

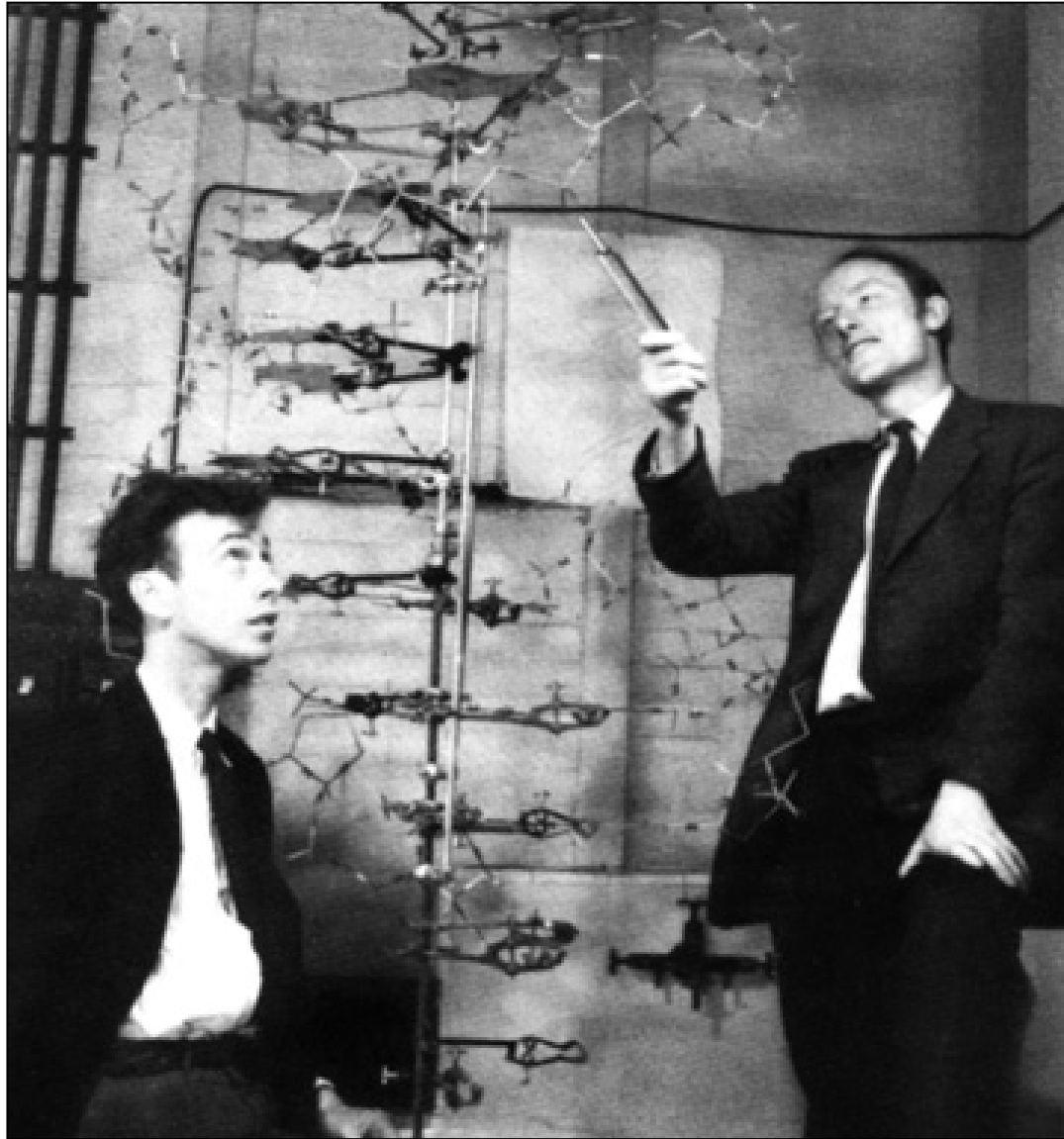
# **Structural bioinformatics**

**Dr. Zsuzsanna Dosztányi**

MTA-ELTE Momentum Bioinformatics Group

4. December 2017

- ◆ Basic features of protein structures
- ◆ Structure determination methods
- ◆ PDB database
- ◆ Visualization and analysis of structures
- ◆ Structure comparisons
- ◆ Structural classification
- ◆ Structure predictions



- **“It has not escaped our notice that the specific pairing we have postulated immediately suggests a possible copying mechanism for the genetic material.”**

## ■ 1958

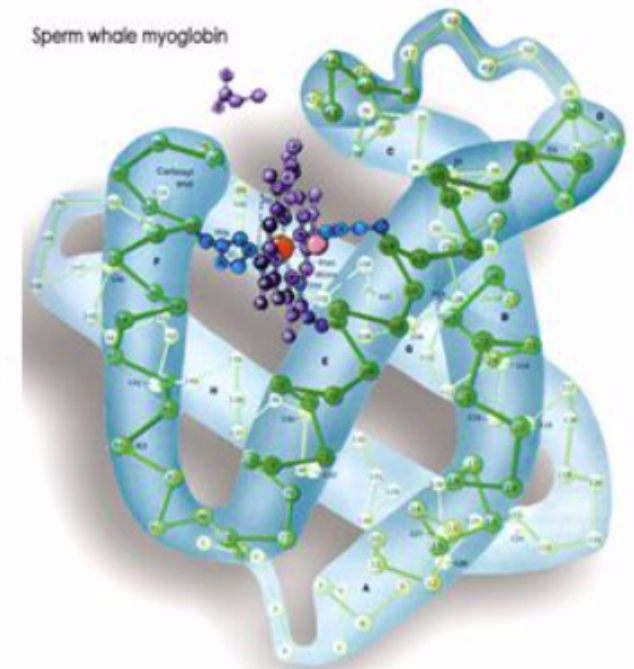
- John Kendrew et al., published the first structure of a globular protein, myoglobin.
- “Perhaps the most remarkable features of the molecule are its complexity and its lack of symmetry”

## ■ 1962

- Nobel prize in Chemistry was awarded to Max Perutz and John Kendrew.

## ■ Now

- ~80,000 structures in protein database (PDB)

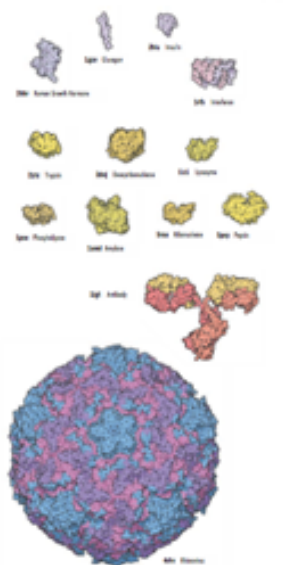


# MOLECULAR MACHINERY: A Tour of the Protein Data Bank

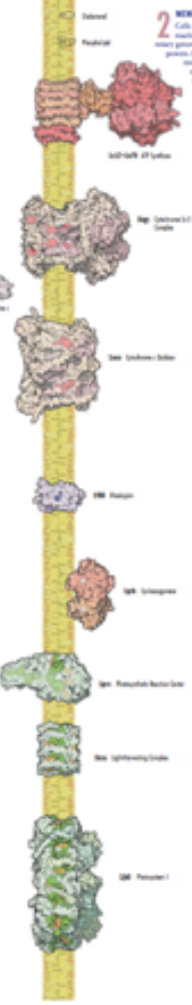
**1** Living cells are filled with complex molecular machinery, a million times smaller than familiar machines like computers or auto-washers. Cells use these tiny molecular machines to perform all of the jobs needed for life. Some are molecular scissors that cut and glue cells and their organelles. Some build new molecules when cells grow or when damaged tissues are repaired. Some are molecular boxes and muscles that support cells and help them move and crawl. Some fight off attackers, including against infection.

Researchers around the world are studying these molecules and determining their precise atomic structures. These structures are available on the Internet through the Protein Data Bank (PDB) ([www.pdb.org](http://www.pdb.org)). The central databases of molecular structures, a list of the thousands of structures held in the Protein Data Bank are shown here. In these pictures, the molecules are all drawn at a magnification of 1,000,000 times, and each atom is shown as a small sphere. Many of these structures are composed of several subunits, which are indicated by different colors. An extensive range of sizes is shown here: the wider and taller of the left face only show three atoms and the ribosome shown below has hundreds of thousands.

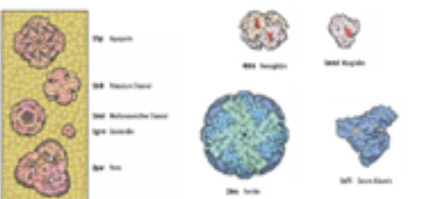
By David S. Goodell, The Scripps Research Institute, La Jolla, California, USA  
Graphic Design by Ted W. Bonner, San Diego Supercomputer Center



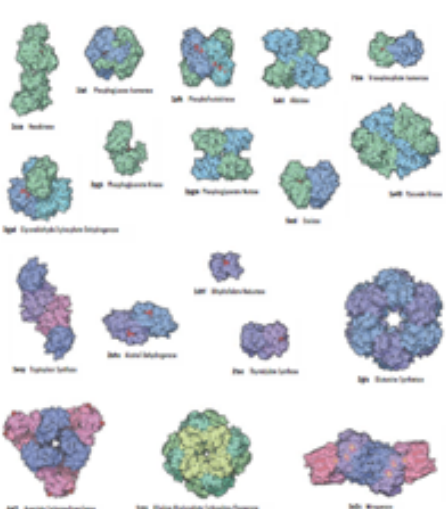
**1** INSIDE THE CELL  
Some molecular machines perform their jobs inside of cells. Many are complex, so they fit on different proteins or their own surface. This is one of the best-known examples at the top: insulin and glucagon, which together regulate blood sugar levels. Insulin, which carries signals to the hormone receptor, and glucagon, which carries signals to the hormone receptor, are shown as small red and blue spheres. In the center, the hormone receptor is shown as a large blue and red sphere. Each of these structures has a small groove, or pocket, in the top to catch the hormone in a different sugar molecule and signal to the hormone receptor. The size that catches the hormone and its binding site make different sugar chains. Insulin binds to its receptor and glucose then binds to cell surface, thus blocking infection.



**2** MESSAGES  
Cells are surrounded by a membrane made of lipids. On the phosphorylated and cholesterol molecules shown at the top, intracellular large cell-surface molecules reach and transmit messages. Many proteins are embedded in this membrane, performing a variety of essential tasks. ATP synthase is a rotary generator that produces ATP (adenosine triphosphate), the small molecule used for powering cells. The ion pump synthase here is a pump that moves sodium ions out of the cell and potassium ions into the cell. The small molecule motor is a motor that converts the energy of ATP into mechanical work. The small molecule motor is a motor that converts the energy of ATP into mechanical work. The small molecule motor is a motor that converts the energy of ATP into mechanical work.



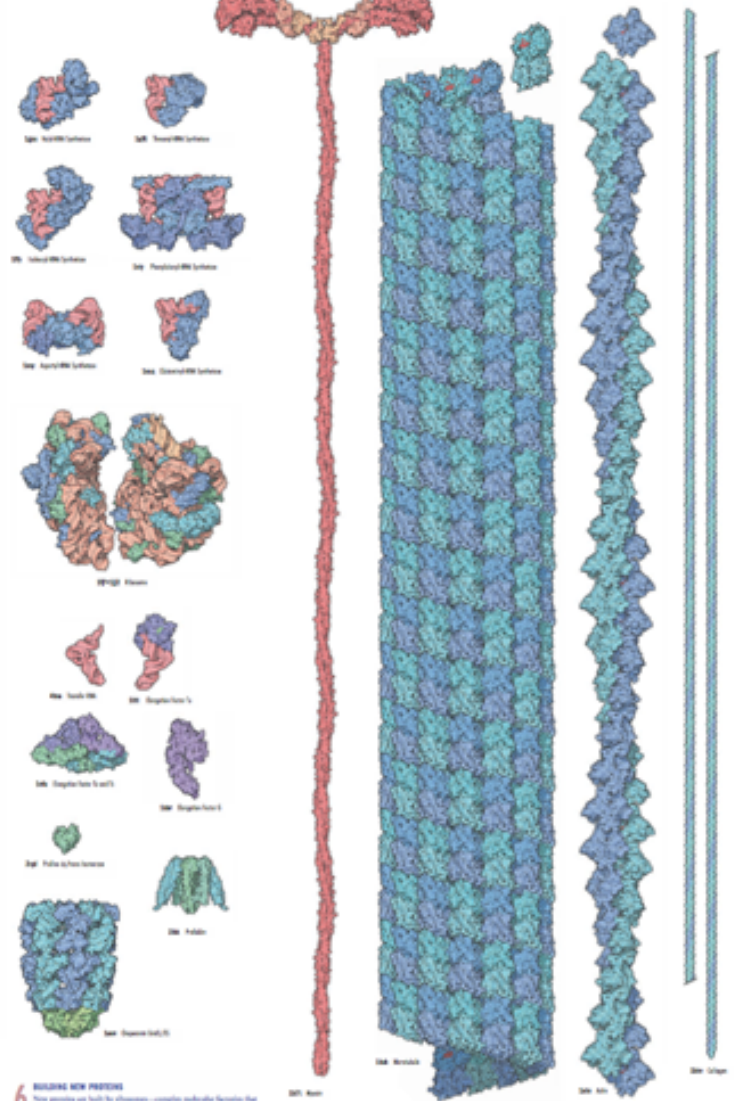
**3** TRANSPORT AND STORAGE  
ATPases, a protein family, are used by cells to move ions in and out of cells. Many could not get on the face shown a membrane binding site on the protein that binds through the membrane is shown. To the right of the face are several other proteins involved in transport and storage of molecules. Transporters and storage proteins are shown here and they move ions in and out of cells. Some have multiple active sites. Many different molecules in the blood.



**4** CHEMICAL REACTIONS  
Cells build a bewildering variety of complex molecules that perform chemical reactions. At the top on the left, the enzyme that performs glycolysis, the breakdown of sugar to form ATP. Below that are several enzymes that perform different biochemical reactions. The enzyme shown at the top is a hexameric enzyme that performs a variety of biochemical reactions. The enzyme shown at the top is a hexameric enzyme that performs a variety of biochemical reactions. The enzyme shown at the top is a hexameric enzyme that performs a variety of biochemical reactions.



**5** DNA  
Genetic information is stored in the DNA double helix, one of the most important molecules in life. Many proteins are used to read, copy, and repair the information. DNA polymerase copies the information from a strand of DNA that will be used to direct the construction of new proteins. It is assisted by helicase, which unwinds the DNA double helix. The DNA double helix is a double-stranded molecule. The DNA double helix is a double-stranded molecule. The DNA double helix is a double-stranded molecule.

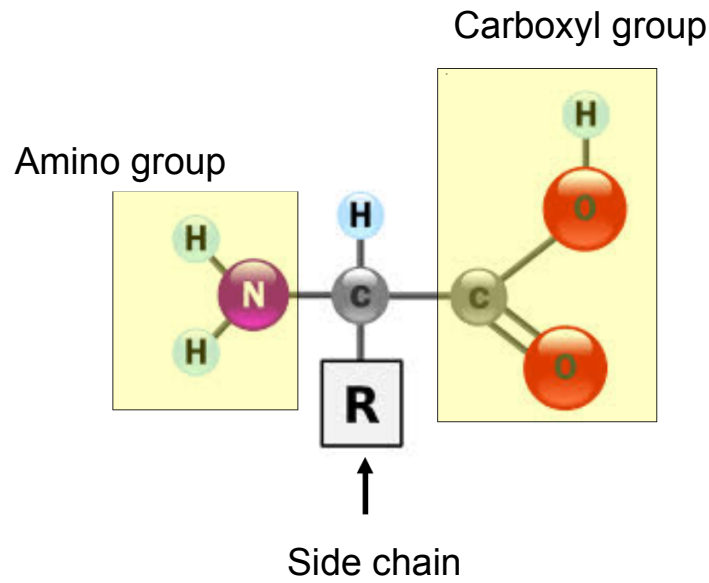


**6** BUILDING NEW PROTEINS  
New proteins are built by ribosomes—complex molecular machines that read the genetic code and use it to direct construction. Many molecular machines are needed to assist the process. Transcription factors are shown here and they help the building blocks (DNA) to be added to a growing genetic chain. Several proteins are shown here and they help the building blocks (DNA) to be added to a growing genetic chain. Several proteins are shown here and they help the building blocks (DNA) to be added to a growing genetic chain.

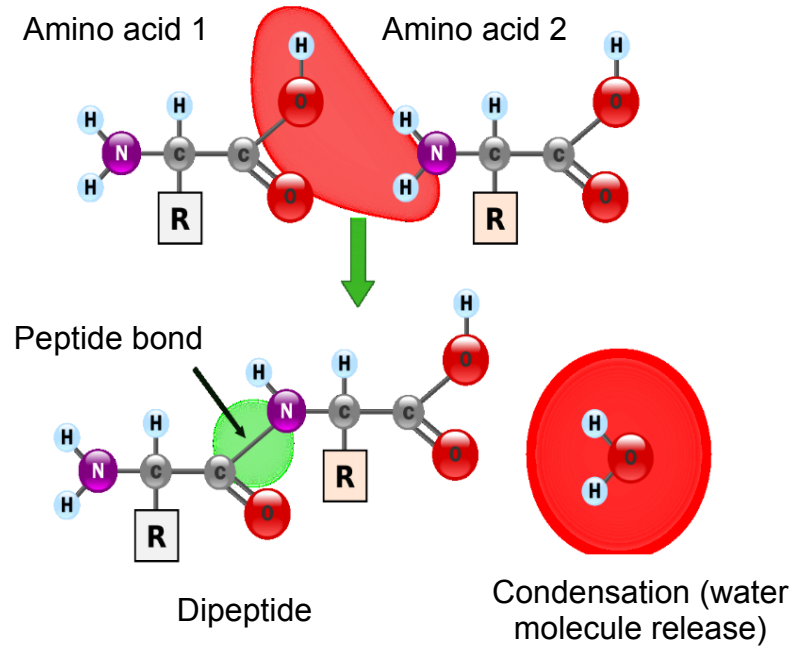
**7** BEARS AND OTHERS  
Cells are filled with a variety of complex molecules. These molecules are shown here and they help the building blocks (DNA) to be added to a growing genetic chain. Several proteins are shown here and they help the building blocks (DNA) to be added to a growing genetic chain. Several proteins are shown here and they help the building blocks (DNA) to be added to a growing genetic chain.

**PDB**  
<http://www.pdb.org> • info@rcsb.org  
RESEARCH COLLABORATION FOR  
STRUCTURAL BIOINFORMATICS  
NATIONAL INSTITUTE OF HEALTH  
NATIONAL CENTER FOR HUMAN GENOMICS  
NATIONAL INSTITUTE OF ENVIRONMENTAL HEALTH SCIENCES  
NATIONAL INSTITUTE OF GENERAL MEDICAL SCIENCES  
NATIONAL INSTITUTE OF NEUROLOGICAL DISORDERS AND STROKE  
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NATIONAL INSTITUTE OF TYPING  
NATIONAL INSTITUTE OF VETERINARY MEDICINE  
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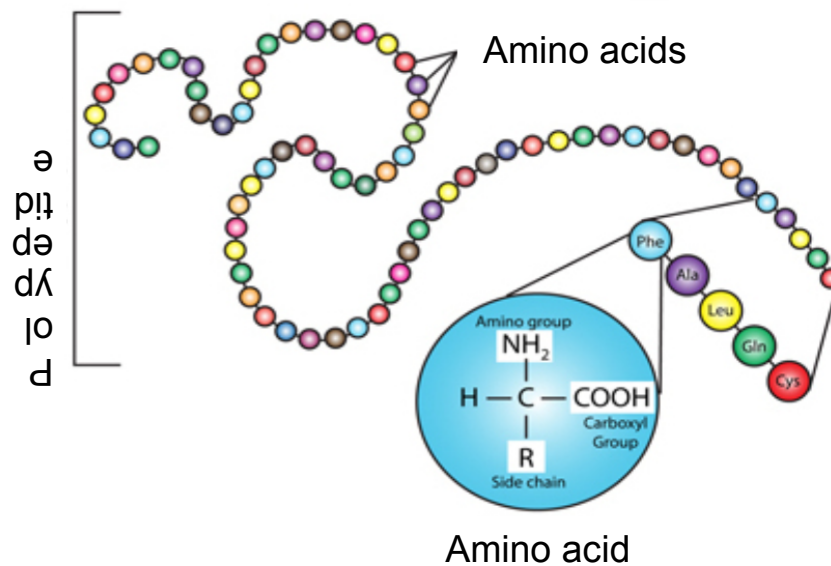
# Amino acid



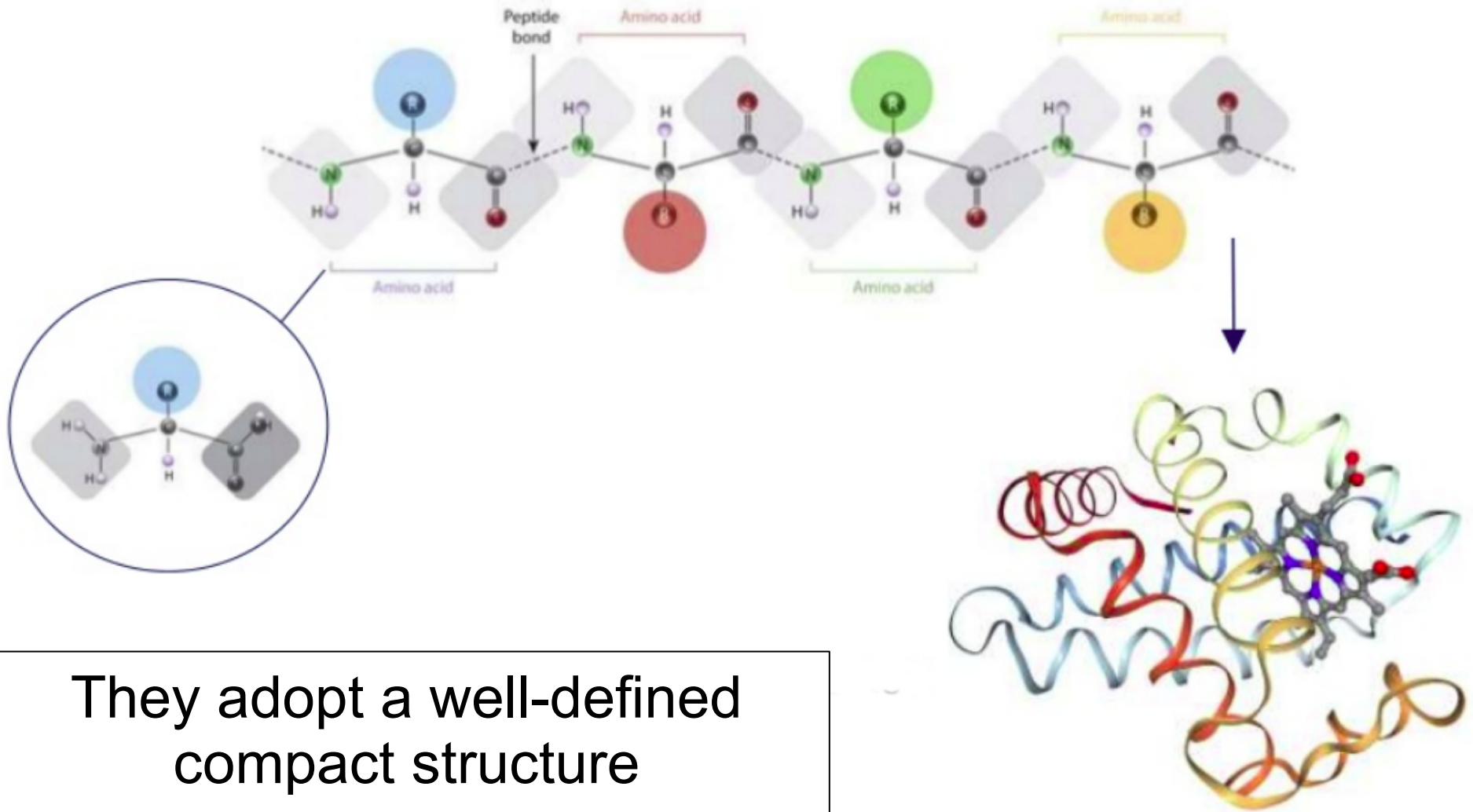
# Peptide bond



# Polypeptide chain



# Globular proteins



# Why are protein structures interesting?



Function is heavily dependent on the shape of the protein

- Atomic-level understanding of biological processes (DNA, RNA, enzymes, hormones, receptors)
- Understanding the molecular basis of diseases
- Drug design, protein-drug interactions
- ✗ No information on e.g. binding strength



# Levels of structure for globular proteins

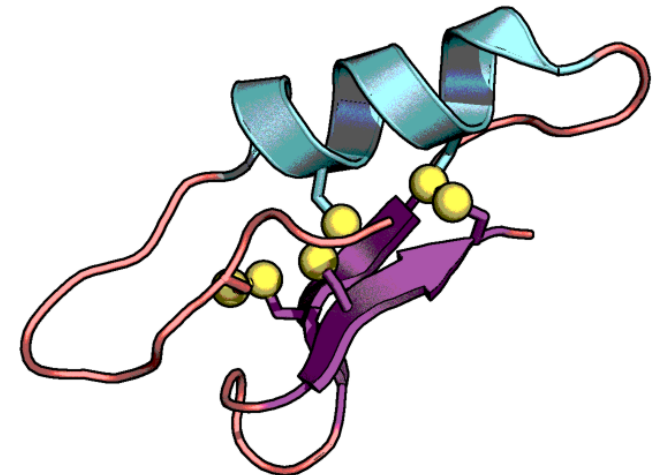
Primary structure =  
Amino acid sequence

MSSVLLGHIKKLEMGHS...

