in Biology

1) Phylogenetic trees

2) Geometry of Biomolecules

3) Morphometrics

# Geometry and Topology in Biology

1) Phylogenetic trees

2) Geometry of Biomolecules

3) Morphometrics

# Similarity: Homology vs Analogy

**Homology:** Similarity in characteristics resulting from shared ancestry.

**Analogy:** The similarity of characteristics between two species that are not closely related; attributable to convergent evolution.

*Similar due to  
inheritance*



**Two sisters: homologs**

*Similar due to...  
uh...other factors*



**Two "Elvis": analogs**

# Homology: Orthologs and Paralogs

## **Homology:**

Similarity in characteristics resulting from shared ancestry.

## **Paralogy:**

Homologous sequences are paralogous if they were separated by a gene duplication event

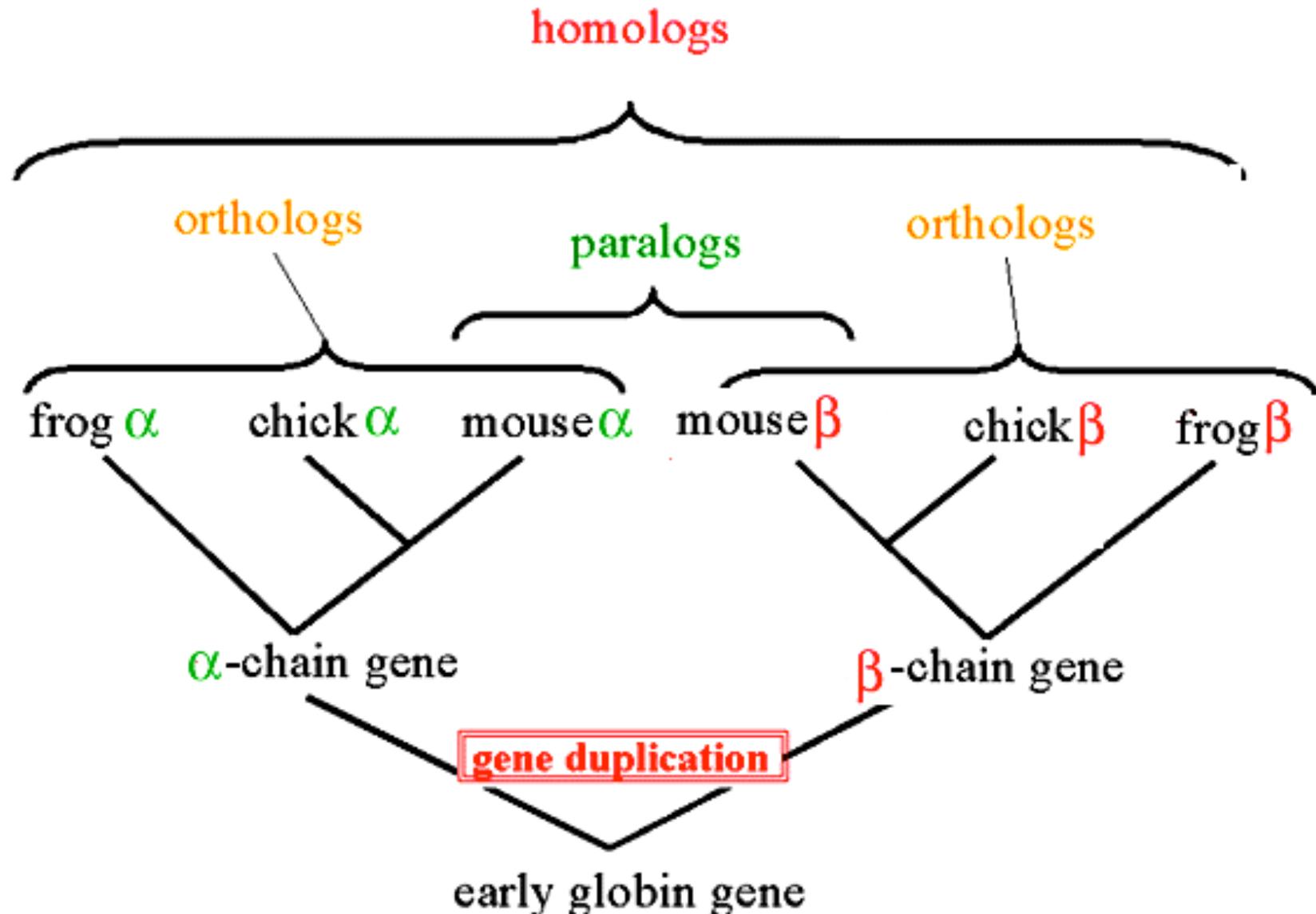
## **Orthology:**

Homologous sequences are orthologous if they were separated by a speciation event

## ***Further reading:***

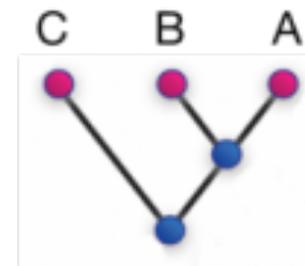
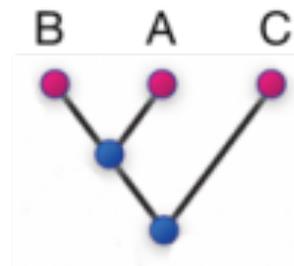
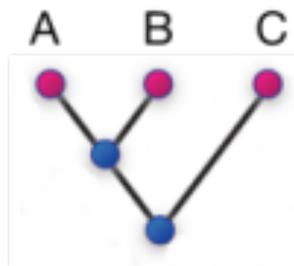
*Koonin EV (2005). "Orthologs, paralogs, and evolutionary genomics". Annu. Rev. Genet. 39:309-338.*

# Homology: Orthologs and Paralogs

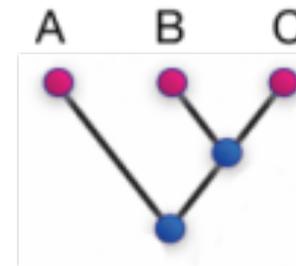
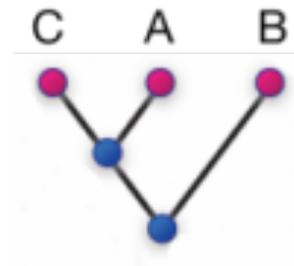
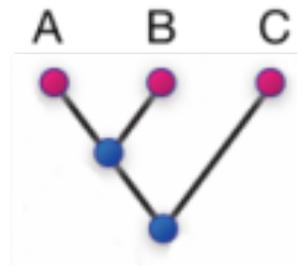




