

# Analysis of protein structures

### Outline

- Residue solvent accessibility
- Protein solubility
- Molecular interactions
- Functional sites
  - Binding sites
  - Transport pathways





□ Solvent accessible surface area (ASA, SASA or SAS, in Å<sup>2</sup>)

 $\rightarrow$  It quantifies the extent to which a residue in a protein structure is accessible to the solvent

 Typically calculated by rolling a spherical probe of a particular radius over a protein surface and summing the area that can be accessed by this probe on each residue



#### Residue solvent accessibility

- □ Solvent accessible surface area (ASA, SASA or SAS, in Å<sup>2</sup>)
- □ Solvent excluded surface (SES) also known as molecular

surface, or Connolly surface area





VdW = Van der Waals radius

#### Residue solvent accessibility

- □ Solvent accessible surface area (ASA, SASA or SAS, in Å<sup>2</sup>)
- Solvent excluded surface (SES) also known as molecular surface, or Connolly surface area – usually represented in "surface" visualization



### Residue solvent accessibility

- □ Relative accessible surface area (rASA)
  - Ratio of the actual accessible area of a given residue

 $rASA = ASA / ASA_{MAX}$ 

- Enables comparison of accessibility of different amino acids (e.g., long extended vs. spherical amino acids)
- Simplified two state description
  - Buried vs. exposed residues
  - Threshold for differentiating surface residues vs. buried is not well defined (usually rASA = 15–25 %)
  - rASA < threshold => buried

rASA ≥ *threshold* => exposed

#### Residue solvent accessibility – programs

- POLYVIEW-2D (PDB) / SABLE (sequence)
  - https://polyview.cchmc.org/ / https://sable.cchmc.org/
  - Visualization tool for structural and functional annotations of proteins, including solvent accessibility
  - Residue SASA calculated by DSSP and transformed to rASA



- Definition: concentration of protein in saturated solution that is in equilibrium with solid phase
- □ For proteins expressed in the lab: multiple factors
  - □ Hydrophilic/hydrophobic balance of the solvent-exposed residues
  - Aggregation-prone regions (APRs) mainly hydrophobic residues prone to form beta-structures
  - Protein expressibility in the cells





Cross-beta spines of amyloid fibrils

- SoluProt
  - https://loschmidt.chemi.muni.cz/soluprot/
  - Soluble expression of protein sequences in *E.coli*
  - Based on machine learning





DpaA	0.680
DIxA	0.414
DmsaA	0.409
DpaB	0.793
DsxA	0.514
DgpA	0.643
DssA	0.745
DcaA	0.170
DdaA	0.370
DhmeA	0.372
DmtA	0.160
DadA	0.126
DtaA	0.520

Output

- □ Aggrescan3D
  - http://biocomp.chem.uw.edu.pl/A3D2/
  - Predicts the aggregation propensities by identifying APRs
  - Can introduce mutations and predict the impact on stability and aggregation-propensity
  - Can account for protein flexibility ("dynamic mode")



#### □ AggreProt

- https://loschmidt.chemi.muni.cz/aggreprot/
- Identifies APRs in sequence
- ML-based tool trained on (non)amyloidogenic hexapeptides
- Structure information used to define ASA to discard buried regions



Protein solubility

# **Molecular interactions**



- □ Intra-molecular within the same protein structure
- □ Inter-molecular between different proteins in assemblies
- Essential to understand the molecular basis for function and stability of proteins and their complexes



# Types of interactions

- Charge-charge (ionic) interactions
  - Present in charged residues; ex. salt bridges
- Hydrogen bonds (H-bonds)
  - Donor and acceptor atoms sharing a hydrogen atom
- **\Box** Aromatic ( $\pi$ - $\pi$ ) interactions
  - Attractive interaction between aromatic rings
- □ Van der Waals (vdW) interactions
  - Between any two atoms; more important for non-polar residues
- Hydrophobic interactions
  - Entropic origin; important for non-polar/hydrophobic residues



Salt bridge

# Types of interactions



**□** Cation-π interactions

**Molecular** interactions

Electrostatic interaction of a positively charged residue (Lys or Arg)

with an aromatic residue (Phe, Trp, or Tyr)





polypeptide

cysteine

disulfide bridge

#### **Polar interactions**



- □ Arginine interactions
  - $\hfill\square$  Cation- $\pi$ : positively charged Arg interacts with aromatic rings
  - □ Arginine-arginine stacking: two Arg form parallel "aromatic" stacking