Secondary structure =  
alpha helix, beta  
sheets/strands, turns (based  
on main chain H-bonds)



Tertiary structures =  
Relative positions of  
secondary structure elements  
within the chain

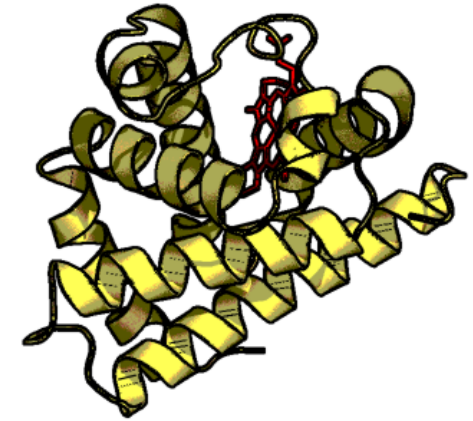


# Quaternary structure

Monomer

Myoglobin

$\alpha$



*Multi subunit protein complexes*

- Homo and hetero oligomers

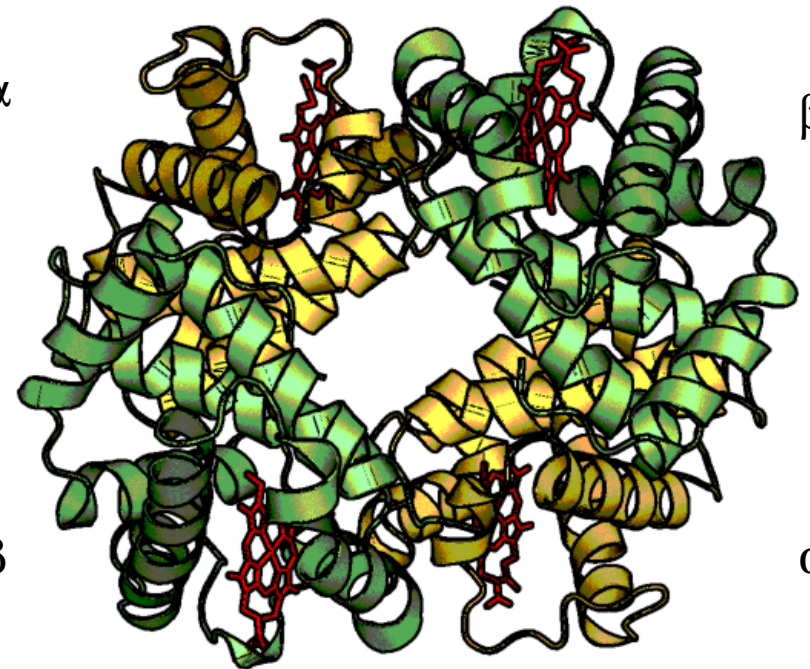
Hemoglobin

$\alpha$

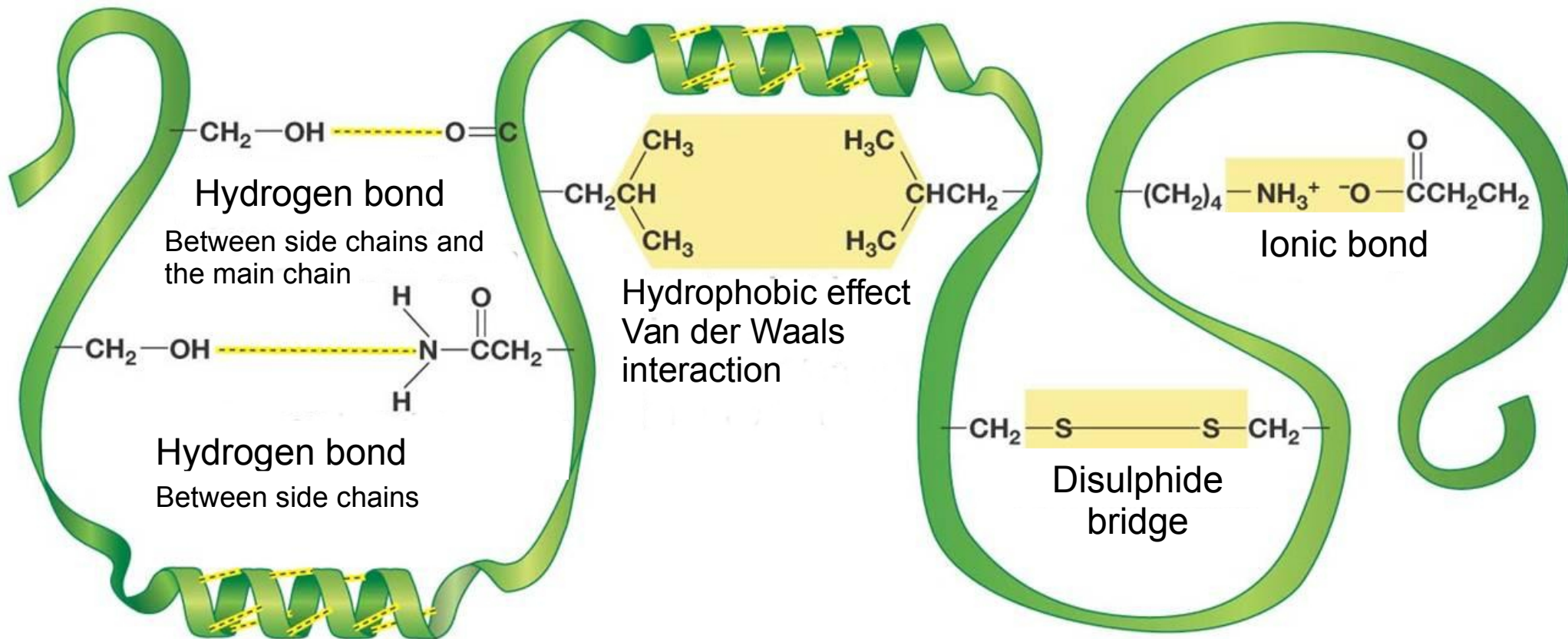
$\beta$

$\beta$

$\alpha$

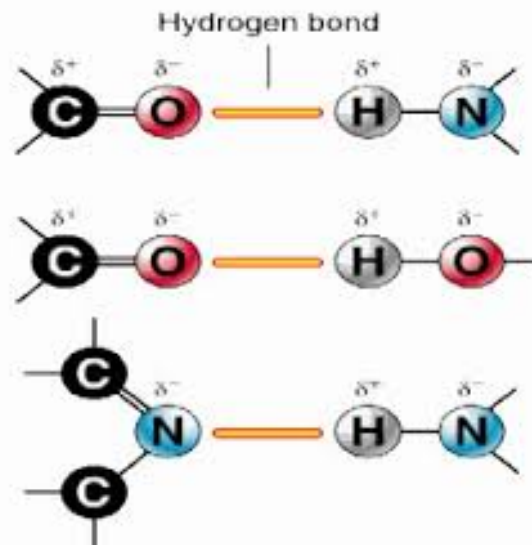


# Interactions stabilizing proteins

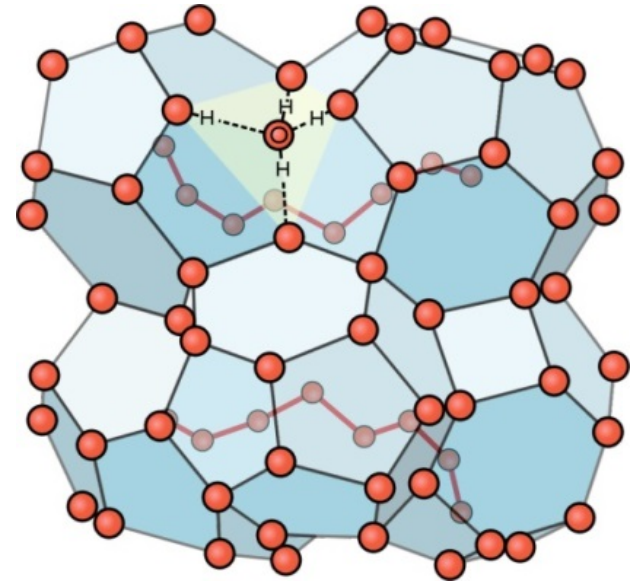
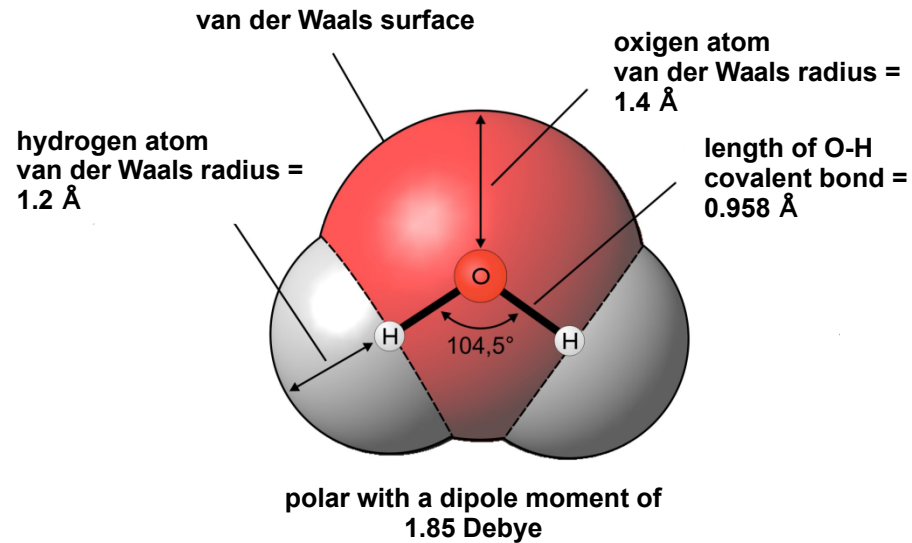


# Hydrogen bond

Hydrogen bonds are formed by a H-atom bound in the structure with a **high electronegativity atom** (F, N, O) from a different functional group, i.e. a hydrogen atom establishes a bond between two other atoms.



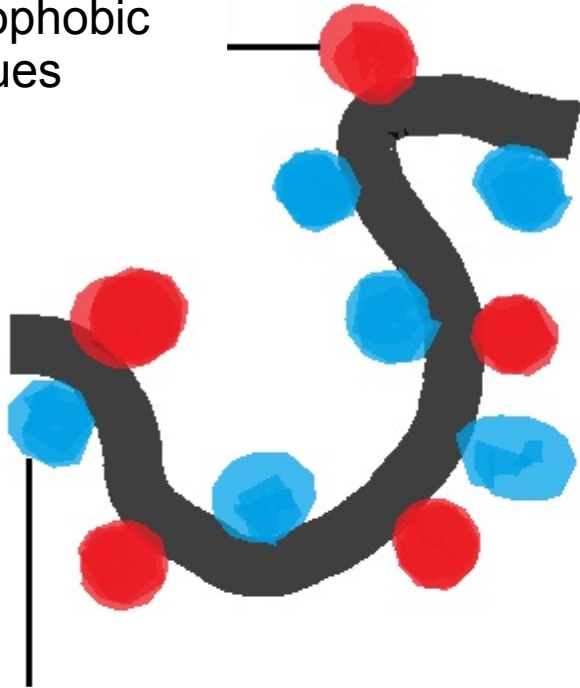
# Water molecule



**Hydrophobic effect: dominated by entropic terms**

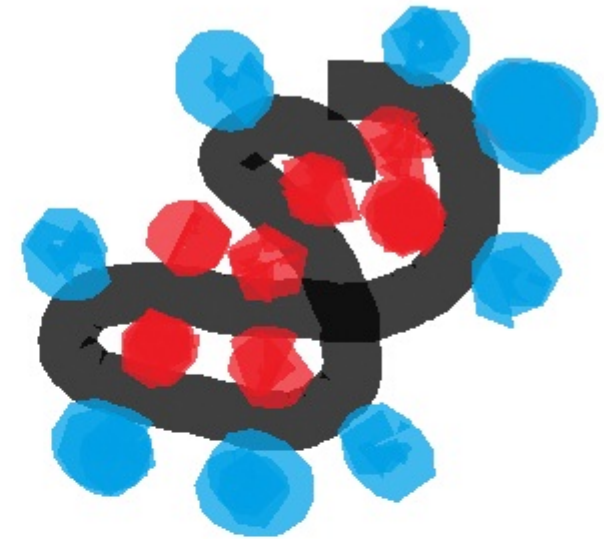
# Hydrophobicity

Hydrophobic residues



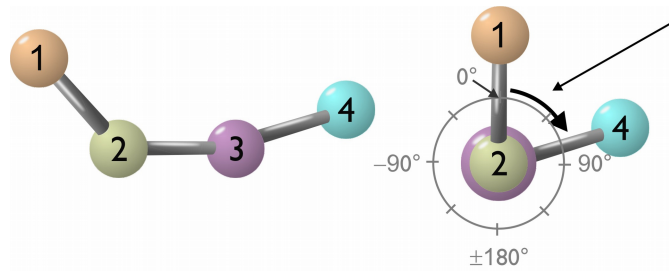
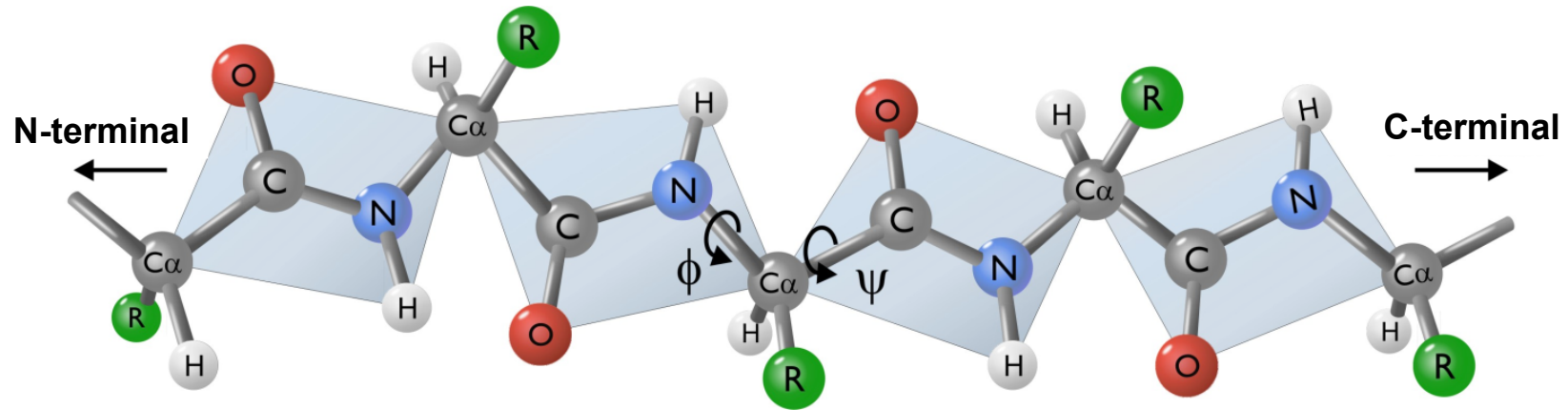
Hydrophilic residues

Protein in isolation

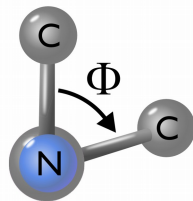
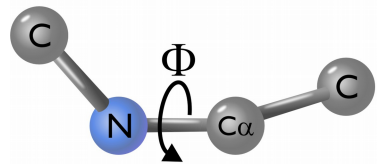


Protein in aqueous environment

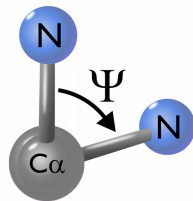
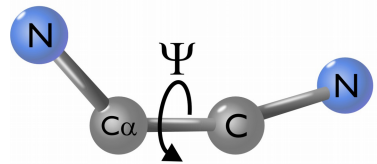
# Main chain conformation



**Torsion angle**  
clockwise (+)  
counter-clockwise (-)



Rotation around N-C $\alpha$  bond: phi

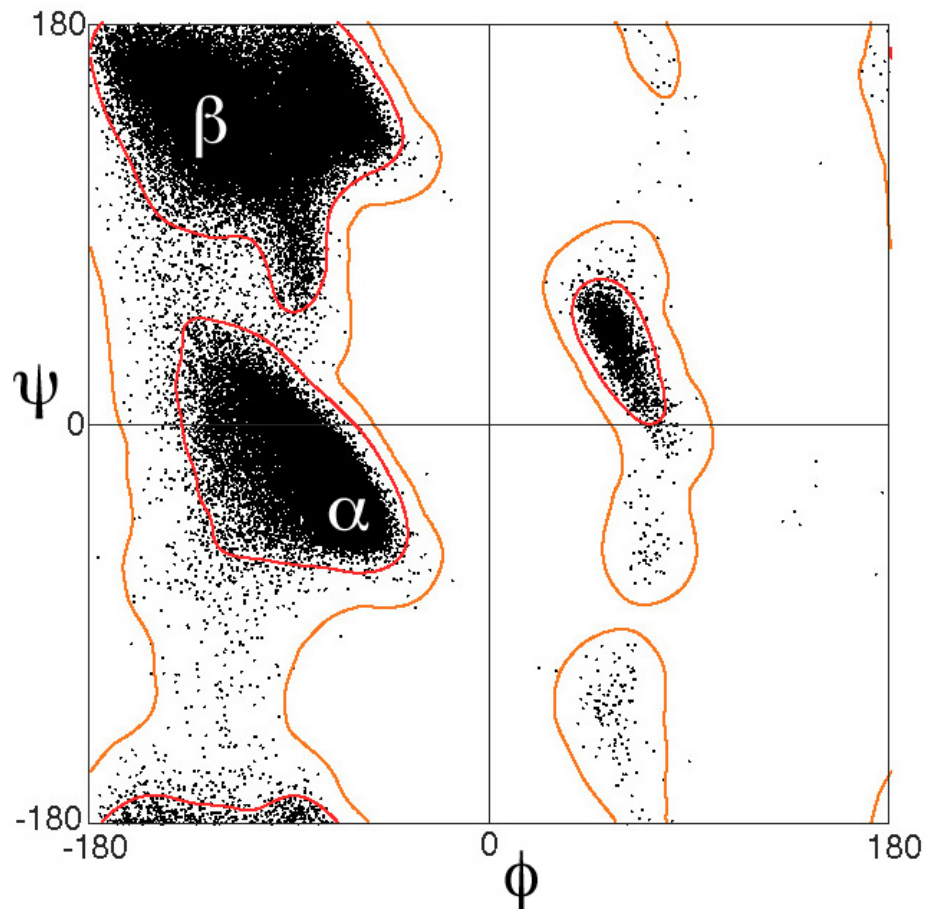


Rotation around C $\alpha$ -C' bond: psi

The main chain  $\phi$  and  $\psi$  torsion angles of a protein cannot take arbitrary values, there are preferred conformations.

# Ramachandran plot

We can plot the angle-pairs of all residues in a coordinate system using the two torsion angles as X and Y-coordinates.



Glycines and prolines are typically left out from the plot as they have unique conformational preferences. As expected, most residues fall into regions corresponding to  $\alpha$ -helices and  $\beta$ -strands, but most residues from bends and turns are also within the allowed regions.