These trees display the same topology



These trees display different topologies



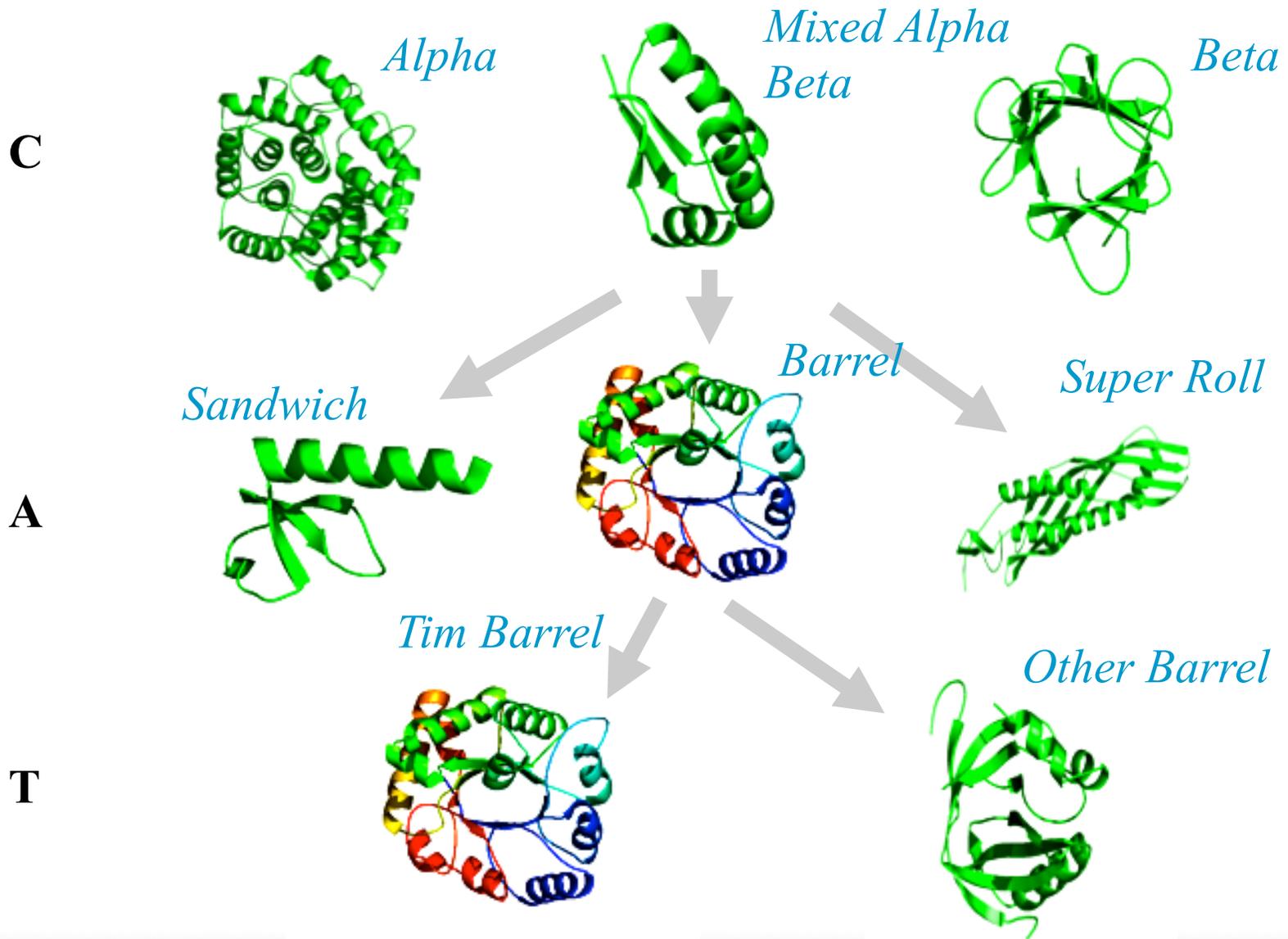
# Geometry and Topology in Biology

1) Phylogenetic trees

2) Geometry of Biomolecules

3) Morphometrics

# Protein Structures



# Protein Structure Space

$$D = \begin{bmatrix} 0 & \dots & d_{1N} \\ \dots & 0 & \dots \\ d_{N1} & \dots & 0 \end{bmatrix} \longrightarrow G = X^T X \longrightarrow X$$

*Distance Matrix*

*Metric Matrix*

*Points in Space*

# Protein Structure Comparison

Given two “shapes” or structures A and B, we are interested in defining a distance, or similarity measure between A and B.

- *Visual comparison*
- *Dihedral angle comparison*
- *Distance matrix*
- *RMSD (root mean square distance)*

Is the resulting distance (similarity measure) D a metric?

$$\mathbf{D(A,B) \leq D(A,C) + D(C,B)}$$

# Protein Structure Comparison

*To compare two sets of points (atoms)  $A=\{a_1, a_2, \dots, a_N\}$  and  $B=\{b_1, b_2, \dots, b_N\}$ :*

**-Define a 1-to-1 correspondence between A and B**

for example,  $a_i$  corresponds to  $b_i$ , for all  $i$  in  $[1, N]$

**-Compute RMS as:**

$$RMS(A, B) = \sqrt{\frac{1}{N} \sum_{i=1}^N d(a_i, b_i)^2}$$

$d(A_i, B_i)$  is the Euclidian distance between  $a_i$  and  $b_i$ .