Molecular interactions

# Molecular interactions – how to identify?

- Criteria for recognizing various types of interactions
  - Atom types/functional group
  - Geometric rules (distances, angles)
  - Energetics (physicochemical rules)
  - Contact surface area between atoms



- □ CMView
  - https://www.bioinformatics.org/cmview/
  - Represents residue-residue contacts within a protein or between proteins in a complex in the form of a contact map
  - 3D visualization using PyMol



- ProteinTools A Toolkit to Analyze Protein Structures
  - https://proteintools.uni-bayreuth.de/
  - Identifies various types of interactions: hydrophobic clusters, electrostatic interactions (salt bridges and charge segregation), hydrogen bond networks, contact maps

#### ProteinTools - A Toolkit to Analyze Protein Structures



Molecular interactions

- □ ESBRI (Evaluating the Salt BRIdges in Proteins )
  - http://bioinformatica.isa.cnr.it/ESBRI/introduction.html
  - Analysis of salt bridges interactions (ionic interaction + H-bond)
  - Checks if at least one Asp or Glu side-chain carboxyl oxygen atom ( $\overset{\circ}{O}$ ) and one side-chain nitrogen atom of Arg, Lys or His ( $\overset{\oplus}{N}$ H) are within a distance  $\leq 4.0$  Å

NH3<sup>+</sup>----- -0

Salt bridge

Residue 1	Residue 2	Distance
NZ ALYS A 11	OD1 ASP A 62	3.86
NZ ALYS A 11	OD2 ASP A 62	2.78
NZ ALYS A 11	OD2 ASP A 68	2.85
NZ BLYS A 11	OD1 ASP A 62	3.79
NZ BLYS A 11	OD2 ASP A 62	2.74
NZ BLYS A 11		2.75
NH1 ARG A 46	OE1 GLU A 276	3.61

#### **Functional sites**



### **Functional sites**

- Binding sites
  - Binding sites for small molecules
  - Binding sites for macromolecules
- □ Transport pathways
  - Tunnels
  - Channels

# **Binding sites**

- Sites on the protein that provides the complementarity for the bound molecule (ligand)
  - Binding site its function is molecular recognition
  - Active/catalytic site— its function is to promote chemical catalysis (break/formation of covalent bonds) – special case of the binding site
- Binding involves the formation of non-covalent interactions
  between the protein and the bound molecule
- Bound molecule small molecule or macromolecule
- Binding is usually very specific complementarity in shape
  and charge distribution between the site and bound molecule

#### **Binding sites**



# Complementarity in shape and charge distribution between the active site and substrate

- Usually: internal cavities, surface pockets or clefts
  - Concave regions
  - Provide microenvironment different from that of the bulk solvent (e.g., many residues with negative charge → very strong electrostatic field enabling binding of highly charged ligands)
  - Often identifiable by a simple examination of the protein structure
- Highly conserved by evolution
- Low desolvation energy
- Characteristic physicochemical properties













□ Can be very ligand-specific



#### No longer a good fit!

- Approaches to identify binding sites:
  - Evolutionary conservation
  - Physical detection of "pockets"
    - Geometry based methods
    - Energy based methods
  - Knowledge-based
    - Machine learning-based methods
    - Template-based methods
    - Microenvironment-based methods

# **Evolutionary conservation**

- Residues important for protein function or stability tend to be highly conserved over evolution
- Residue conservation in a set of related proteins can be derived from a multiple sequence alignment (MSA)
- Mapping of conservation on structure can reveal patches of conserved surface residues – potential binding sites
- Protein interior usually more conserved than surface not suitable for prediction of buried cavities
- □ Not very specific better to combine with other features

#### **Evolutionary conservation**




# **Evolutionary conservation**

#### □ ConSurf

- http://consurf.tau.ac.il/
- Estimates the level of evolutionary conservation of individual positions in protein and maps this information onto its 3D structure
- Conservation score is derived based on the site-specific evolutionary rates calculated for each position by Rate4Site software
- ConSurfDB pre-calculated conservation scores for all structures in wwPDB