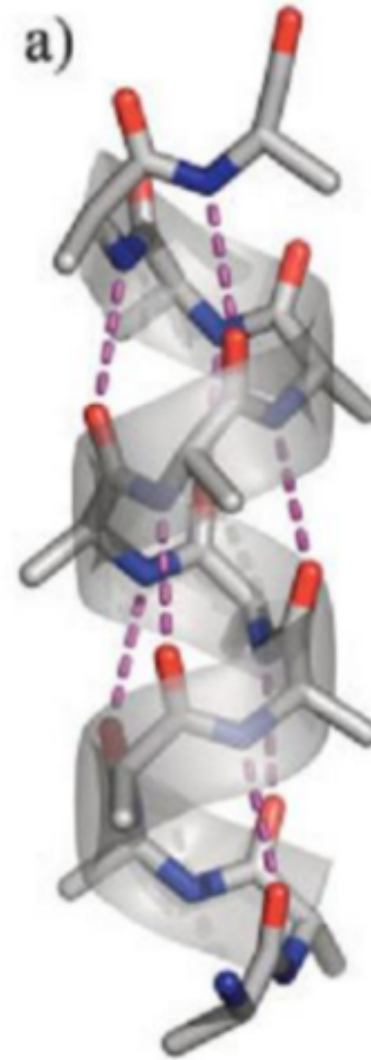
# The (right-handed) $\alpha$ helix

Approx. 30% of globular proteins

5-40 residues in length (10 on average)

Individual H-bonds are relatively weak, they have a significant contribution to helix stability

The helix-forming propensity of a peptide segment depends on its sequence



$\alpha$  helix

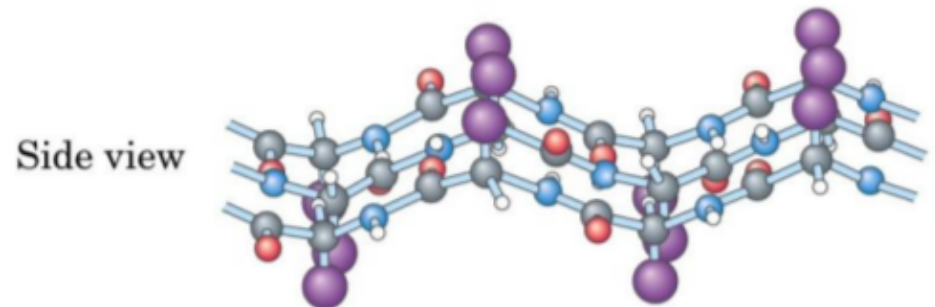
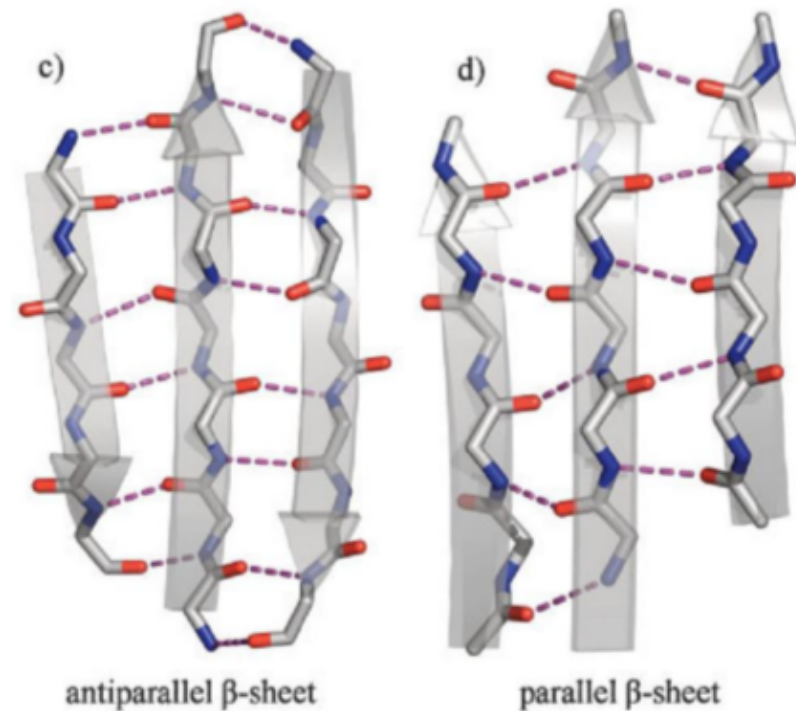
# $\beta$ sheet conformation

Approx. 30% of globular proteins

Strands of 5-10 residues run in parallel

Strands are held together by H-bonds

Different  $\beta$ -sheet forming propensity for various residues



# Loops and turns

Typically have hydrophilic characters. Occur on the outer regions of the protein, form H-bonds with water and other molecules

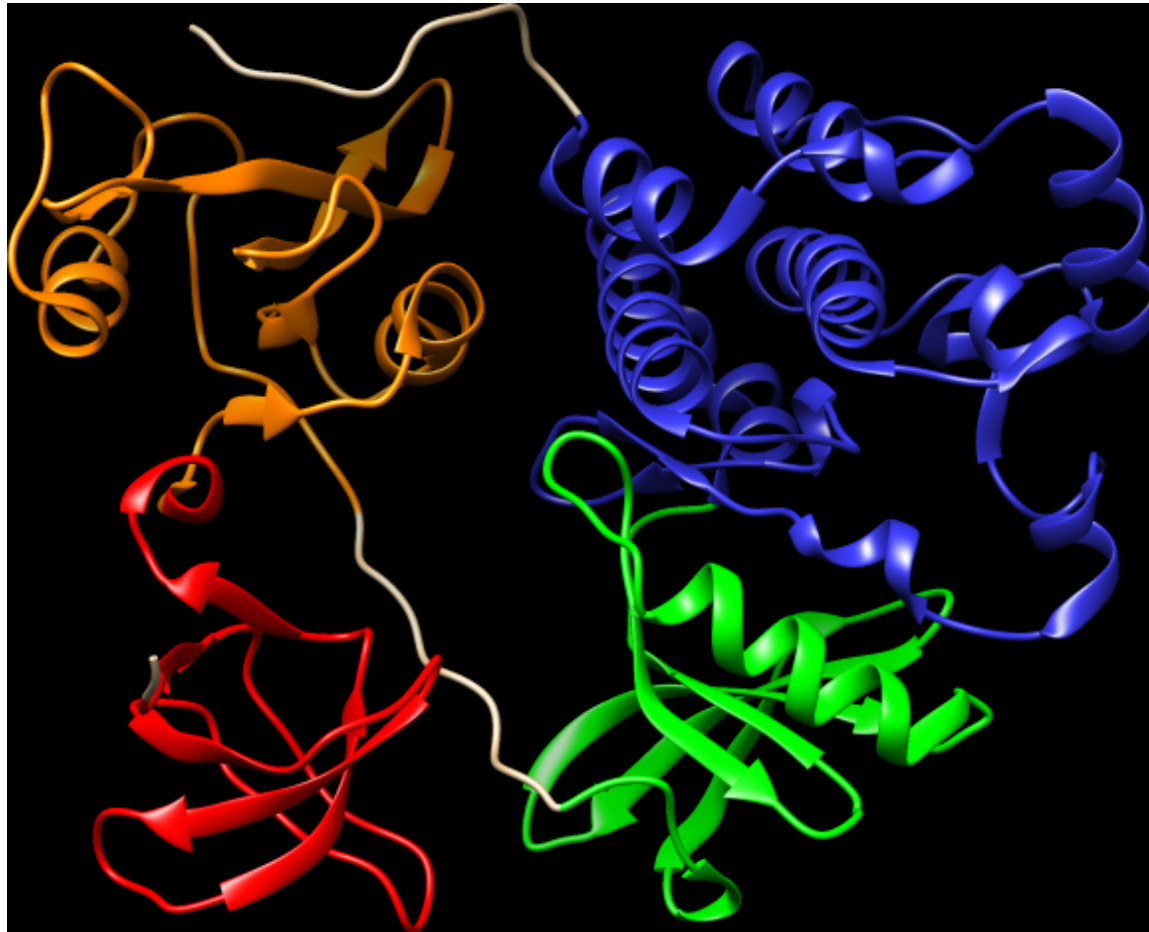
Often form binding regions and active sites in enzymes and receptors

Different loop-forming propensity for various residues



# Domains

Many proteins feature distinct compact structural units



# Domains

Compact units with globular-like structures

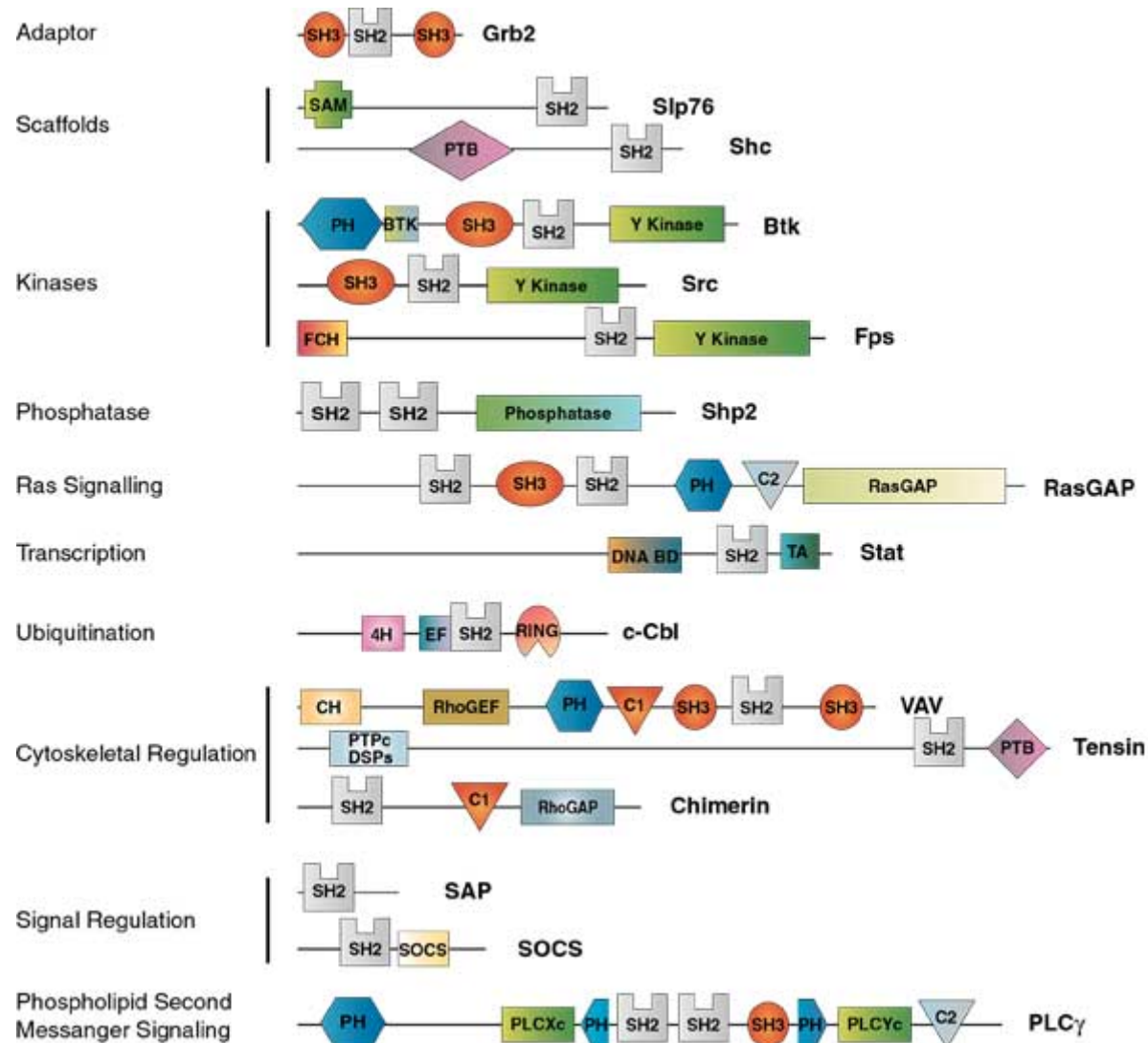
Domains are basic building blocks of proteins

Typically fulfill a well-specified function

Can appear in various biological contexts

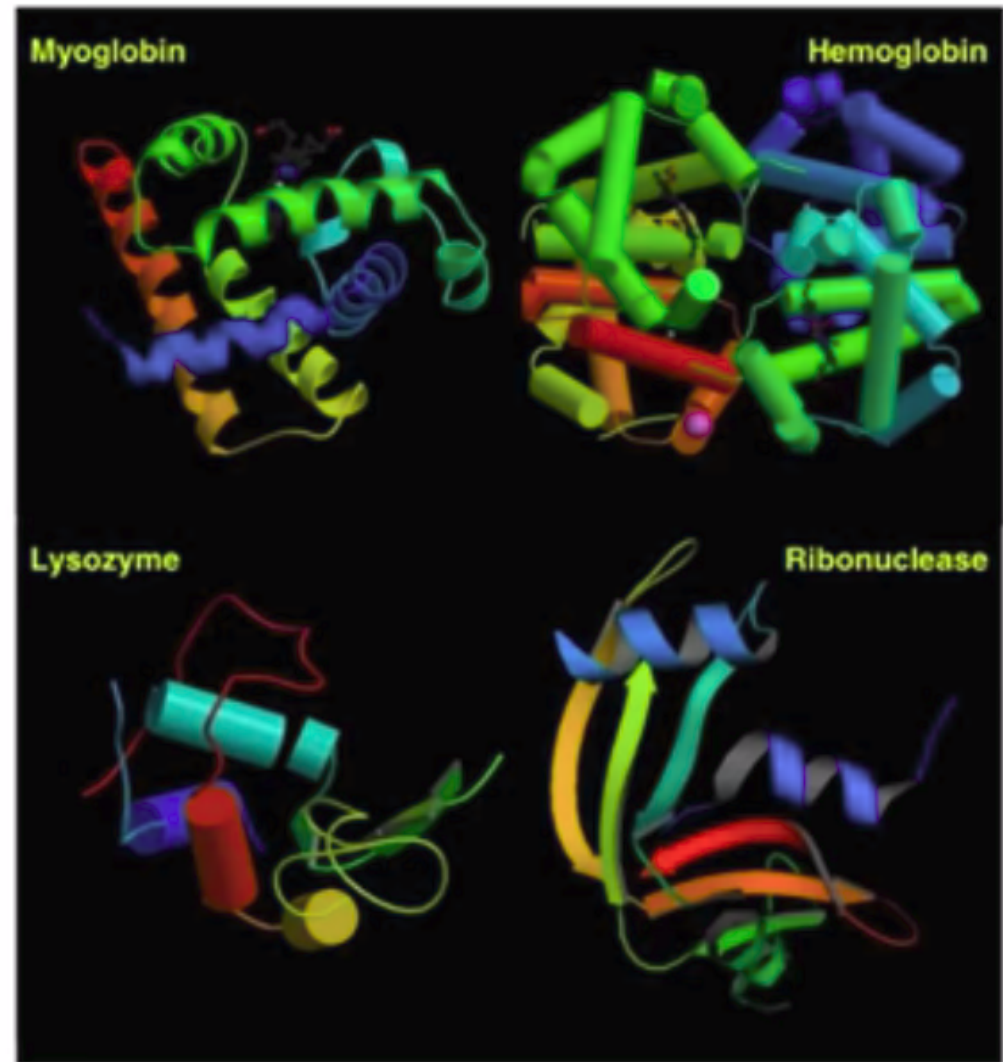


# SH2 domain



# Protein Data Bank

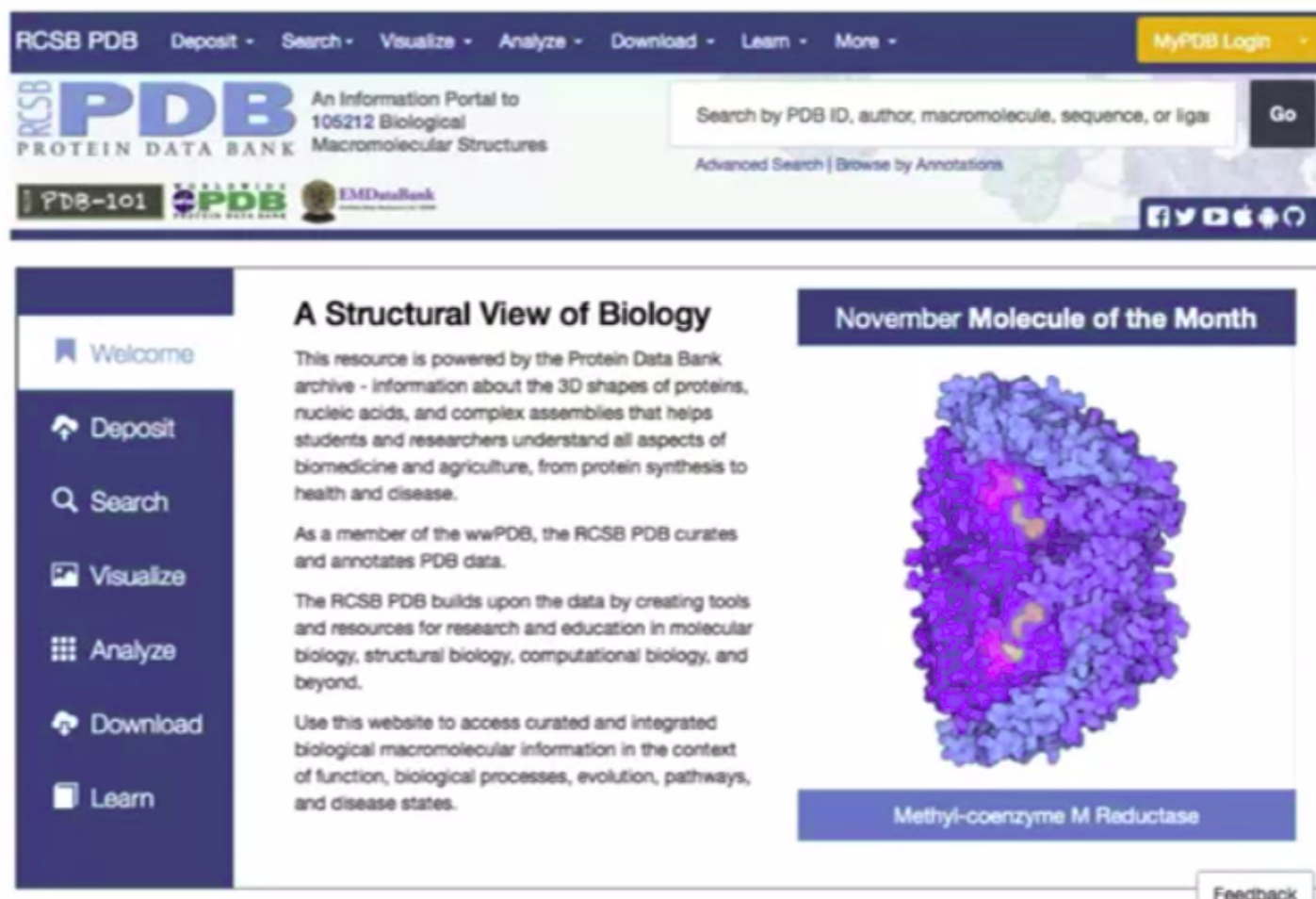
- First open access digital resource in biology (est. 1971 with 7 entries)
- Single global archive of 3-D macromolecular structures (contains >100,000 entries)
- US PDB = RCSB PDB
  - Headquartered at Rutgers/UCSD (NSF, NIH, DOE)
  - Part of Worldwide PDB (with EU and Japan)
  - Makes PDB data freely available to all *via* [www.rcsb.org](http://www.rcsb.org)



Some of the first few structures in the PDB

# RCSB PDB Portal [rcsb.org](http://rcsb.org)

- Searching
- Visualizing
- Comparing
- Accessing external data
- Reporting
- PDB-101 resources for education



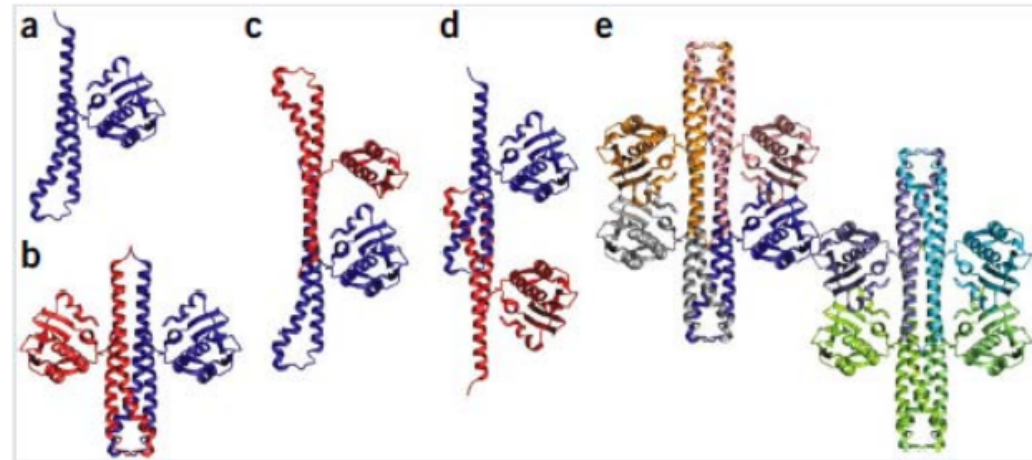
The screenshot shows the RCSB PDB Portal homepage. At the top, there is a navigation bar with links for Deposit, Search, Visualize, Analyze, Download, Learn, and More, along with a MyPDB Login button. Below this is the main header with the RCSB PDB logo and the text "An Information Portal to 105212 Biological Macromolecular Structures". A search bar is located on the right side of the header, with a "Go" button. Below the search bar are links for "Advanced Search" and "Browse by Annotations".

The main content area is divided into three columns. The left column is a dark blue sidebar with a "Welcome" message and icons for Deposit, Search, Visualize, Analyze, Download, and Learn. The middle column is titled "A Structural View of Biology" and contains text describing the resource's purpose and its role as a member of the wwPDB. The right column is titled "November Molecule of the Month" and features a 3D molecular model of Methyl-coenzyme M Reductase, which is colored in shades of purple and blue.

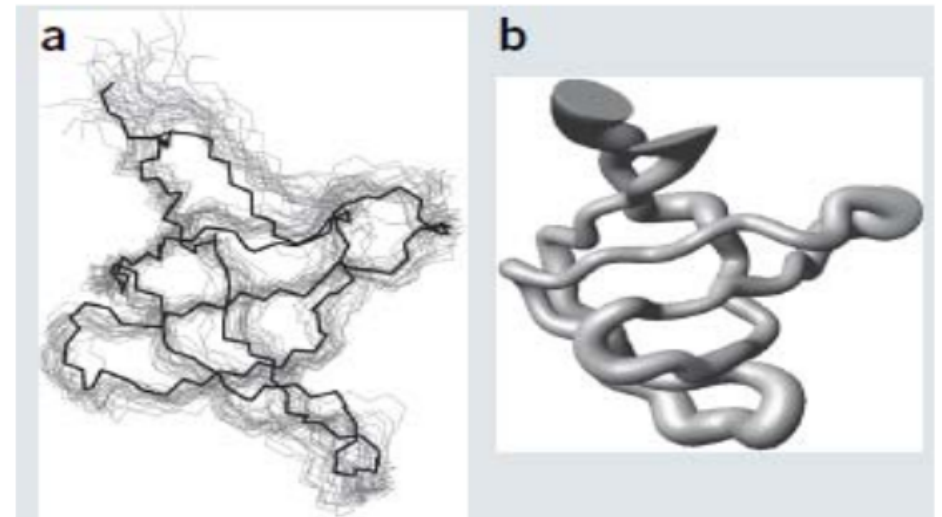
At the bottom right of the page, there is a "Feedback" button.