# Protein Structure Comparison

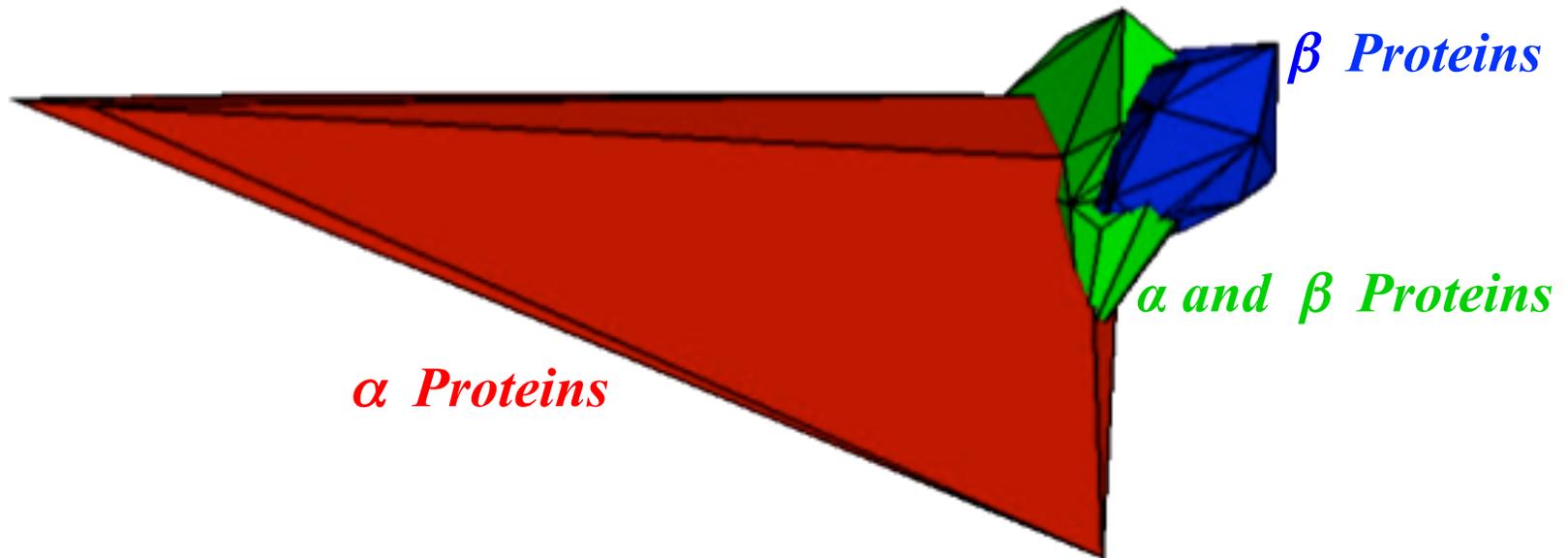
- Simplified problem: we know the correspondence between set A and set B
- We wish to compute the rigid transformation T that best align  $a_1$  with  $b_1$ ,  $a_2$  with  $b_2$ , ...,  $a_N$  with  $b_N$
- The error to minimize is defined as:

*Old problem, solved in Statistics, Robotics, Medical Image Analysis,*

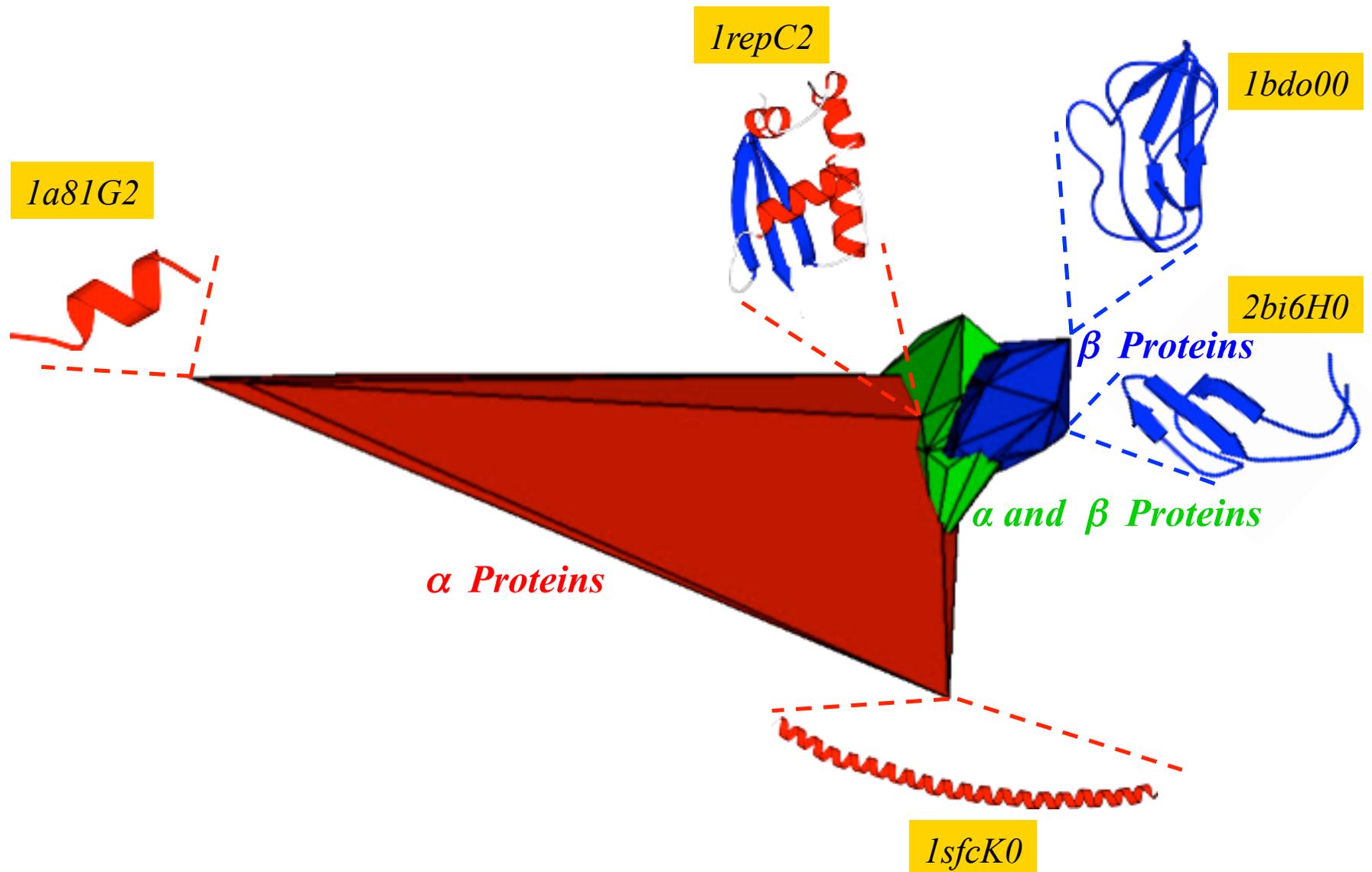
...