# **Evolutionary conservation**

□ ConSurf





1	11	21	31	41
M <mark>SEIGTGFP</mark> F	DPHYVEVLGE	RMHYVDV <mark>GPR</mark>	DGTPVLFLHG	NPTSSYLWRN
51	61	71	81	91
IIPH <mark>V</mark> APSHR	CIAPDLIGMG	K <mark>S</mark> DKPDLDYF	F <mark>DDHV</mark> RYLDA	FIEA <mark>LGLEE</mark> V
101	111	121	131	141
VLVIHDWGSA	LGFHWAKRNP	ERV <mark>K</mark> GIACME	FIRPIPTWDE	WPEFARETFQ
151	161	171	181	191
AFRTADVGRE	LIIDQ <mark>N</mark> AFIE	<b>GALPKCVVR</b> P	LTEVEMDHYR	EPFLKPVDRE
201	211	221	231	241
PLWRFPNELP	<b>IAGEPANIVA</b>	LVEAYMNWLH	<b>QSPVPKL</b> LFW	<b>GTPGVLIPPA</b>
251	261	271	281	291
EAARLAE SLP	NCKTVDIGPG	LHYLQEDNPD	LIGSEIARWL	P <mark>ALHH</mark> H

Functional sites  $\rightarrow$  binding sites  $\rightarrow$  binding sites for small molecules

# Physical detection of "pockets"

□ Analyze the protein surface for pockets (clefts, cavities)



- Geometry-based methods
  - Define favorable cleft regions based on steric assessments
- Energy-based methods
  - Define favorable cleft regions based on energetic evaluations

# Geometry-based methods

- Computed Atlas of Surface Topography of proteins (CASTp)
  - http://sts.bioe.uic.edu/castp
  - Uses computational geometry methods including Delaunay triangulation, alpha shape and discrete flow theory
  - Measures the volume and surface area of each pocket and cavity using the ASA model and molecular surface (Connolly) model



Functional sites  $\rightarrow$  binding sites  $\rightarrow$  binding sites for small molecules

## Geometry-based methods

- Computed Atlas of Surface Topography of proteins (CASTp)
  - http://sts.bioe.uic.edu/castp



PocID 🥹	Area (SA) Å <sup>2</sup>	Volume (SA) Å <sup>3</sup>
1	227.827	104.231
2	145.200	69.278
3	53.729	14.917

# **Energy-based methods**

- Pockets are defined by energetic criteria
- Evaluate the interaction energy between the protein and a molecular fragment – probe (e.g., a methyl, hydroxyl, amine, etc.) to locate energetically favorable binding sites
- Can be combined with other methods to assess the *ligandability* (ability of a cavity to bind ligands)

**Note**: *druggability* is referred to the likelihood of finding orally bioavailable small molecules that bind to a particular target in a disease-modifying way. *Ligandability* is a requirement but not sufficient condition for *druggability*.

# **Energy-based methods**

### Cavity Plus

- http://www.pkumdl.cn/cavityplus
- Applies Cavity program to detect the potential binding sites and rank them with ligandability and druggability scores
- Extracts pharmacophore features within the cavities

# **Energy-based methods**

□ Cavity Plus



#### Cavity Results

No. ≑	Pred. Max pKd ?	\$ Pred. Avg pKd	\$ Drug Score	\$ Druggability ?	\$ Surface ?	\$ Residues ?	\$
1	10.19	6.11	493.00	less druggable	$\checkmark$	More	
2	8.87	5.66	-745.00	Undruggable		More	
3	8.16	5.42	-420.00	Undruggable		More	
4	7.87	5.32	-750.00	Undruggable		More	
5	7.11	5.06	-1105.00	Undruggable		More	
6	6.54	4.86	-992.00	Undruggable		More	
7	5.90	4.64	-1123.00	Undruggable		More	

#### Functional sites $\rightarrow$ binding sites $\rightarrow$ binding sites for small molecules

# Machine learning-based method

#### P2rank

- https://prankweb.cz/
- Volume calculation
- Molecular docking using AutoDock Vina (future...?)