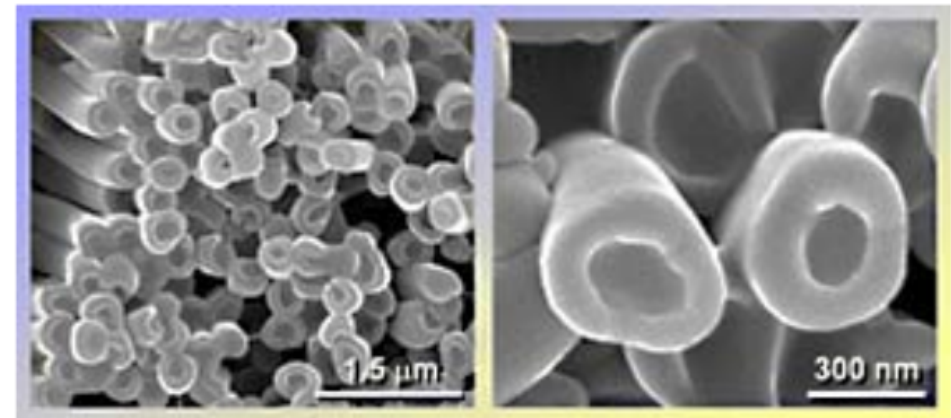
X-ray crystallography



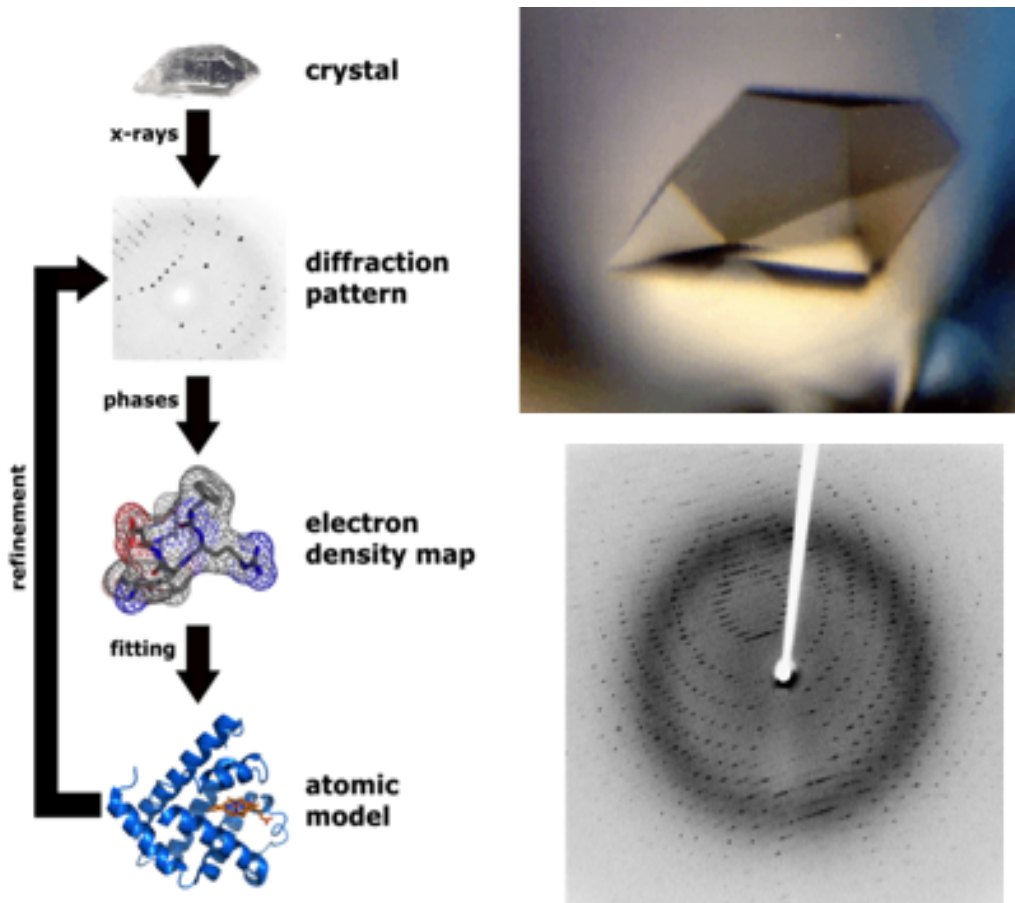
NMR



Electron microscopy



# X-ray crystallography



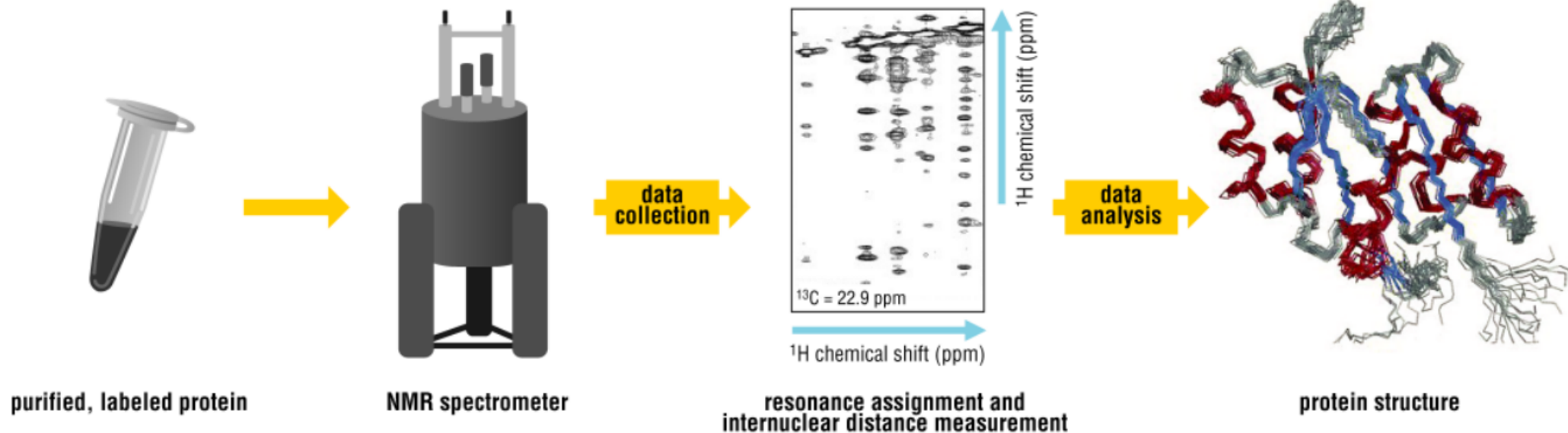
X-ray:

- X-rays have short wave lengths (approx. 1.5 Å) – needed to measure the typical atom-atom distances
- gives information about electron density, the model has to be fit into that
- crystallization artefacts
- non-physiological environment
- no information on hydrogens

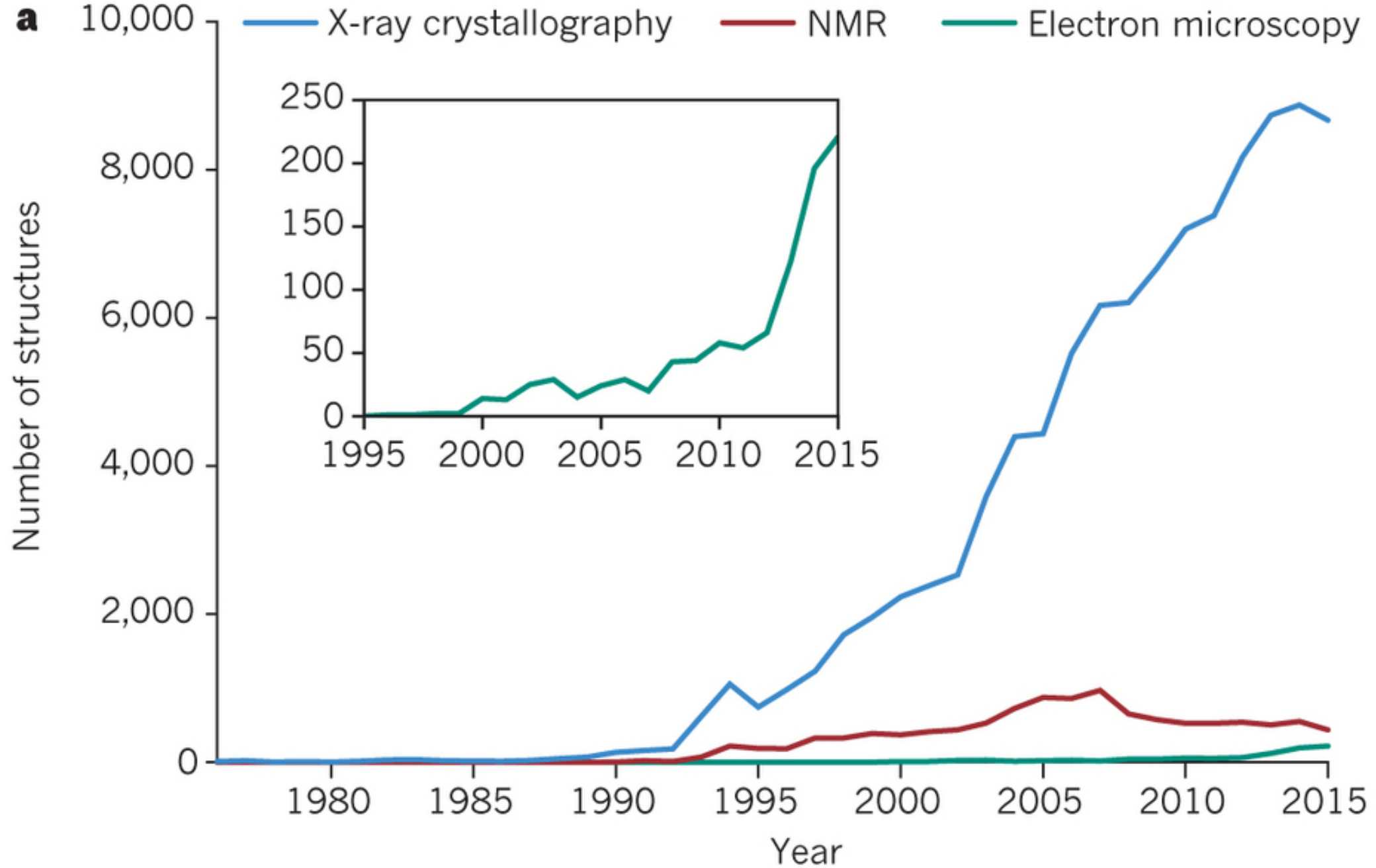
Figure 4: Left: Structure determination by X-ray crystallography. Work by Bragg and others connected spots on diffraction pattern with arrangement of atoms in the crystal to solve simple structures like salts. Work by Perutz, Rossmann, and Blow allowed automated processing of crystal data to solve complex structures. Right (top): typical protein crystal, less than one millimeter in size; Right (bottom): protein crystal diffraction pattern.

# NMR

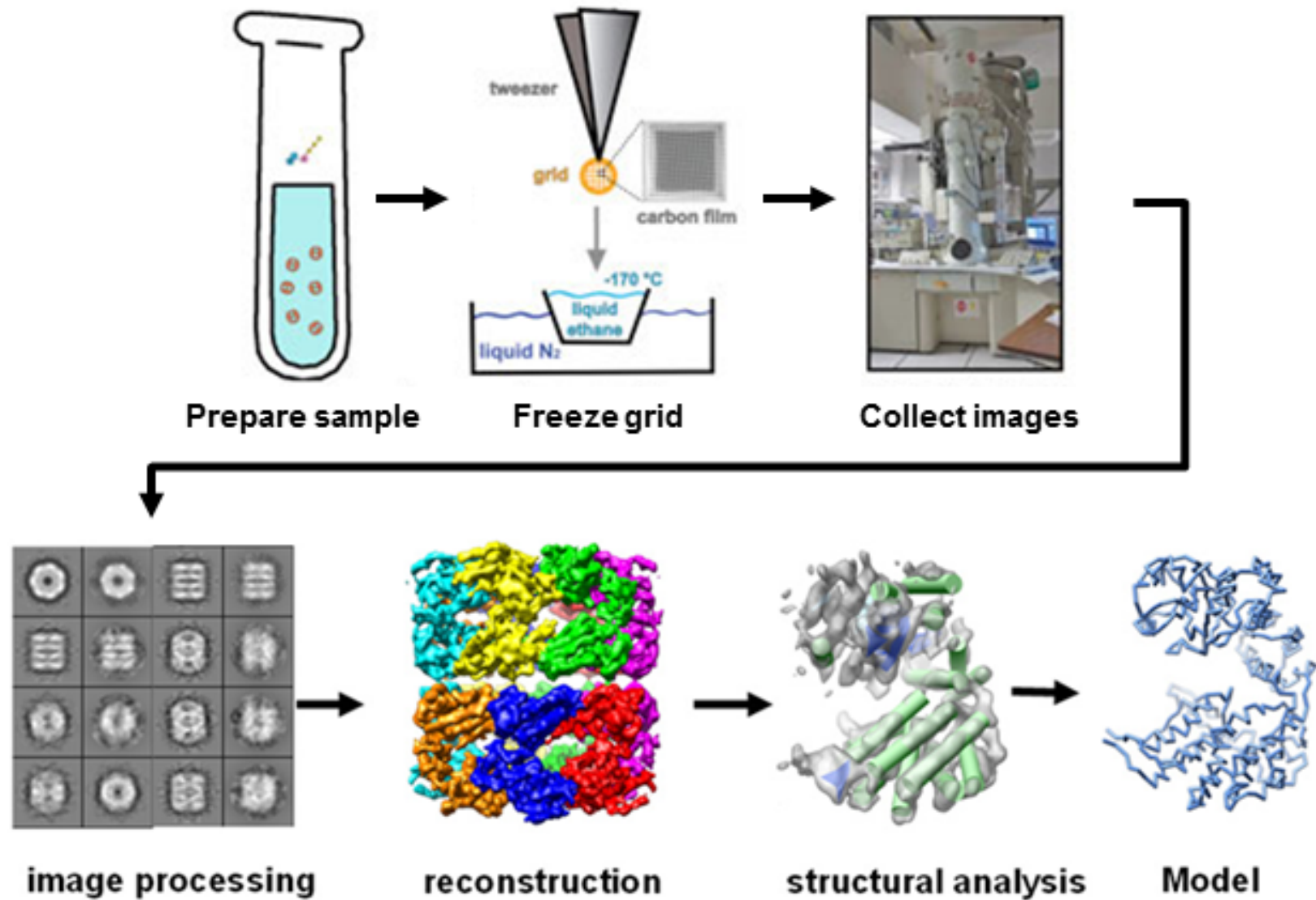
## $^1\text{H}$ -NMR (Proton Nuclear Magnetic Resonance)



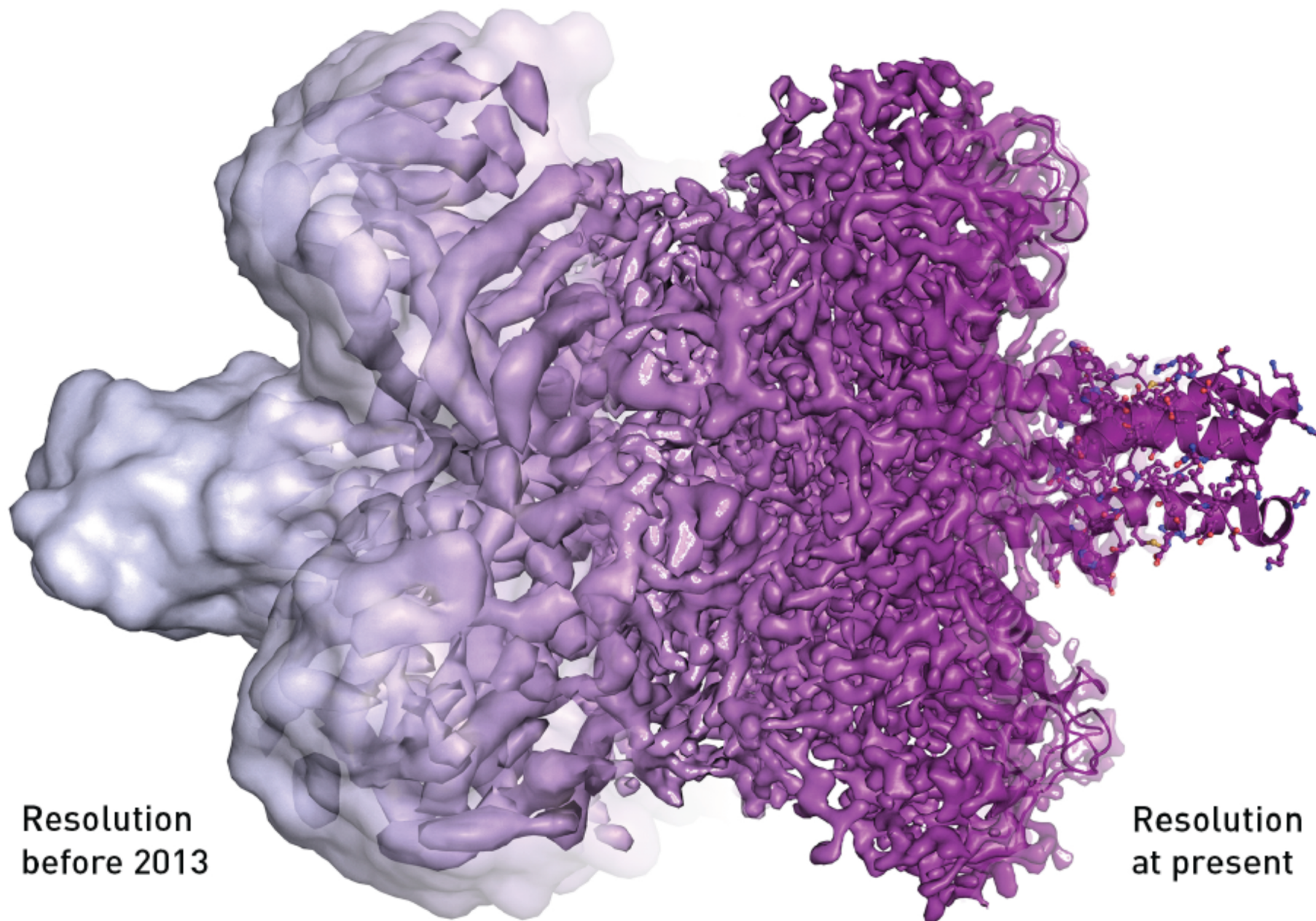
- in solution
- usually yields a structural ensemble that fulfills the distance constraints
- only small proteins
- less precise model
- usable for flexible proteins as well



# Cryo-EM (atomic resolution)



# Nobel Prize in Chemistry 2017



# PDB statistics





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**RCSB PDB** 135359 Biological Macromolecular Structures Enabling Breakthroughs in Research and Education

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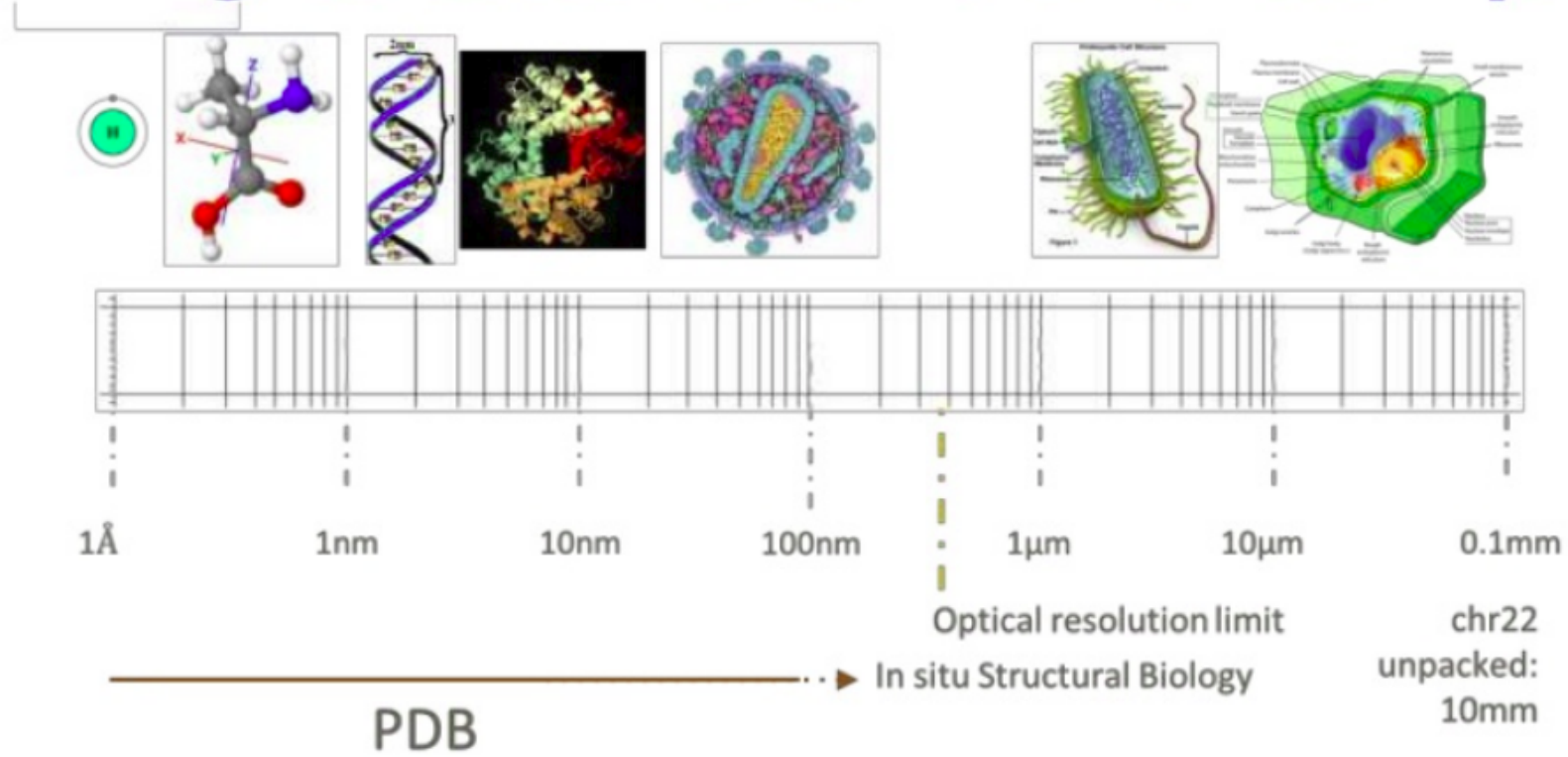
PDB-101 WORLDWIDE PDB PROTEIN DATA BANK EMDatabank Unified Data Resource for ISEM ndb NUCLEIC ACID DATABASE Worldwide Protein Data Bank Foundation

## PDB Current Holdings Breakdown

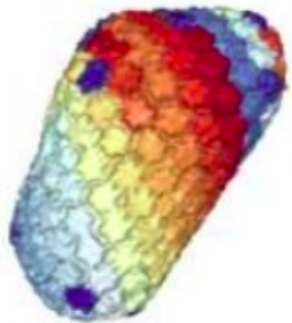
Exp.Method	Proteins	Nucleic Acids	Protein/NA Complexes	Other	Total
X-RAY	113476	1899	5797	4	121176
NMR	10553	1225	246	8	12032
ELECTRON MICROSCOPY	1319	30	468	0	1817
HYBRID	105	3	2	1	111
other	200	4	6	13	223
Total	125653	3161	6519	26	135359

# Growing Structure Size and Complexity

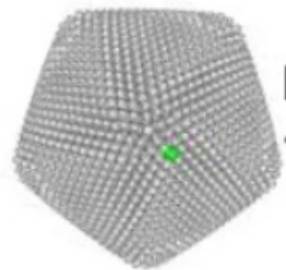


Largest asymmetric structure in PDB

Largest symmetric structure in PDB



HIV-1 capsid: PDB ID 3J3Q  
~2.4M unique atoms



Faustovirus major capsid: PDB ID 5J7V  
~40M overall atoms



# The .pdb file format

The PDB (Protein Data Bank) file format is a text format describing the structure of macromolecules incorporated in the database.