$$\varepsilon = \min_T \sum_{i=1}^N \|T(a_i) - b_i\|^2$$

# A Picture of the Protein Structure Space



# A Picture of the Protein Structure Space



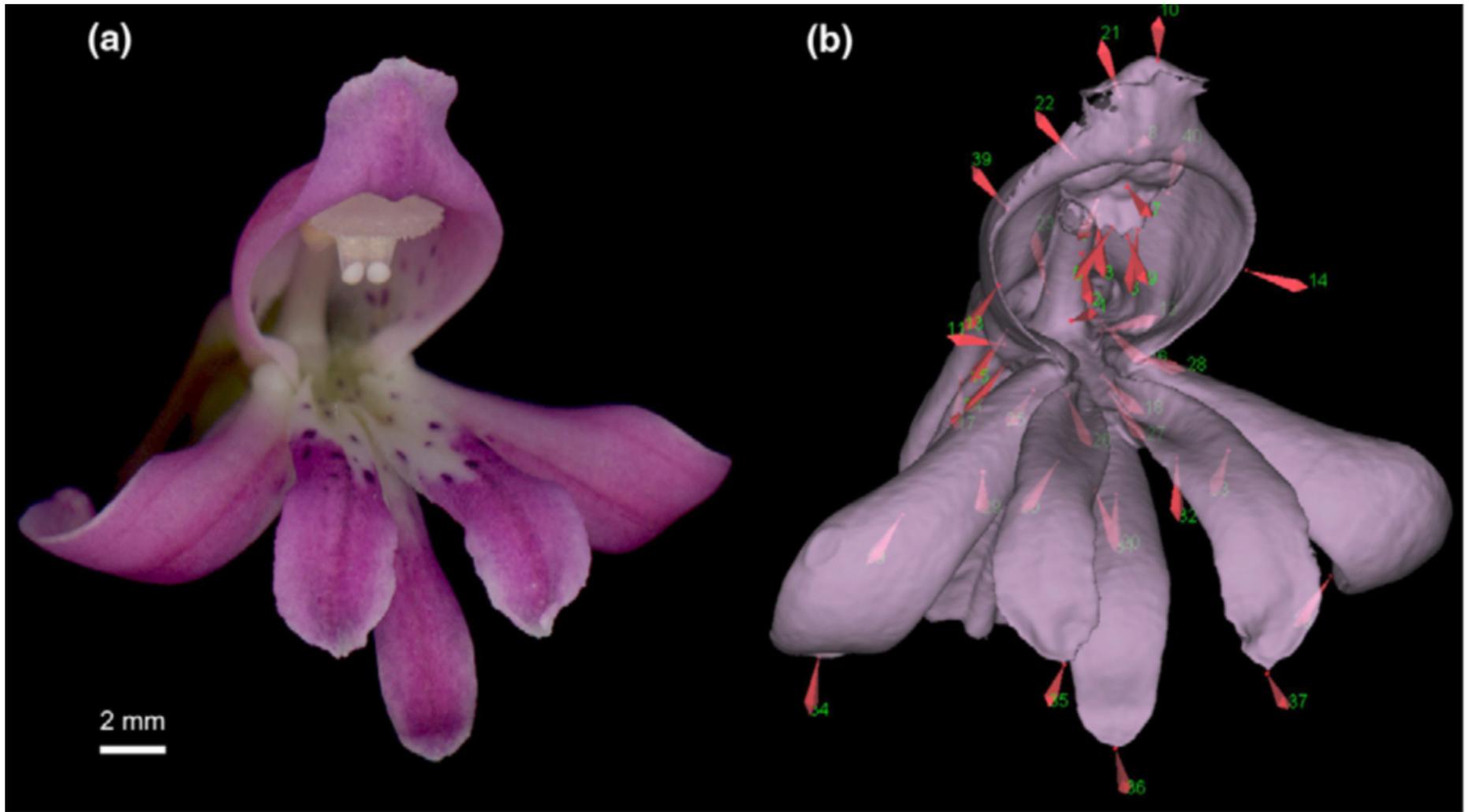
# Geometry and Topology in Biology

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2) Geometry of Biomolecules