SEQU		20	40	60	80	100	120	140	160	180	200	220	240	260	280	
BIN	NDING KETS	I I		I	I	10	I			11	•		I	I	I I	10
CONSERV	ATION	حىلا	ماريل	المري	II.	ուսուն	յլիդ									
inished	l task	5														
Finished	l tasks	<b>5</b> Type			Name	$\uparrow$		Timesta	amp			Status	s/resul	It		
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#### Functional sites $\rightarrow$ binding sites $\rightarrow$ binding sites for small molecules

Knowledge-based: binding site similarity

Prediction of binding sites is based on the similarity with
 other (known) binding sites

- Template-based methods
  - Binding sites are represented by 3D templates
  - Based on similarity between homologous proteins
- Microenvironment-based methods
  - Based on description of local environment, such as type of residues, their distances, solvent accessibility and physicochemical properties





- Definition and construction of 3D templates of features
  - Local structural motifs, patterns and descriptors that characterize the binding sites (e.g., functional groups, shape, solvent accessibility, etc.)
  - Capture the essence of the binding sites in the protein
  - Usually apply constraints on atom types and occasionally sequential relationships
- □ Search a database for structures using template as a query
  - Identification of structures with a given binding site
- Compare the query structure against a 3D template database
  - Identification of potential binding sites in the query structure

- PINTS (Patterns In Non-homologous Tertiary Structures)
  - http://www.russelllab.org/cgi-bin/tools/pints.pl
  - To compare a protein structure against a database of 3D patterns (templates), as well as 3D templates against a database of protein structures
  - Additionally allows comparison of two structures
  - The 3D template database includes ligand-binding sites and SITE annotations from PDB files

- □ ProFunc (Prediction of protein function from 3D structure)
  - http://www.ebi.ac.uk/thornton-srv/databases/profunc/
  - Aims to identify the most likely function of a protein from its 3D structure
  - Uses several methods, including fold matching, residue
     conservation, surface cleft analysis, and functional 3D templates
     (templates for enzyme active sites, ligand-binding templates, DNAbinding templates, reverse template comparison vs. structures in wwPDB)

- Mechanism and Catalytic Site Atlas
  - https://www.ebi.ac.uk/thornton-srv/m-csa/
  - Database that provides information about the active sites, catalytic residues and reaction mechanisms in enzymes with experimentally determined 3D structure
  - Defines catalytic residues as the residues directly involved in some aspect of the enzymatic reaction
  - Provides 3D templates for catalytic sites in the database



Catalyt	tic Residue	es Roles
UniProt	PDB* (1b73)	
Asp7	Asp7A	Acts as the general acid/base for Cys70 activation.
Ser8	Ser8A	Activates Asp7
Cys178	Cys178A	The catalytic general acid/base that re-protonates the substrate to produce the D-product. In the reverse reaction it deprotonates the D-substrate.

#### Functional sites $\rightarrow$ binding sites $\rightarrow$ binding sites for small molecules



- Typically protruding loops, large surface clefts but also flat binding sites – flatter than binding sites for small molecules
  - Recognition of a macromolecule involves interactions over a large continuous surface area or several discrete binding regions
  - Difficult to identify by a simple examination of the protein structure
- High evolutionary conservation
- □ Low desolvation energy
- Characteristic physicochemical properties
- DNA binding sites have characteristic motifs and positive charged electrostatic patches



- Approaches to identify binding sites
  - Evolutionary conservation
  - Knowledge-based

Meta-servers (tools that combine several methods)

# **Evolutionary conservation methods**

- Same principles as for binding sites of small molecules
   (see above)
- WHISCY
  - https://wenmr.science.uu.nl/whiscy/
  - Predicts protein-protein interface using conservation and structural information (interface propensities for each residue at the surface are used to adjust the score)

WHat Information does Surface Conservation Yield?