- Description and annotation of the structures of proteins and nucleic acids, including atomic coordinates, side-chain rotamers, secondary structure elements, and atomic connectivity.
- Structures often contain other molecules as well, such as water, ions, ligands, etc. These are also described in the pdb format.

Format description:

<http://www.wwpdb.org/documentation/format33/v3.3.html>

# PDB ID: unique identifier

Each atomic coordinate file in the Protein Data Bank has a unique identifier composed of exactly 4 characters. The first one is always a number, the rest can be either a number or a letter.

There are over 400,000 possible 4-digit PDB IDs (419,904 or 466,560 if "0" can also be the first character). Currently there are approx. 120,000 entries.

## Examples:

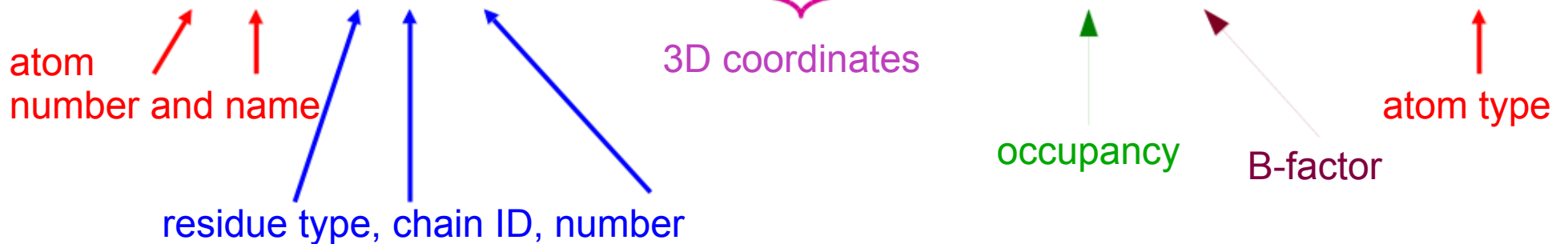
- 1mbn - 1973, the first protein structure model, **myoglobin**
- 1tna - 1975, the first RNA structure, **yeast phenylalanine transfer RNA**
- 1bna - 1980, the first **B-DNA** double helix structure (determined using X-ray  
27 years after the 1953 theoretically determined structural model of  
Watson & Crick)
- 2hhd - human **hemoglobin**, (deoxy form)
- 9ins - **insulin**

# The .pdb file format

```
HEADER      EXTRACELLULAR MATRIX                22-JAN-98   1A3I
TITLE       X-RAY CRYSTALLOGRAPHIC DETERMINATION OF A COLLAGEN-LIKE
TITLE       2 PEPTIDE WITH THE REPEATING SEQUENCE (PRO-PRO-GLY)
...
EXPDTA      X-RAY DIFFRACTION
AUTHOR      R.Z.KRAMER,L.VITAGLIANO,J.BELLA,R.BERISIO,L.MAZZARELLA,
AUTHOR      2 B.BRODSKY,A.ZAGARI,H.M.BERMAN
...
REMARK 350 BIOMOLECULE: 1
REMARK 350 APPLY THE FOLLOWING TO CHAINS: A, B, C
REMARK 350   BIOMT1   1  1.000000  0.000000  0.000000          0.00000
REMARK 350   BIOMT2   1  0.000000  1.000000  0.000000          0.00000
...
SEQRES      1  A      9  PRO PRO GLY PRO PRO GLY PRO PRO GLY
SEQRES      1  B      6  PRO PRO GLY PRO PRO GLY
SEQRES      1  C      6  PRO PRO GLY PRO PRO GLY
...
ATOM        1  N      PRO A    1          8.316  21.206  21.530  1.00 17.44          N
ATOM        2  CA     PRO A    1          7.608  20.729  20.336  1.00 17.44          C
ATOM        3  C      PRO A    1          8.487  20.707  19.092  1.00 17.44          C
ATOM        4  O      PRO A    1          9.466  21.457  19.005  1.00 17.44          O
ATOM        5  CB     PRO A    1          6.460  21.723  20.211  1.00 22.26          C
...
HETATM     130  C      ACY      401          3.682  22.541  11.236  1.00 21.19          C
HETATM     131  O      ACY      401          2.807  23.097  10.553  1.00 21.19          O
HETATM     132  OXT   ACY      401          4.306  23.101  12.291  1.00 21.19          O
...
```

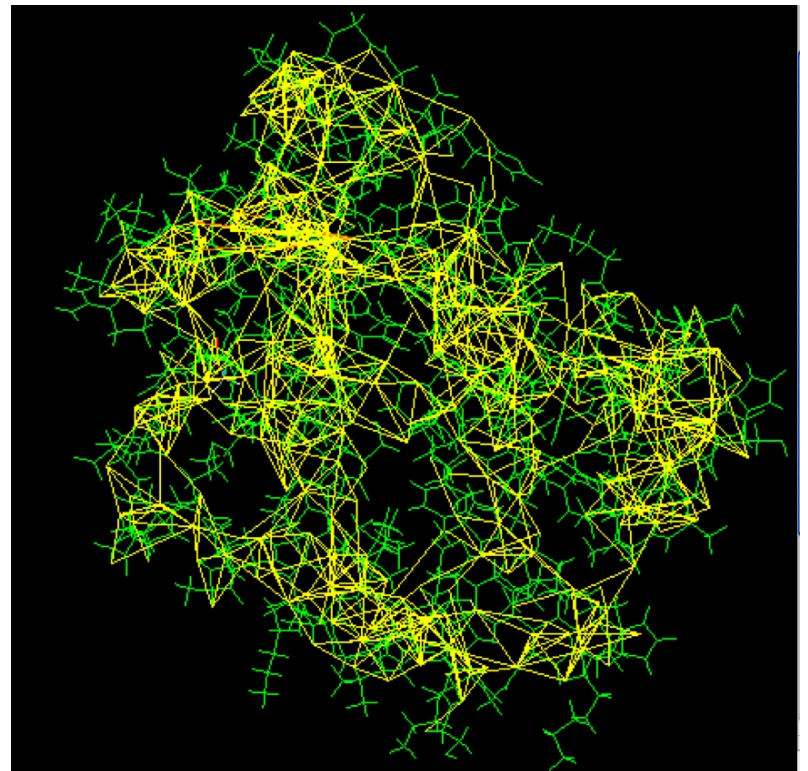
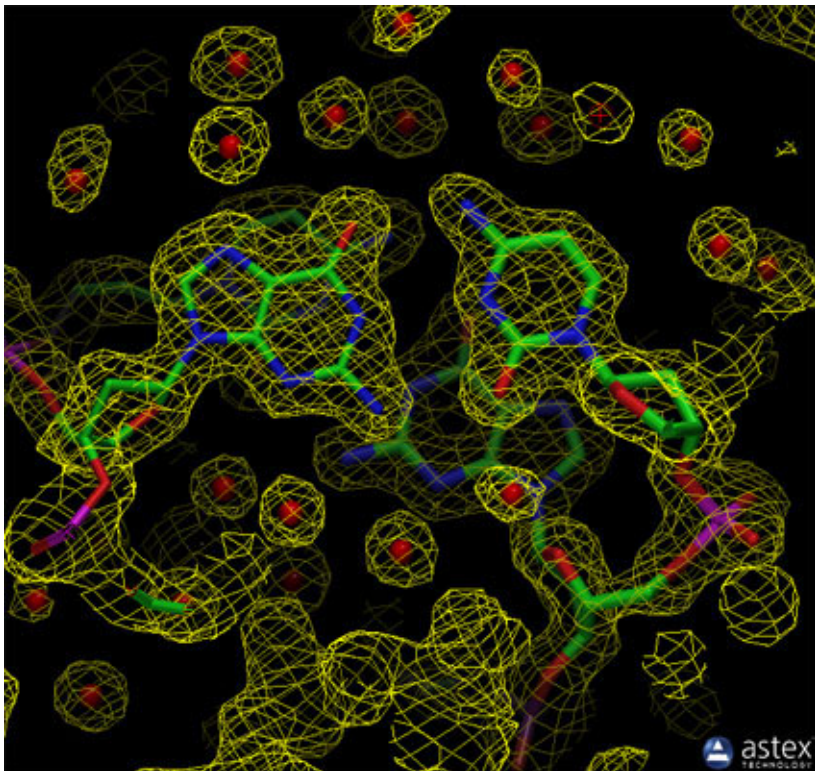
# The .pdb file format

ATOM	1	N	ARG	A	774	-31.629	7.797	92.108	1.00	71.22	N
ATOM	2	CA	ARG	A	774	-31.385	8.882	91.101	1.00	71.34	C
ATOM	3	C	ARG	A	774	-29.888	9.183	90.975	1.00	70.56	C
ATOM	4	O	ARG	A	774	-29.474	10.339	91.042	1.00	71.34	O
ATOM	5	CB	ARG	A	774	-32.139	10.161	91.504	1.00	71.23	C
ATOM	6	CG	ARG	A	774	-33.305	10.546	90.582	1.00	74.01	C
ATOM	7	CD	ARG	A	774	-34.689	10.154	91.158	1.00	79.24	C
ATOM	8	NE	ARG	A	774	-35.050	10.873	92.400	1.00	83.50	N
ATOM	9	CZ	ARG	A	774	-36.024	10.514	93.259	1.00	84.49	C
ATOM	10	NH1	ARG	A	774	-36.947	9.596	92.924	1.00	80.65	N
ATOM	11	NH2	ARG	A	774	-36.117	11.134	94.447	1.00	84.25	N
ATOM	12	N	ASP	A	775	-29.076	8.139	90.843	1.00	70.24	N
ATOM	13	CA	ASP	A	775	-27.627	8.302	90.918	1.00	71.14	C
ATOM	14	C	ASP	A	775	-27.042	8.263	89.530	1.00	68.46	C
ATOM	15	O	ASP	A	775	-26.321	9.177	89.118	1.00	67.65	O



# Model

All protein structures are models! Structures are not directly measured, but are generated as models that best fit the collected experimental data.



# Resolution (X-ray)

- Describes the reliability of determined atomic coordinates

## Very low: >4Å

Individual coordinates cannot be interpreted

## Low: 3.0-4.0Å

The fold is recognizable

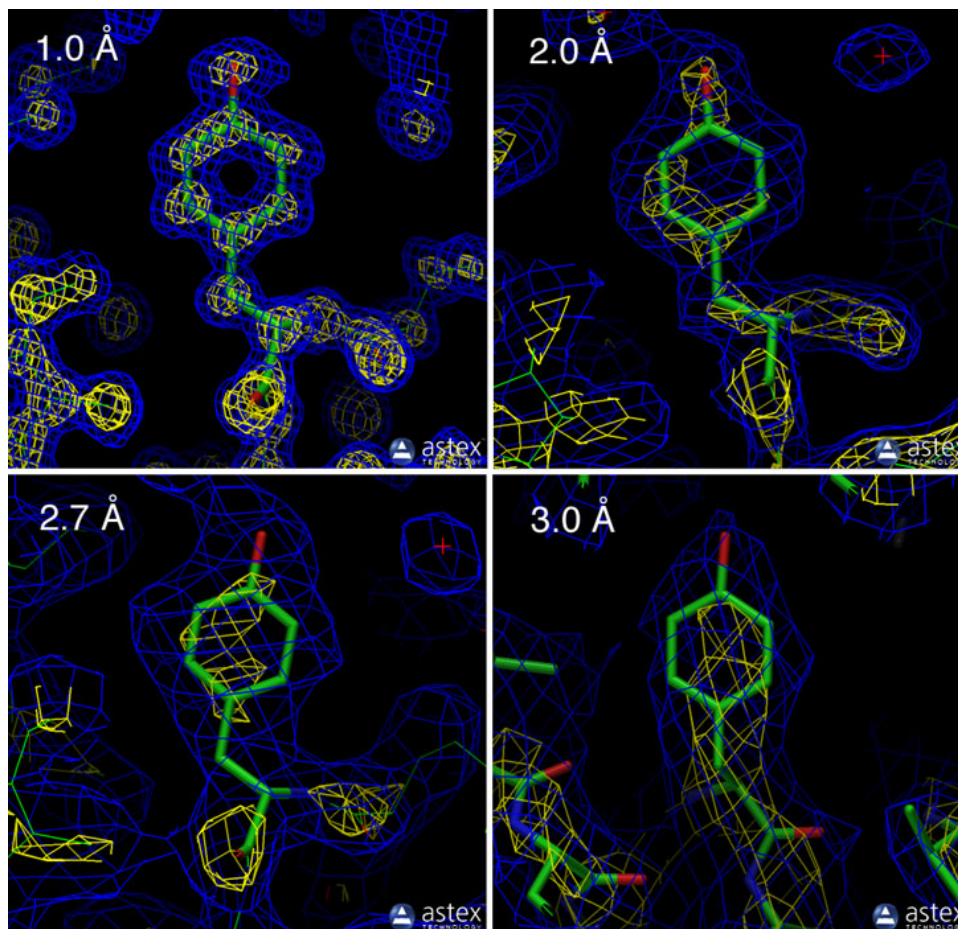
## Average: 1.8-3.0Å

The majority of the structure is correct, with incorrect rotamers and unreliable surface loop conformations

## Good: 1.0 – 1.8Å

## Atomic level: <1.0Å

Resolution can change for each position!



# Describing structure quality

**Expected distribution:**

**Based on small molecules**

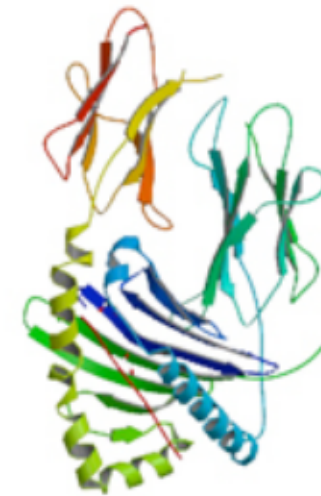
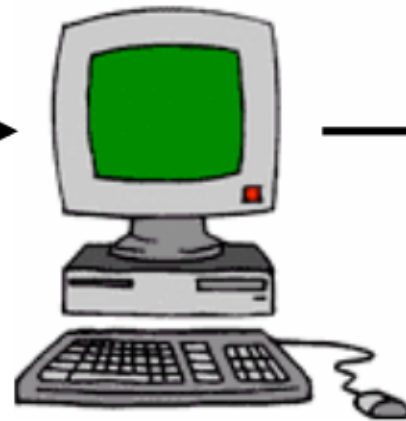
**Based on known, high quality structures**

**Possible parameters**

- Correct bond lengths and bond angles
- No atom-atom clashes
- Most buried amid groups form H-bonds
- Based on main chain conformational properties

# Visualizing protein structures

1. PDB coordinate file



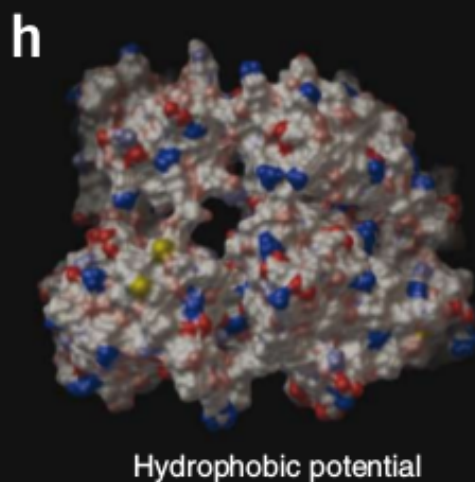
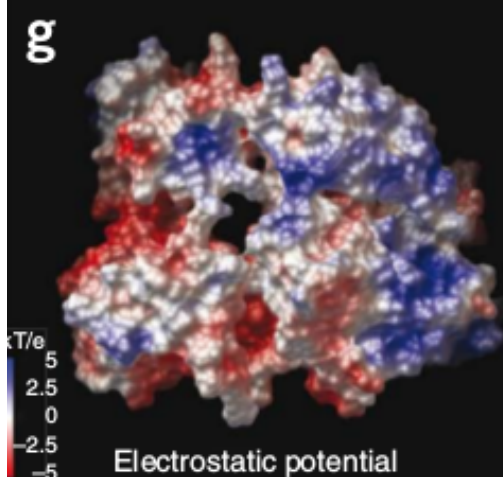
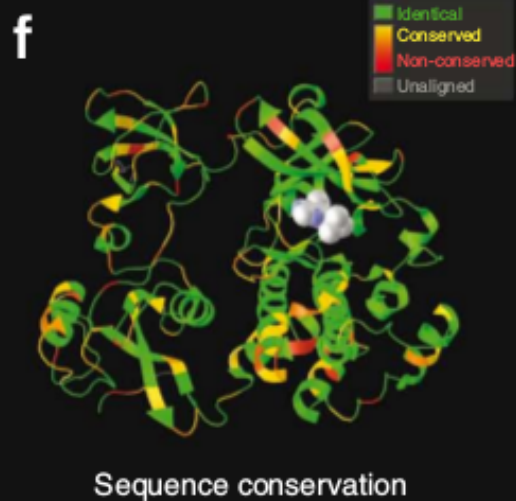
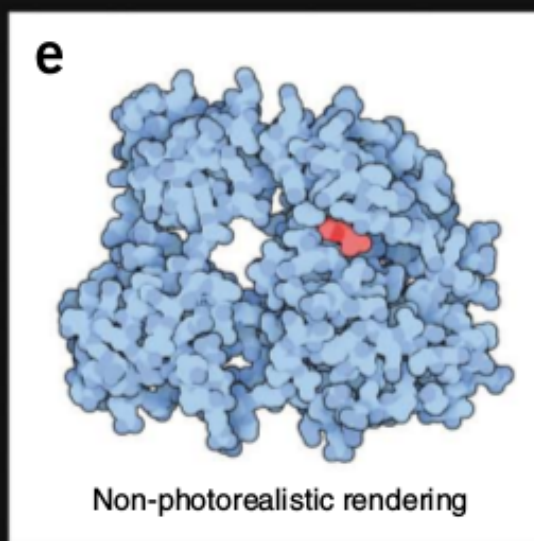
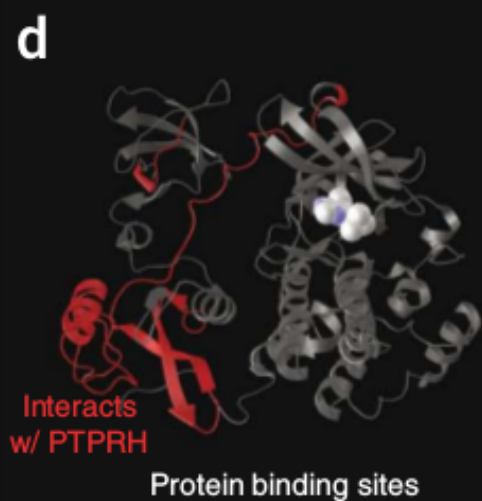
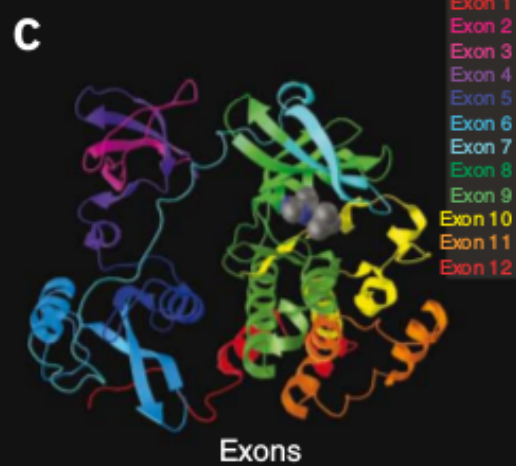
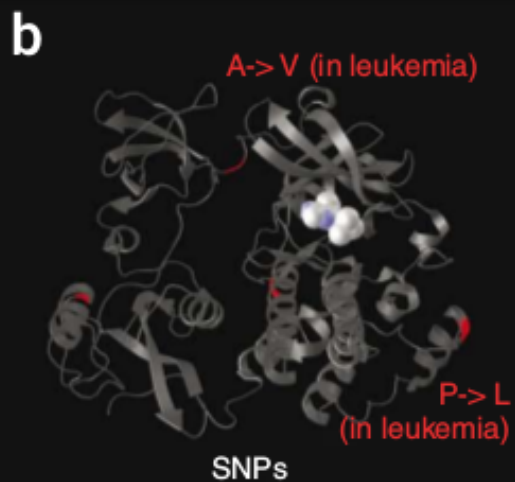
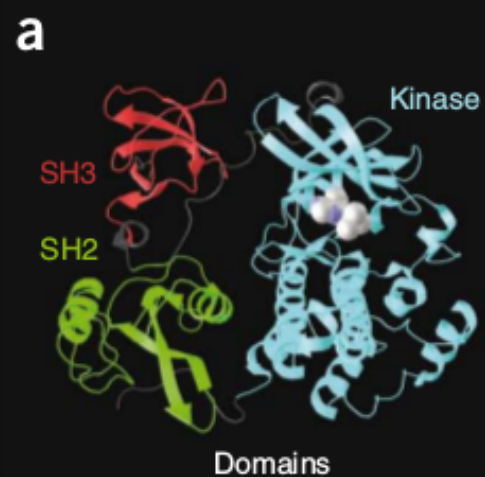
3. Computer