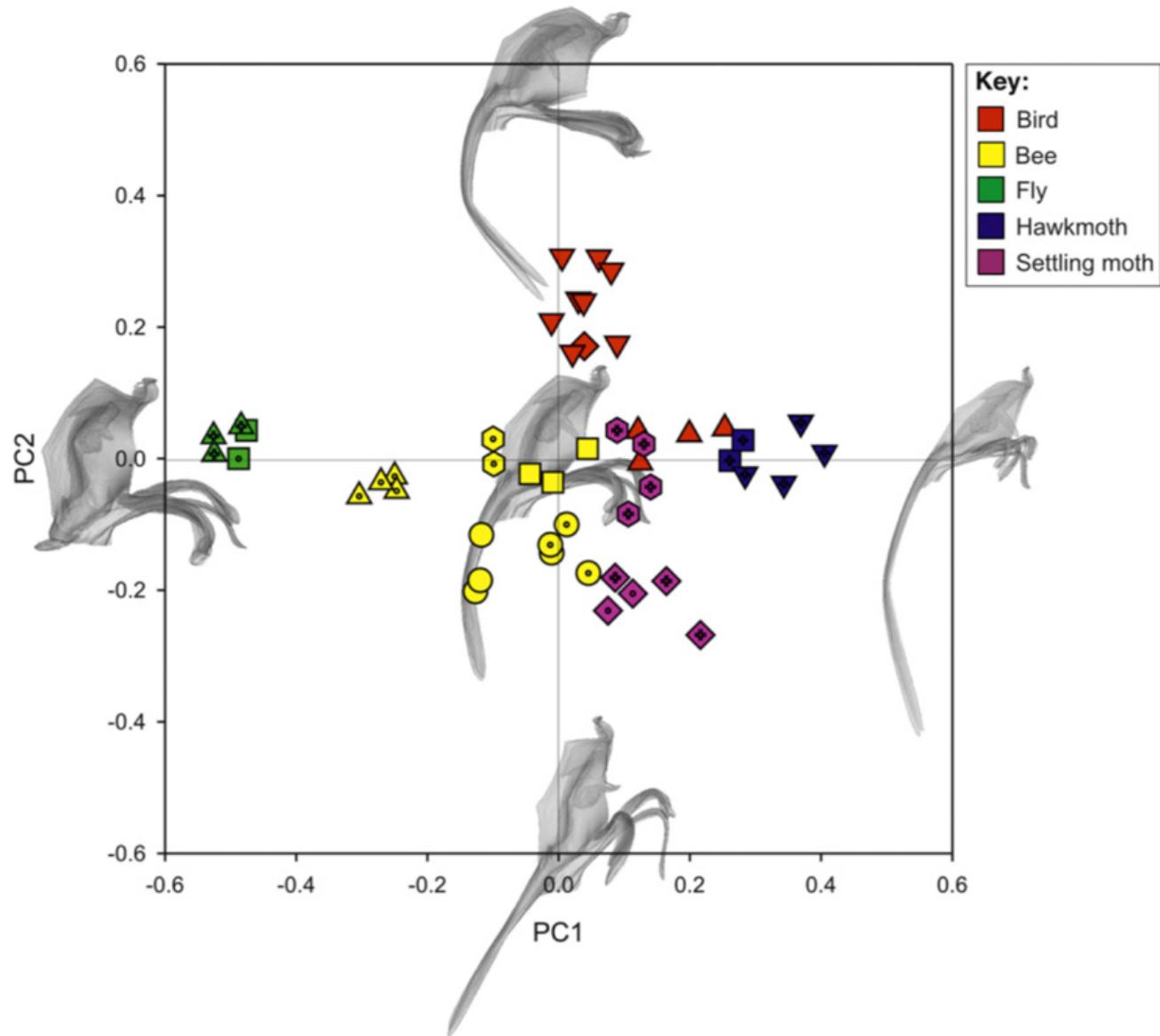
3) Morphometrics

# 3D Morphometrics of Orchids



(from <http://www.sciencedirect.com/science/article/pii/S1360138510000981> )

# 3D Morphometrics of Orchids



(from <http://www.sciencedirect.com/science/article/pii/S1360138510000981> )