# **Knowledge-based methods**

- Combine multiple interface features
  - Conservation
  - Residue propensity for being at protein-protein interfaces (hydrophobic, aromatic, and charged residues are more likely)
  - Physicochemical properties
  - Structural properties
- □ Use known binding sites for parameterization or training →
   empirical scoring functions and machine learning methods

# Knowledge-based methods

- **CONS-PPISP** (Consensus Protein-Protein Interaction Site Predictor)
  - http://pipe.scs.fsu.edu/ppisp.html
  - Utilizes machine learning to predict protein binding sites
  - Trained on position-specific sequence profiles and solvent accessibilities of each residue and its spatial neighbors
- Patch Finder Plus
  - <u>http://pfp.technion.ac.il/</u>
  - Utilizes machine learning primarily to find DNA binding regions
  - Identifies the largest positive electrostatic patch on a protein surface

     combination of residue frequency, composition and conservation,
     surface concavity, accessible area and H-bond potential

### **Meta-servers**

□ Combine multiple methods to improve prediction accuracy

- □ META-PPISP (Protein Protein Interaction Site Predictor)
  - <u>http://pipe.scs.fsu.edu/meta-ppisp.html</u>
  - Combines cons-PPISP, ProMate and PINUP
- □ PI<sup>2</sup>PE (Protein Interface/Interior Prediction Engine)
  - http://pipe.scs.fsu.edu/
  - Pipeline to use five different predictors including cons-PPISP, meta-PPISP and DISPLAR



- Mediate transport of ions and small molecules in proteins an essential role in functioning of large variety of proteins
  - Channels/pores transport of substances across membranes
  - Tunnels exchange of ligands between buried active/binding site cavities and the bulk solvent
  - Intramolecular tunnels transport of reaction intermediates between two distinct active sites in bifunctional enzymes
- The permeability to different substances depends on their size (radii), shape (length and curvature), amino acid composition (physicochemical properties) and dynamics

## Transport pathways & voids



 Bottleneck – the narrowest part of the tunnel/channel; it has critical importance for the selectivity











#### Dependence on protein dynamics





# Prediction of transport pathways

- Identification of overall voids in proteins
- Identification of tunnels
- Identification of channels

# Identification of overall voids

- Methods that aim to accurately represent all types of voids in a protein structure, including channels, tunnels, surface clefts, pockets as well as internal cavities
- Usually provide very limited information on tunnel and channel characteristics – the identified voids have to be separated from each other
- Geometry-based methods for pocket detection
  - HOLLOW <u>http://hollow.sourceforge.net/</u>
  - 3V <u>http://3vee.molmovdb.org/</u>
  - fPocket, LIGSITE<sup>csc</sup>, PASS, CASTp, SURFNET, POCASA ...

# Identification of tunnels

- Methods that calculate tunnels connecting occluded cavities with the surrounding bulk solvent
- □ Identify the pathways from a cavity to the protein surface
- Voronoi diagrams described by the skeleton of voids
   between atoms to find all theoretically possible pathways
   connecting the starting point with the bulk solvent
- Diagrams of optimal pathways using Dijkstra's algorithm,
   based on criteria defined by a cost function
- □ The probe size defines the lowest radius threshold
- Tunnel geometry is approximated by a sequence of spheres

# Identification of tunnels





Probe size: the minimum radius specified for the tunnel search

Allowed pathway according to the selected probe

Disallowed pathways



Common limitation: the tools identify two spherical tunnels instead of one asymmetric tunnel

# Identification of tunnels - programs

- **CAVER 3.0** 
  - http://caver.cz/
  - Command-line stand-alone and PyMOL plugin
  - GUI with CAVER Analyst 2
  - For static structures and dynamic ensembles
- CAVER Web
  - http://loschmidt.chemi.muni.cz/caverweb/
  - Interactive guide-through web server
  - Optimized protocol for detection of biologically relevant tunnels
- □ MOLE 2.0
  - http://mole.upol.cz/

# Identification of tunnels - programs



#### Functional sites $\rightarrow$ transport pathways

## Identification of tunnels - programs

#### CAVER Analyst



#### Functional sites $\rightarrow$ transport pathways

# Identification of channels

- Methods that calculate channels (or pores) penetrating throughout the proteins
- Not suitable to identify tunnels leading from occluded cavities
- Usually analyze just one channel per structure
- Usually need information about approximate position and direction of the channel (channel axis) – user-provided or automatically identified

# Identification of channels - programs

#### DOREWALKER

- http://www.ebi.ac.uk/thornton-srv/software/PoreWalker/
- Identifies channel axis by heuristic iterative approach (based on the axes of transmembrane secondary structures)
- Protein is divided into equally-spaced slices perpendicular to the axis; the largest spheres fitting the channel are identified



# Identification of channels - programs

#### DOREWALKER

#### Pore analysis results

#### Overview of the available results:



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