4. Molecule image

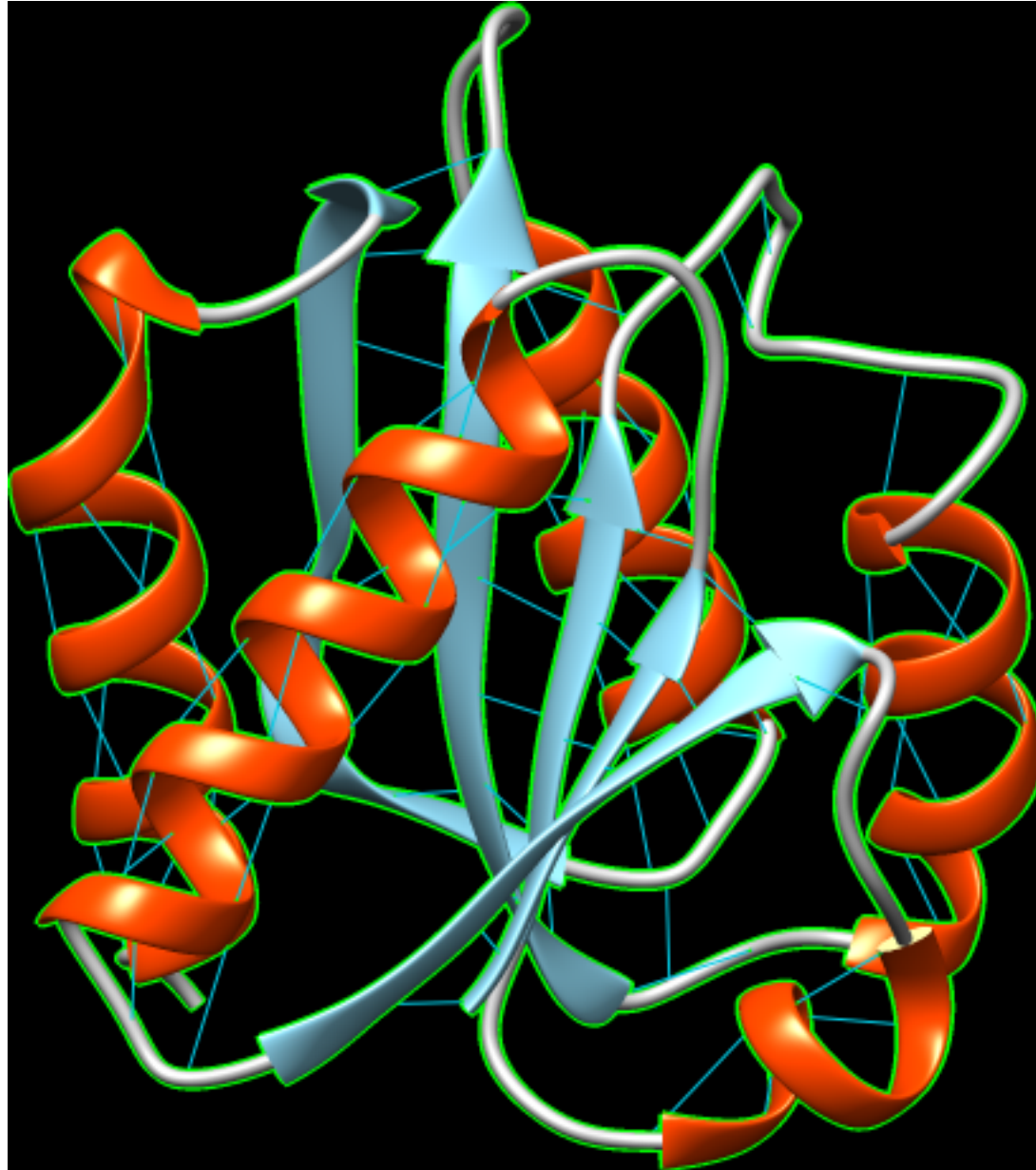
2. Visualization program

Eg.: Rasmol, Pymol, Chimera,  
VMD, Jmol, Swiss PDB viewer





# Secondary structures are stabilized by H-bonds



# Secondary structure determination

Can be based on:

- H-bond patterns
- Dihedral angles

Automatic determination using algorithms

- DSSP

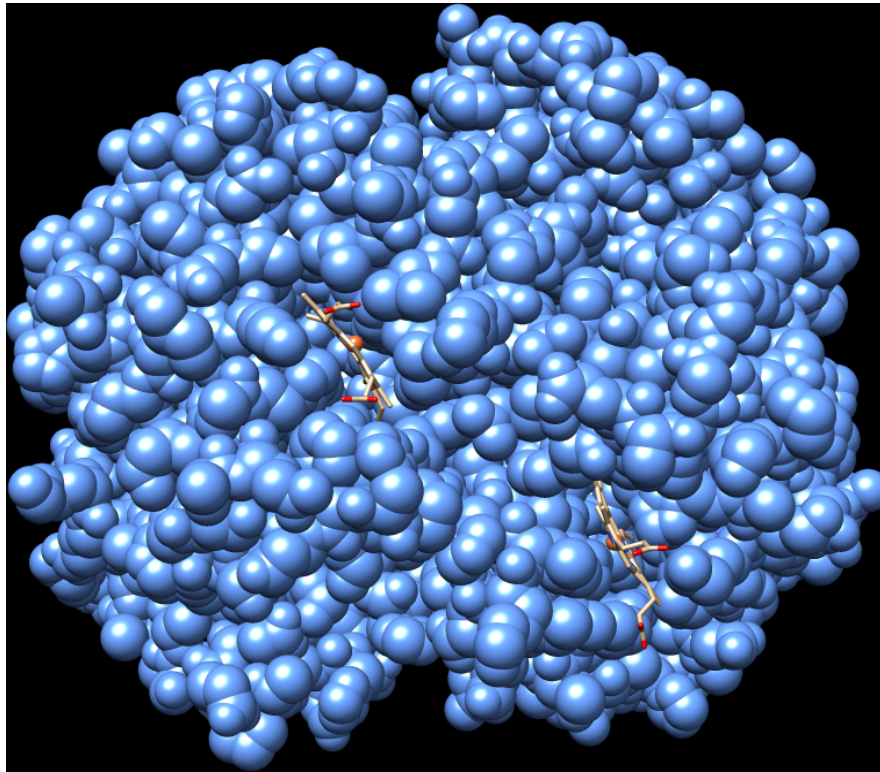
- STRIDE

3 (alpha, beta, coil)

or more categories (e.g. turn, other helix types)

Do not agree 100%

# The inside of the protein is tightly packed

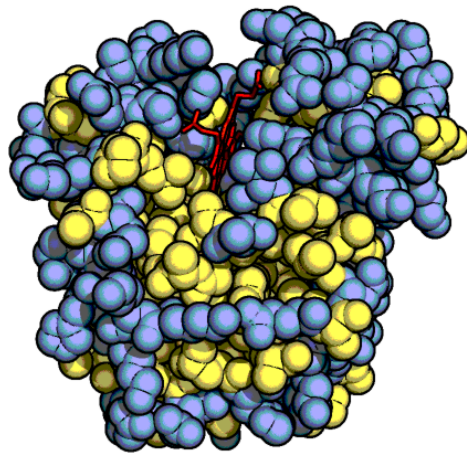


# Hydrophobic core

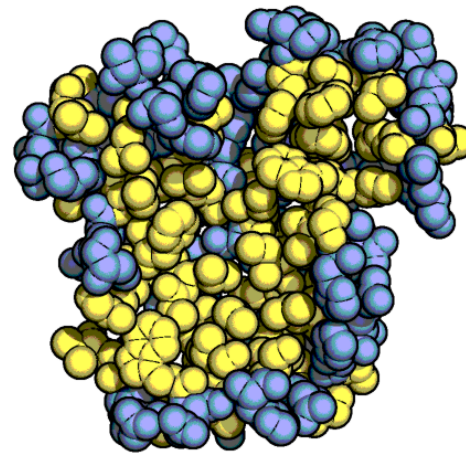
Hydrophobic side chains go into the core of the molecule – but the main chain is highly polar.

The polar groups (C=O and NH) are neutralized through formation of H-bonds.

Myoglobin

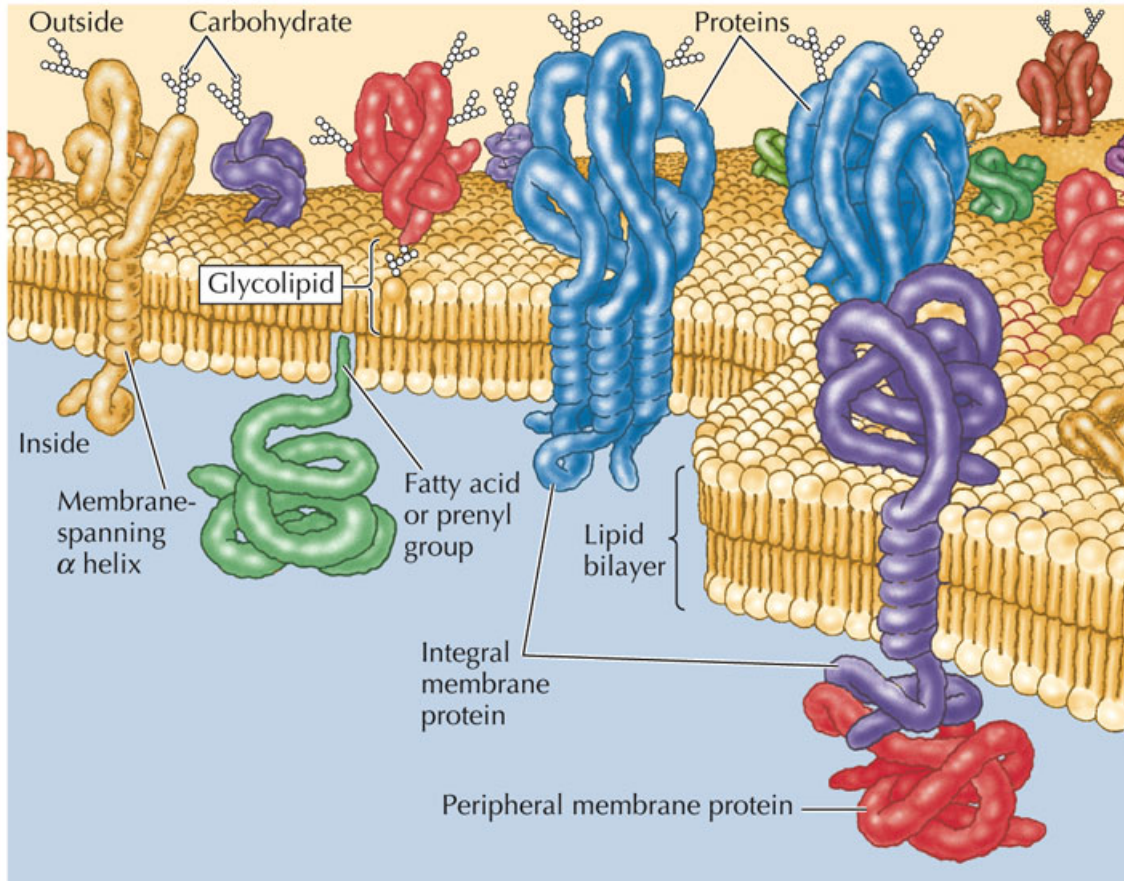


surface



buried

# Membrane proteins



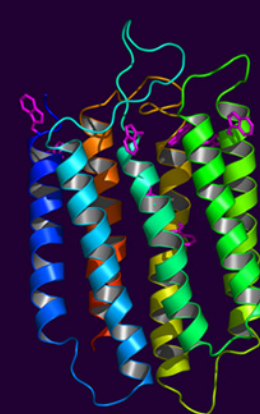
THE CELL, Fourth Edition, Figure 2.25 © 2006 ASM Press and Sinauer Associates, Inc.

## Important for:

Energy production  
Transport  
Cell-cell junction  
Signaling

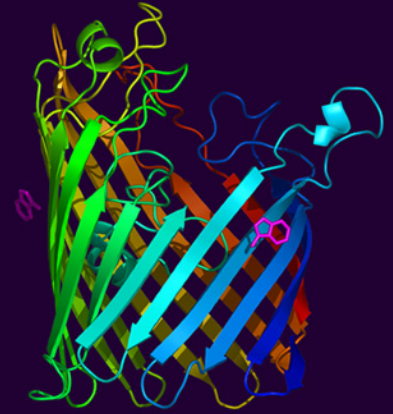
Drug targets

The known structures of transmembrane proteins belong to two classes, based on their transmembrane secondary structure.



$\alpha$ -helical Bundles

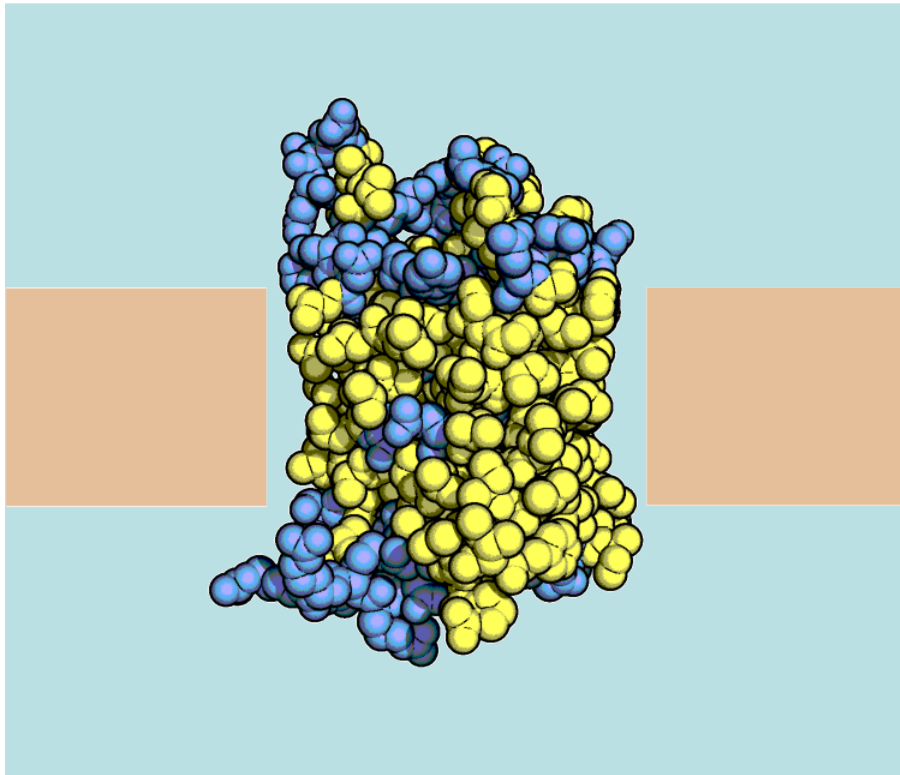
Example Bacteriorhodopsin (PDB 1AP9)



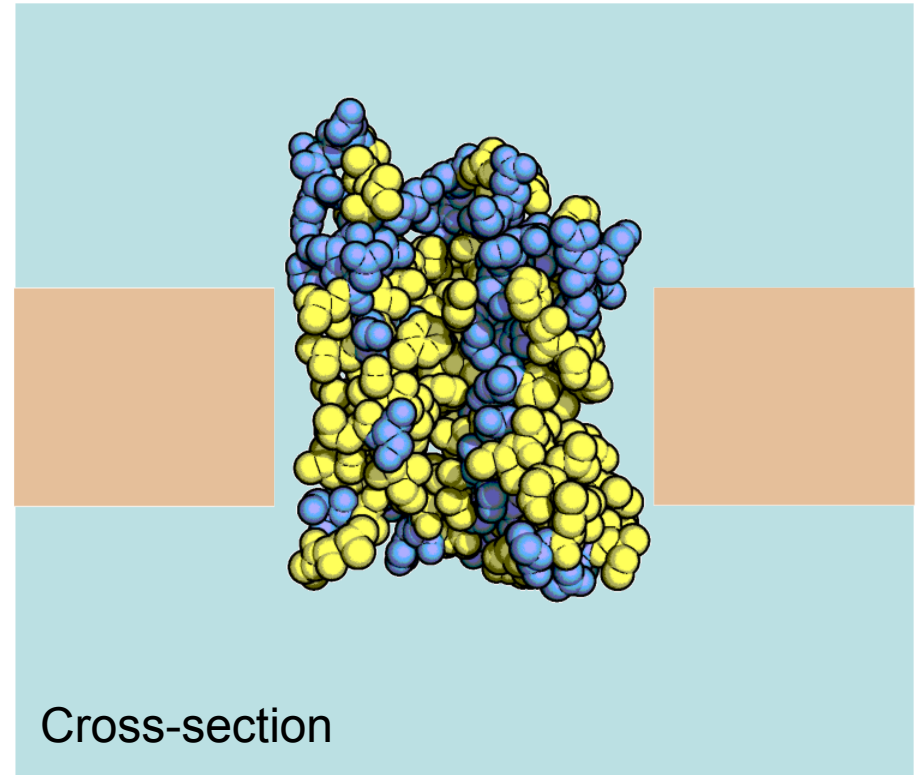
$\beta$ -Barrels

Example: Matrix Porin (PDB 1OMF, Subunit)

# Hydrophobicity of membrane proteins

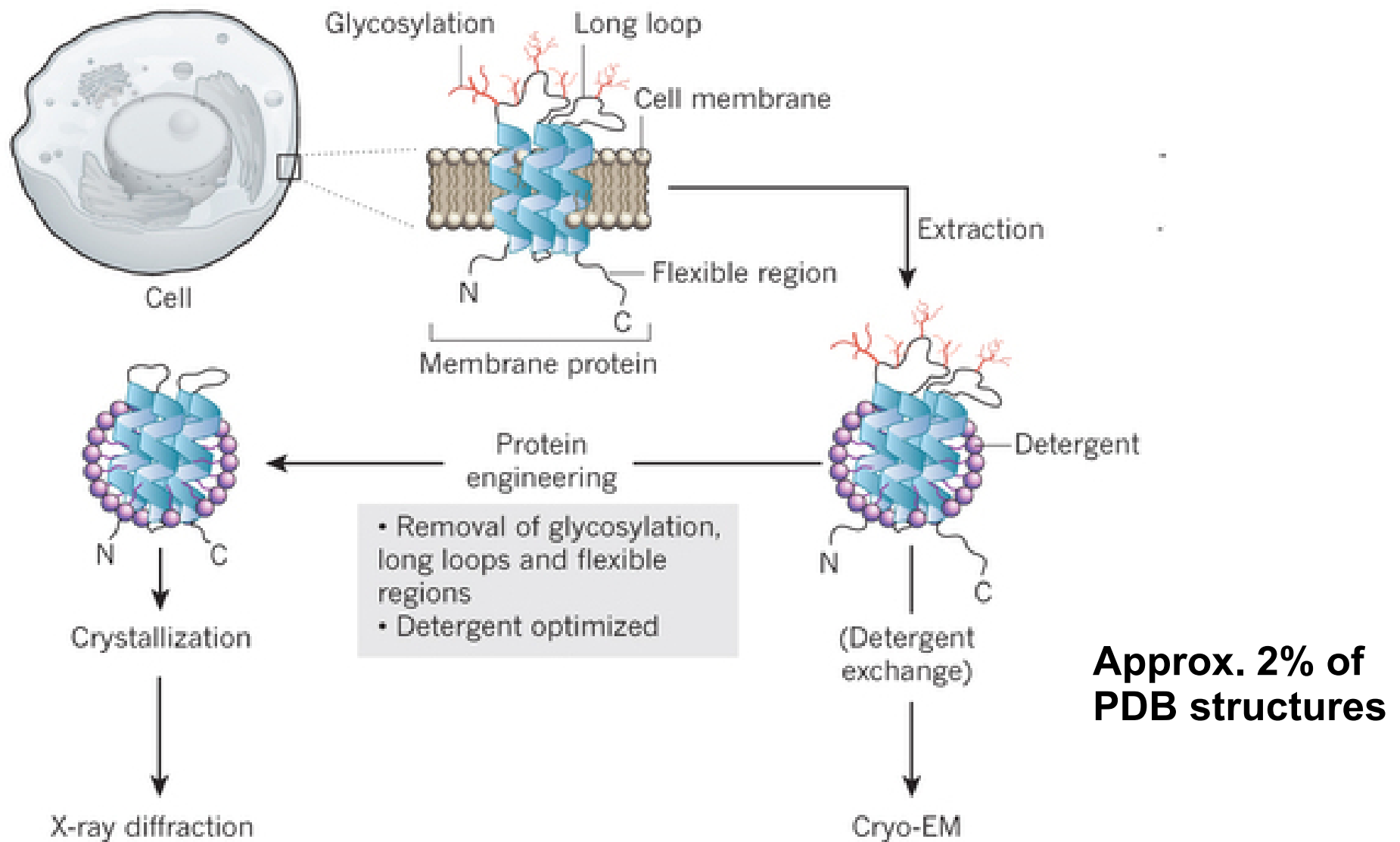


Aquaporin



Aquaporin

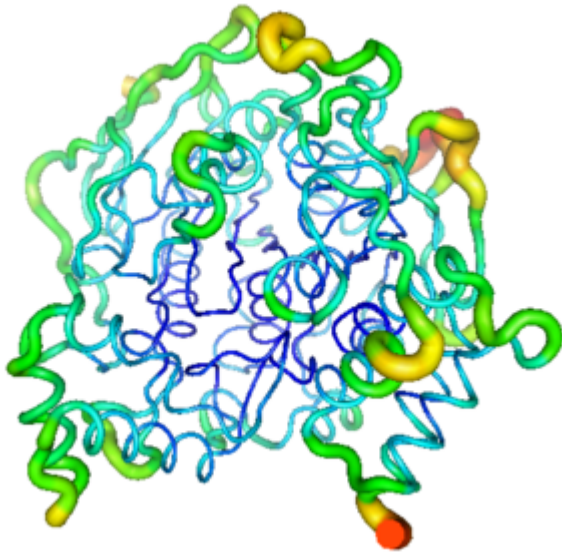
# Structure determination of transmembrane proteins



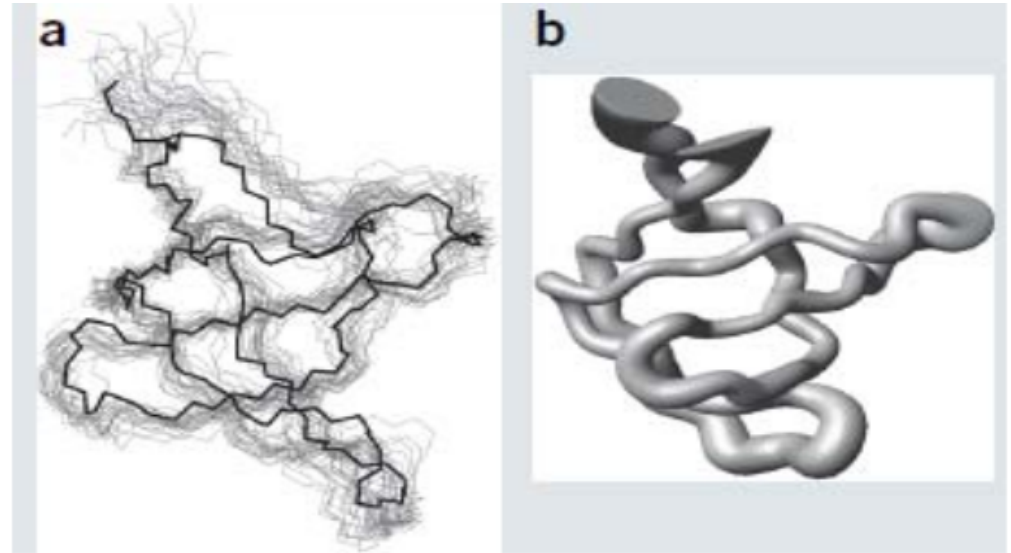


# Proteins are dynamic molecules

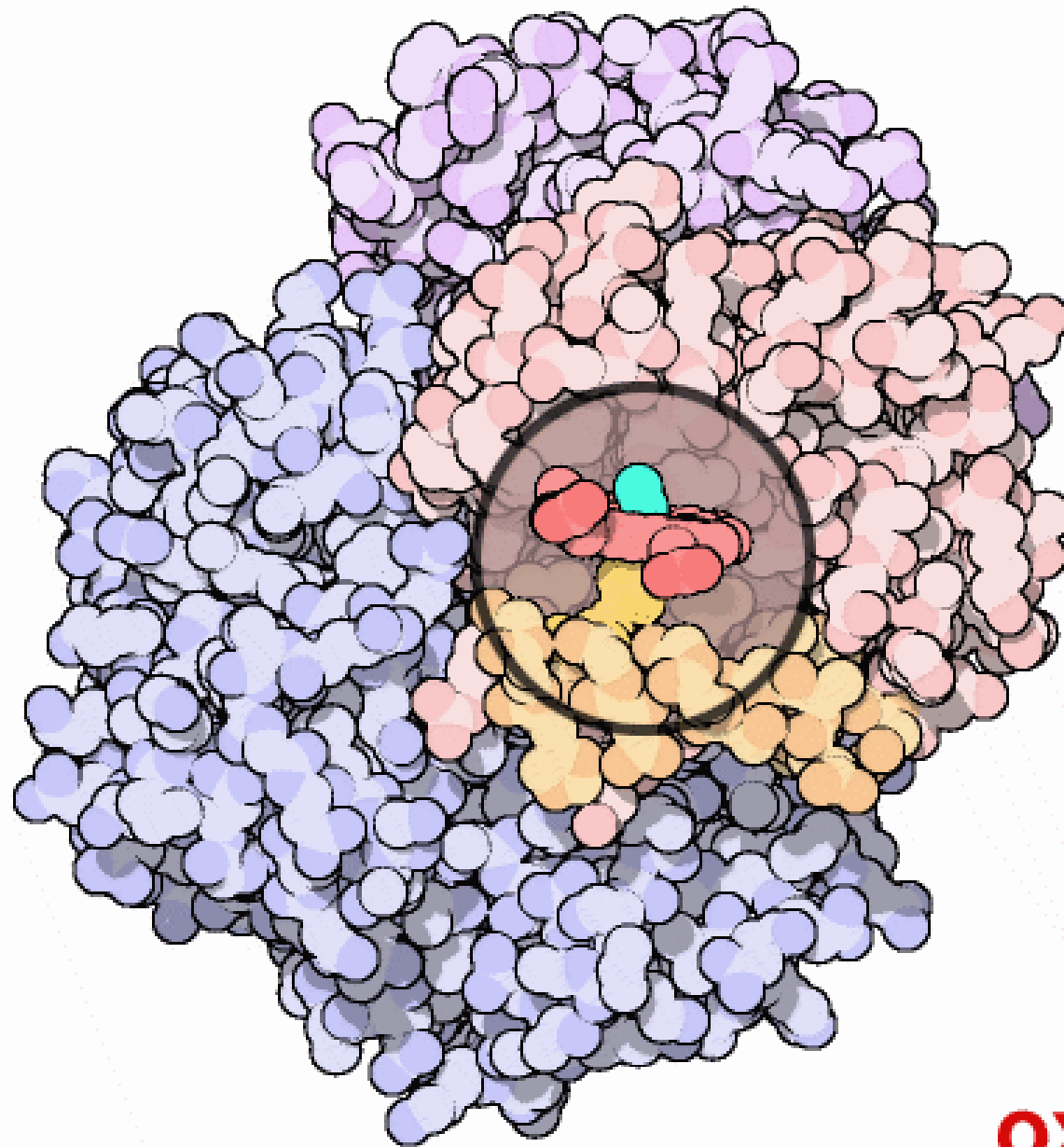
X-ray  
B-factor



NMR  
Structural variability



# Conformational changes



**oxy**

# Missing structure parts



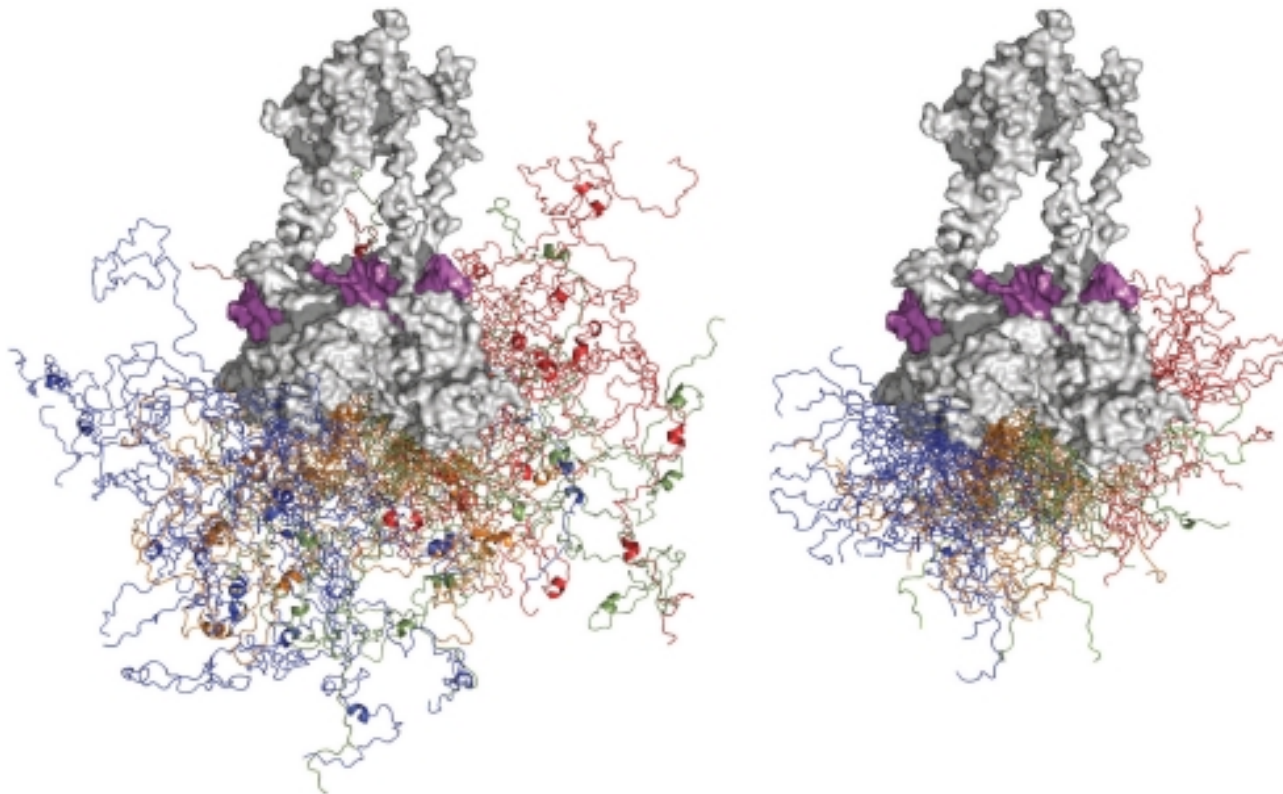
Missing regions in the protein structure



NMR structures with high structural variability

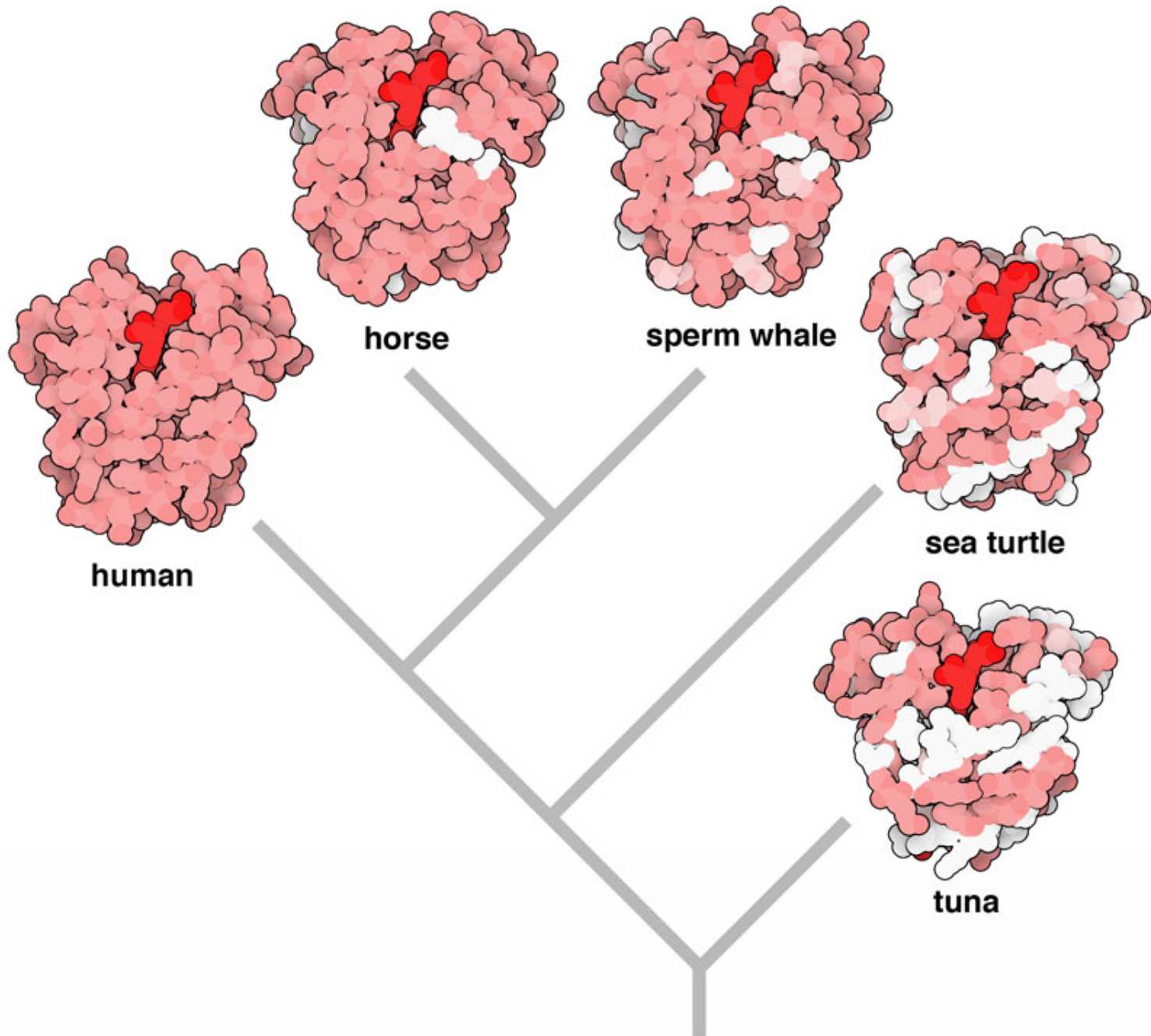
# Intrinsically disordered proteins

Do not form a well-defined structure on their own under native(-like) conditions

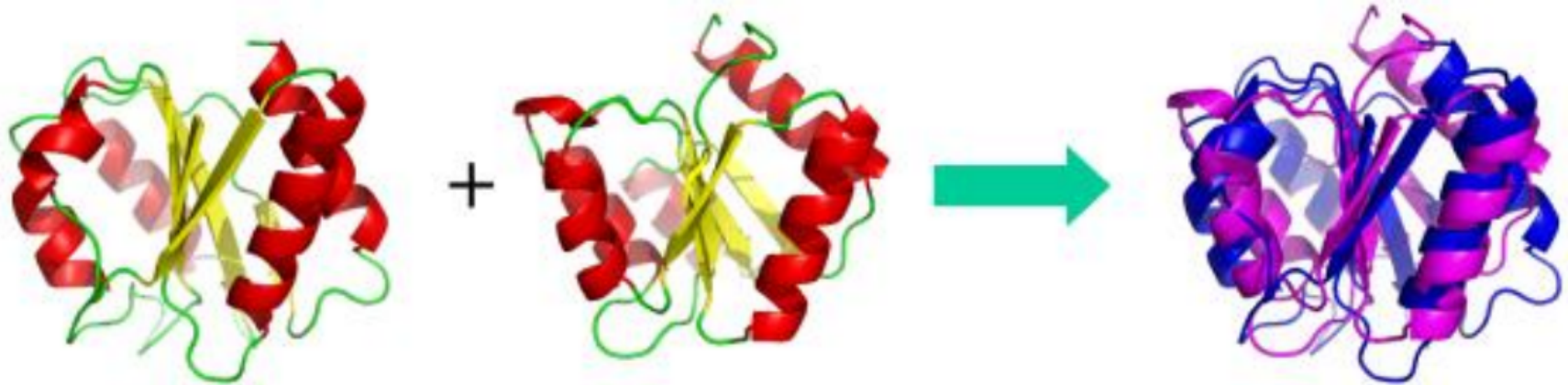


Human p53

# Globin evolution

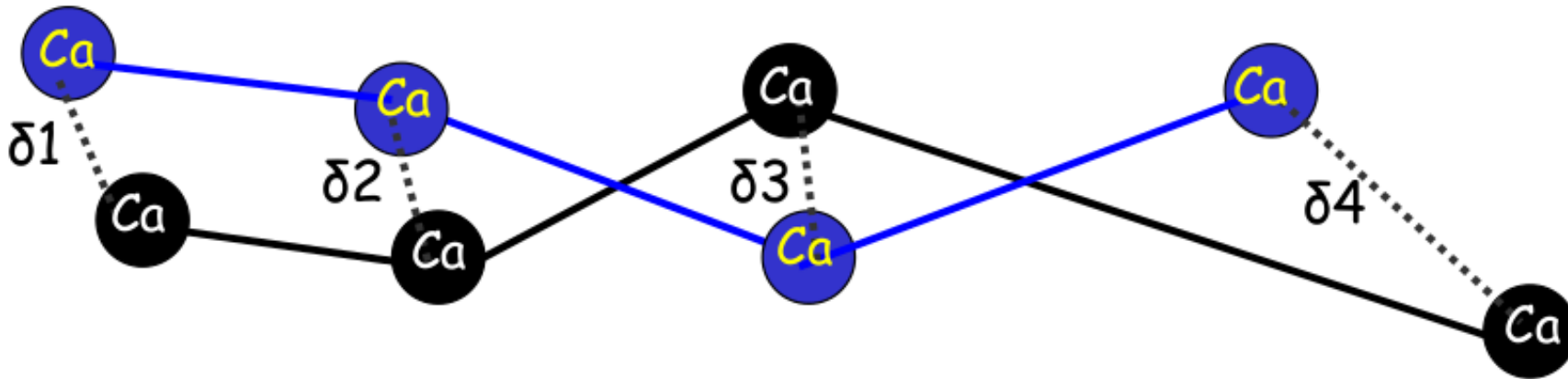


# Similarity between two structures



**Superposition:** minimizing distances between positions

# RMSD



## Root Mean Square Deviation (RMSD):

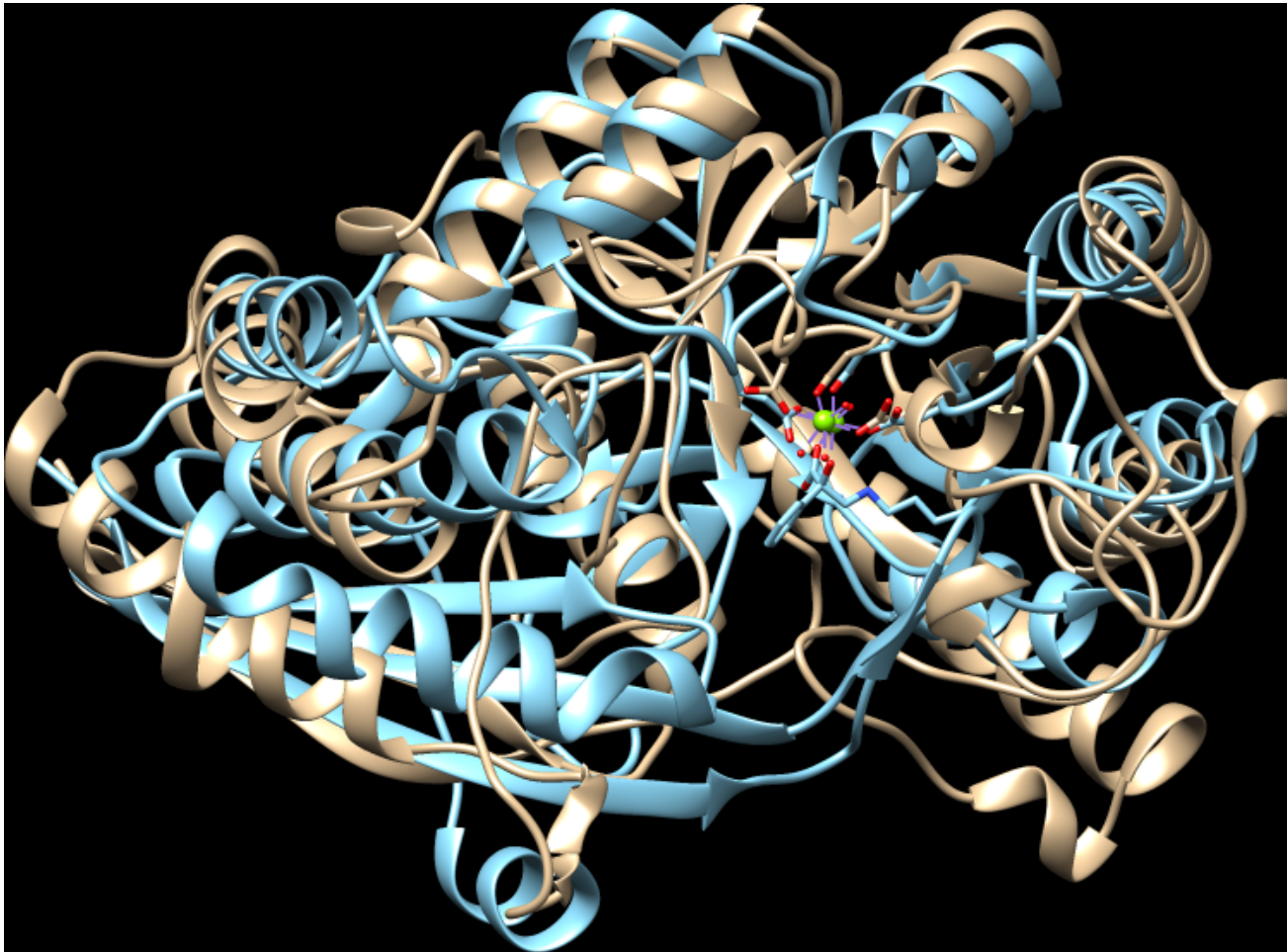
The most commonly used function for measuring structural similarity

RMSD is the average distance between equivalent atoms of superimposed structures

$$RMSD = \sqrt{\frac{1}{N} \sum_{i=1}^{i=N} \delta_i^2}$$



# Structures of evolutionarily related proteins are usually similar



1ebhA: enolase

1mns : mandelate racemase

Sequence identity: 25%

Active center is very similar

Similar chemical reactions

Different substrate



# Sequence-structure relationship

The structure is usually more conserved than the sequence

Structures typically tolerate more mutations

Due to physical effects some structures are more common

Analogue

The number of folds is limited

Currently around 1,200 folds

# Structural classification

We can group similar and evolutionarily related protein structures using classification

Example

CATH

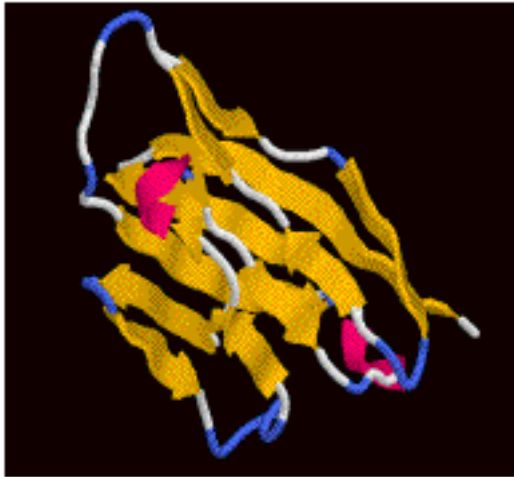
<http://www.cathdb.info/>

SCOP

<http://scop2.mrc-lmb.cam.ac.uk/>

# Structural classes

All  $\beta$



All  $\alpha$



$\alpha/\beta$



$\alpha+\beta$



# Fold - topology

Proteins belonging to the same fold contain roughly the same secondary structure elements in the same order and similar spatial configuration.



globin



trefoil



up-down



immunoglobulin



$\alpha\beta$  sandwich



jelly roll



doubly wound



UB  $\alpha\beta$  roll



TIM barrel

# Homolous and analogous structures

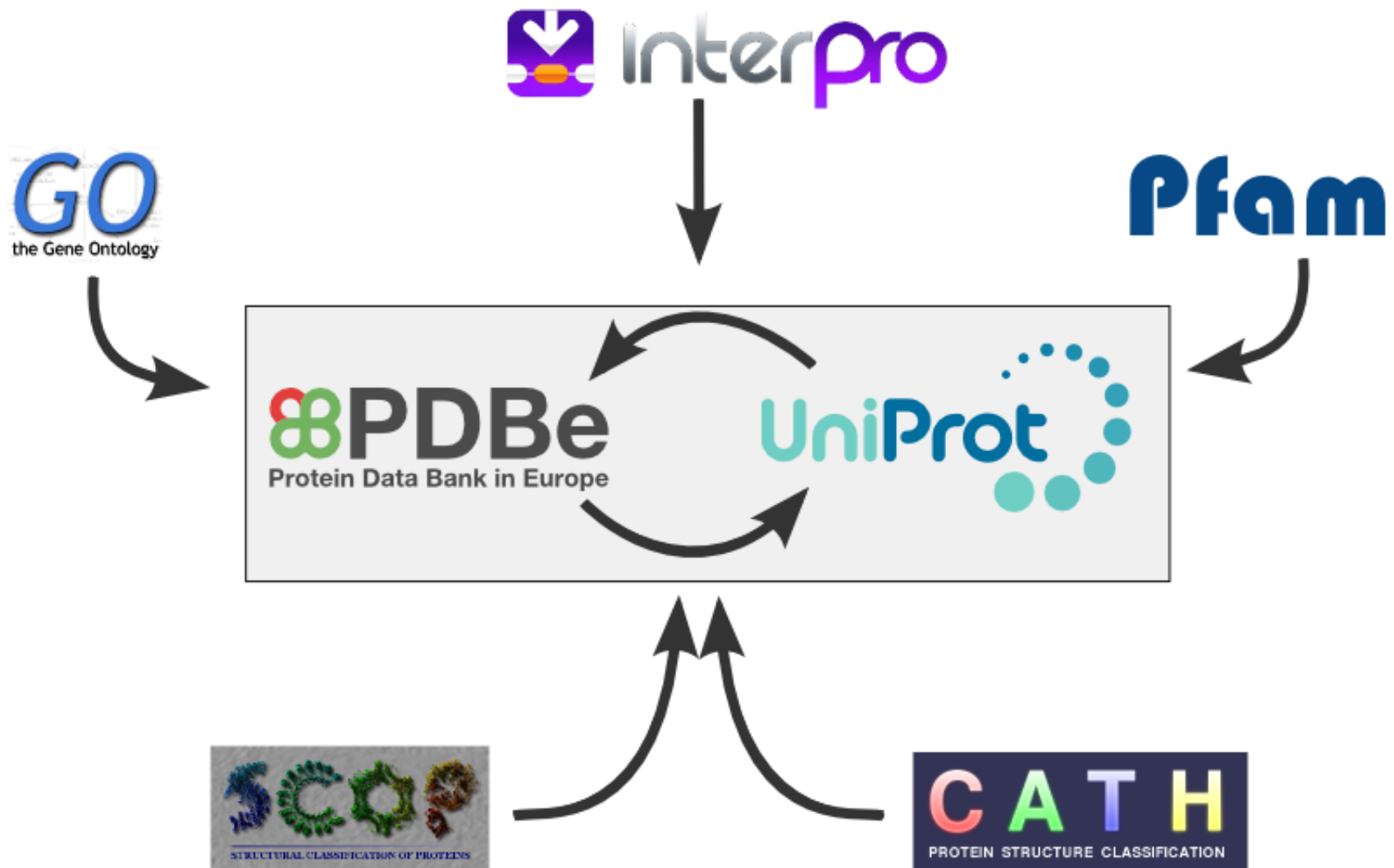
Homolous proteins evolved from a common ancestor via divergence, and share the same fold

Analogous proteins share the same fold but do not have an evolutionary relationship (or it is undetectable)

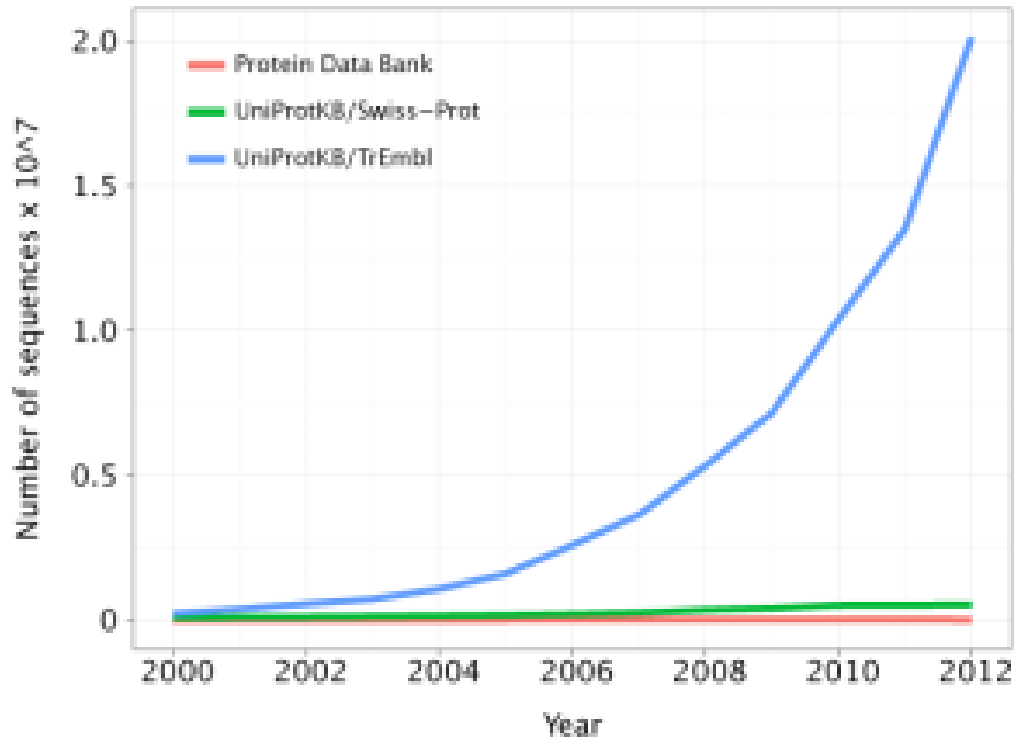
Some folds are more common (due to physical effects)

Number of folds is limited (1-2,000 folds)

# Cross-references with other databases



# Sequence-structure gap

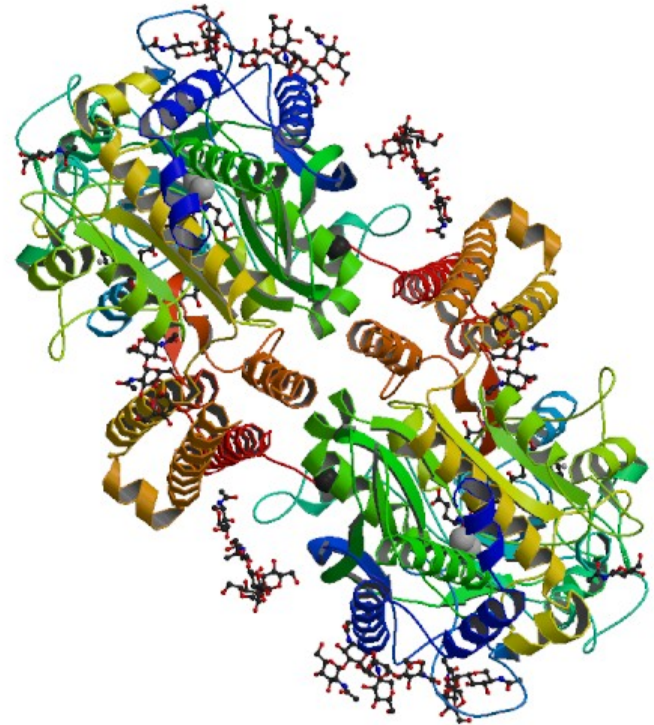
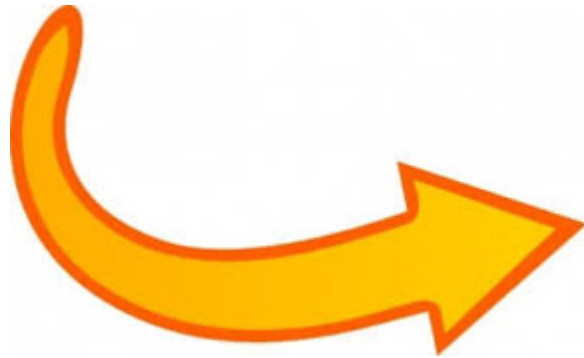


	2014
Sequences	50,000,000
Structures	100,000

# Tertiary structure predictions

>Protein

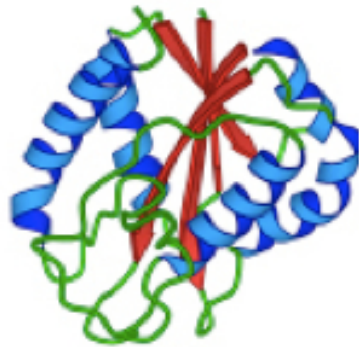
```
RSKSSNEATNITPKHNMKAFLDELKAENIKKFLYNFTQIPHLAGTEQNFQLAKQIQSQWKEFGLDSVELAHYDVLLSYPN  
KTHPNYISIIINEDGNEIFNTSLFEPPPPGYENVSDIVPPPSAFSPQGMPEGLVYVNYARTEDFFKLERDMKINCSGKIV  
IARYGKVFRGNKVKNAQLAGAKGVILYSDPADYFAPGVKSYPDGWNLPGGGVQRGNILNLNGAGDPLTPGYPANEYAYRR  
GIAEAVGLPSIPVHPIGYIDAQKLLLEKMGGSAAPPDSSWRGSLKVPYNVGPFGFTGNFSTQKVKMHIHSTNEVTRIYNVIGT  
LRGAVEPDRYVILGGHRDSWVFGGIDPQSGAAVVHEIVRSFGTLKKEGWRPRRTILFASWDAEEFGLLGSTEWAEENSRL  
LQERGVAYINADSSIEGNYTLRVDC TPLMYSLVHNLTKELKSPDEGFEGKSLYESWTKKSPSPEFSGMPRISKLGSGNDF  
EVFFQRLGIASGRARYTKNWETNKFSGYPLYHSVYETYELVEKFYDPMFKYHLTVAQVRGGMVFELANSIVLPFDCRDYA  
VVLRYADKIYSISMKHPQEMKTYSVSFDLSLFAVKNFTEIASKFSERLQDFDKSNPIVLRMMNDQLMFLERAFIDPLGL  
PDRPFYRHVIYAPSSHNKYAGESFPGIYDALFDIESKVDPSKAWGEVVKRQIYVAAFTVQAAAETLSEVA
```





# Protein folding

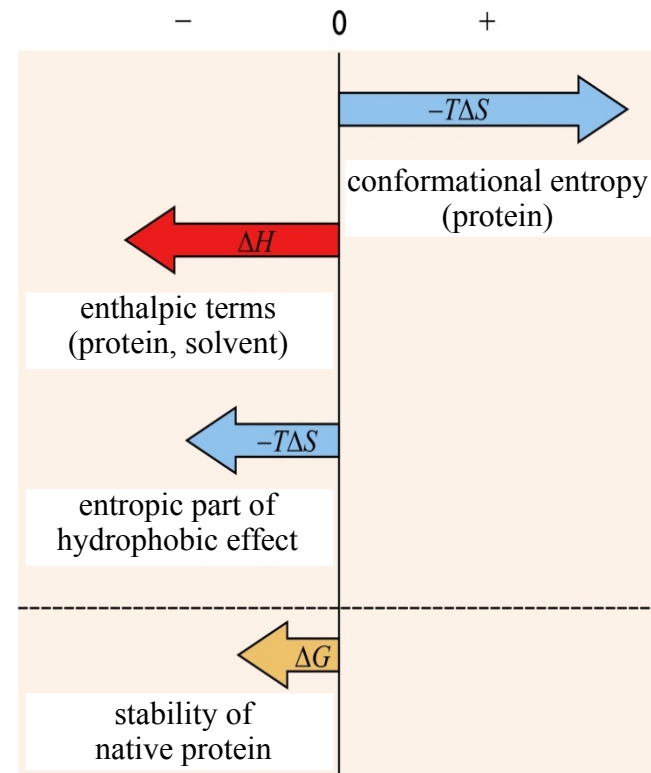
GFCHIKAYTRLIMVG...



## Folding

(physics)

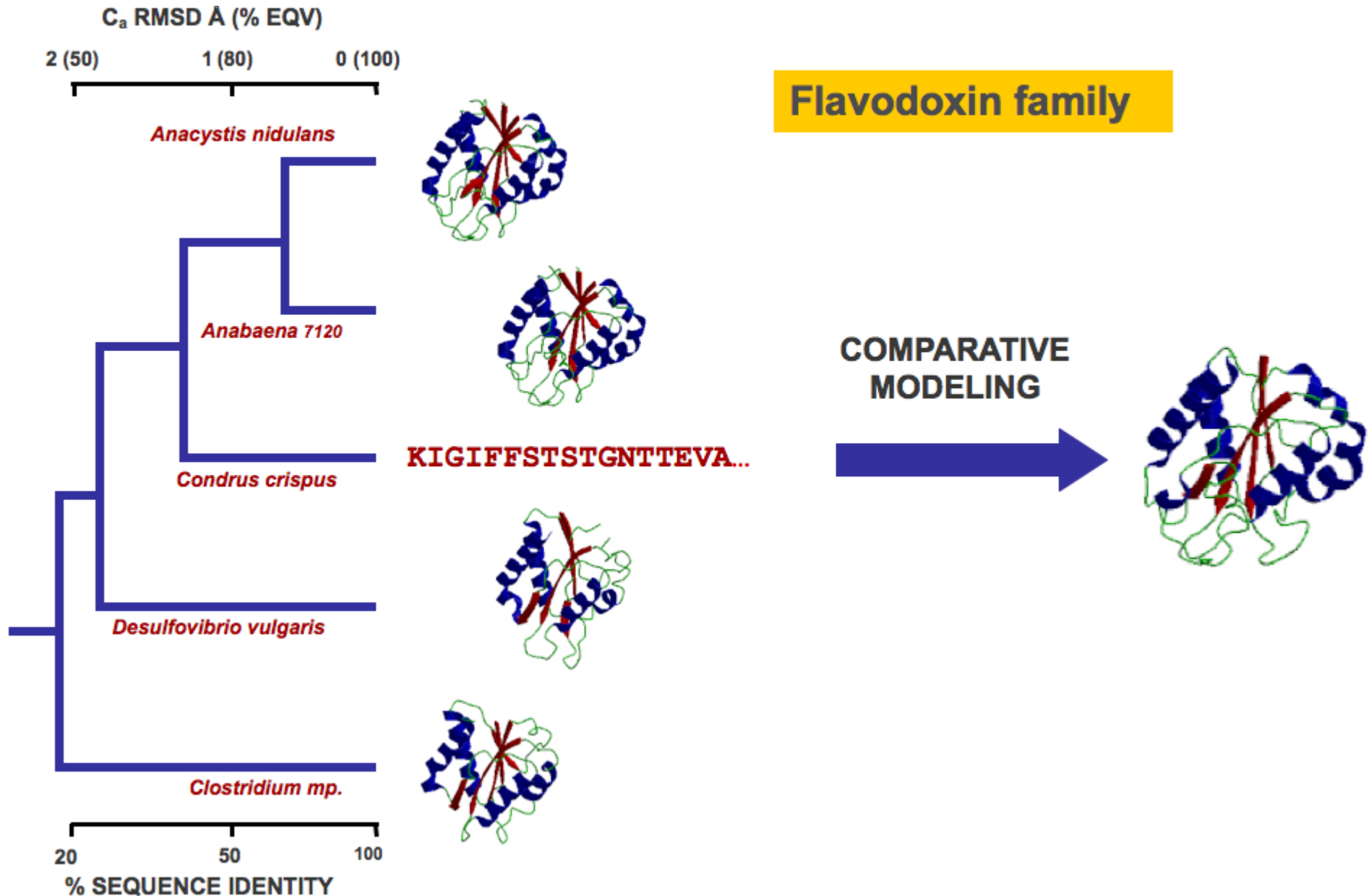
$$\Delta G = \Delta H - T\Delta S$$



# Determining tertiary structure based on physical principles

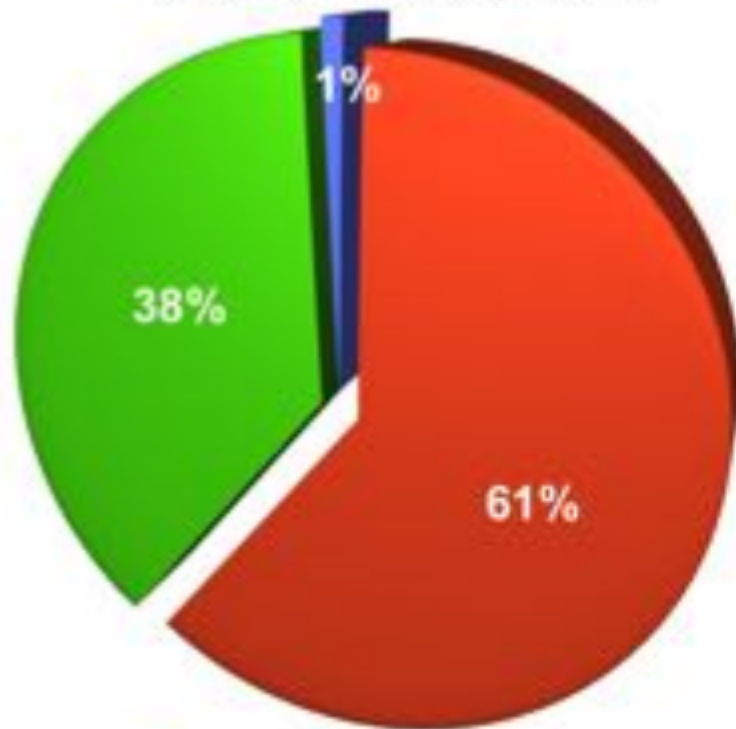
- large number of conformations, huge conformational space
- the physical energy function is not known exactly

# Comparative structure modeling



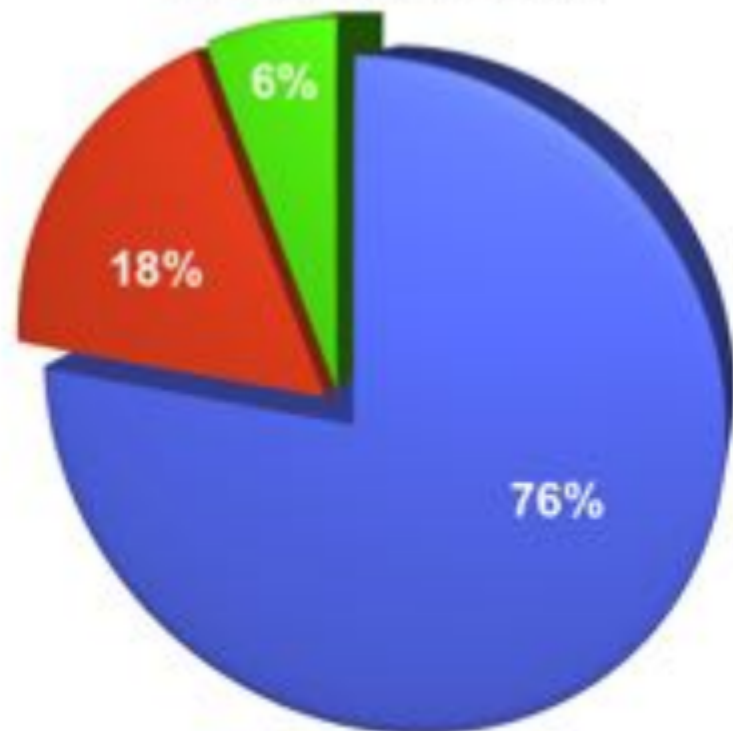
# Structural coverage

Sources of 3D structural information for all known sequences



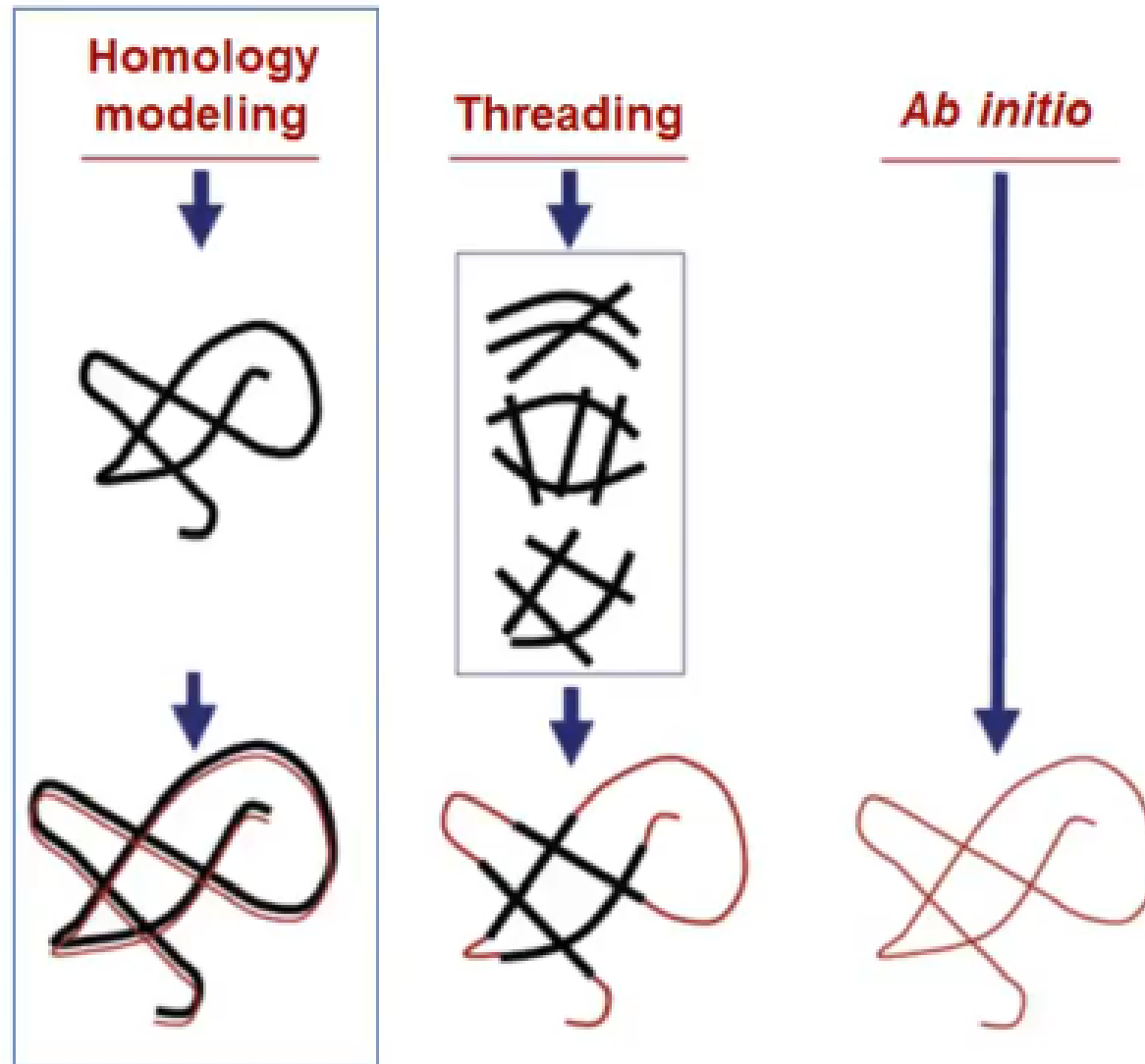
- Experimental Structure
- Comparative Model
- Unknown/Other

Sequence identity of these comparative models



- Under 30%
- 30-40%
- Over 40%

# Tertiary structure prediction approaches





The Nobel Prize in Chemistry 2013

Martin Karplus, Michael Levitt, Arieh Warshel

# The Nobel Prize in Chemistry 2013



© Harvard University

Martin Karplus



Photo: © S. Fisch

Michael Levitt



Photo: Wikimedia Commons

Arieh Warshel

The Nobel Prize in Chemistry 2013 was awarded jointly to Martin Karplus, Michael Levitt and Arieh Warshel *"for the development of multiscale models for complex chemical systems"*.

M.L.:

It's sort of nice in more general terms to see that computational science, computational biology is being recognized." He added, "It's become a very large field and it's always in some ways been the poor sister, or the ugly sister, to experimental biology."

