

# **Protein-protein interactions: evolution, prediction and regulation**

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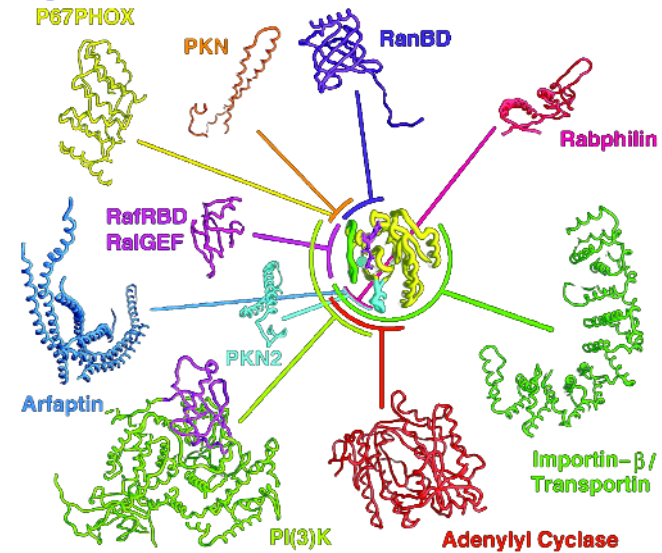
*National Center for Biotechnology Information,  
NIH, USA*

# Outline

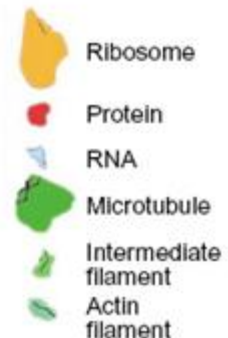
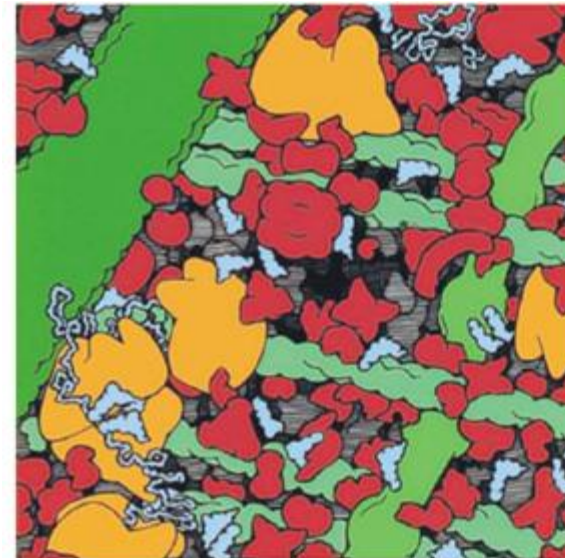
- Types of protein-protein interactions and their role in cell function.
- Physico-chemical properties of complexes and interfaces, binding hot spots.
- Experimental methods to identify interactions.
- Computational methods to predict PPIs.
- Evolution of protein interactions.
- Regulation of protein-protein binding.

# Proteins function while interacting with other partners

- Many cellular processes are regulated through protein-protein interactions, distortions may cause diseases
- Proteins provide specific binding interfaces to interact with ligands.
- Binding selectivity and affinity is determined by physico-chemical properties of binding interfaces.
- Binding interfaces share common properties: conservation of certain amino acids, hot spots, geometry.



Vetter & Wittinghofer, *Science* 2001



# Different types of protein-protein interactions.

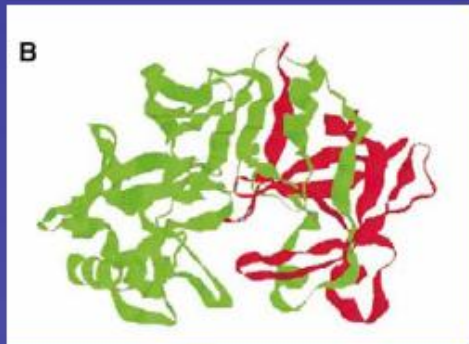
- **Permanent/obligatory** – subunits might not be stable in isolation and **transient** – subunits might fold independently.
- **External** are between different chains; **internal** are within the same chain.
- **Homo-** and **hetero-oligomers** depending on the similarity between interacting subunits.

# Types of protein-protein interactions (PPI)

## Obligate PPI

usually permanent

the protomers are not found as stable structures on their own *in vivo*



Obligate heterodimer

Human cathepsin D

## Non-obligate PPI

### Permanent

(many enzyme-inhibitor complexes)

dissociation constant

$$K_d = \frac{[A][B]}{[AB]}$$

$10^{-7} - 10^{-13} \text{ M}$



Non-obligate permanent heterodimer

Thrombin and rodniin inhibitor

### Transient

#### Weak

(electron transport complexes)

$K_d$  mM- $\mu\text{M}$



Non-obligate transient homodimer, Sperm lysin (interaction is broken and formed continuously)

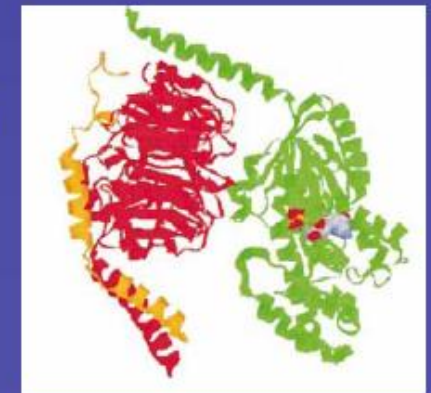
#### Intermediate

(antibody-antigen, TCR-MHC-peptide, signal transduction PPI),  $K_d$   $\mu\text{M}$ -nM

#### Strong

(require a molecular trigger to shift the oligomeric equilibrium)

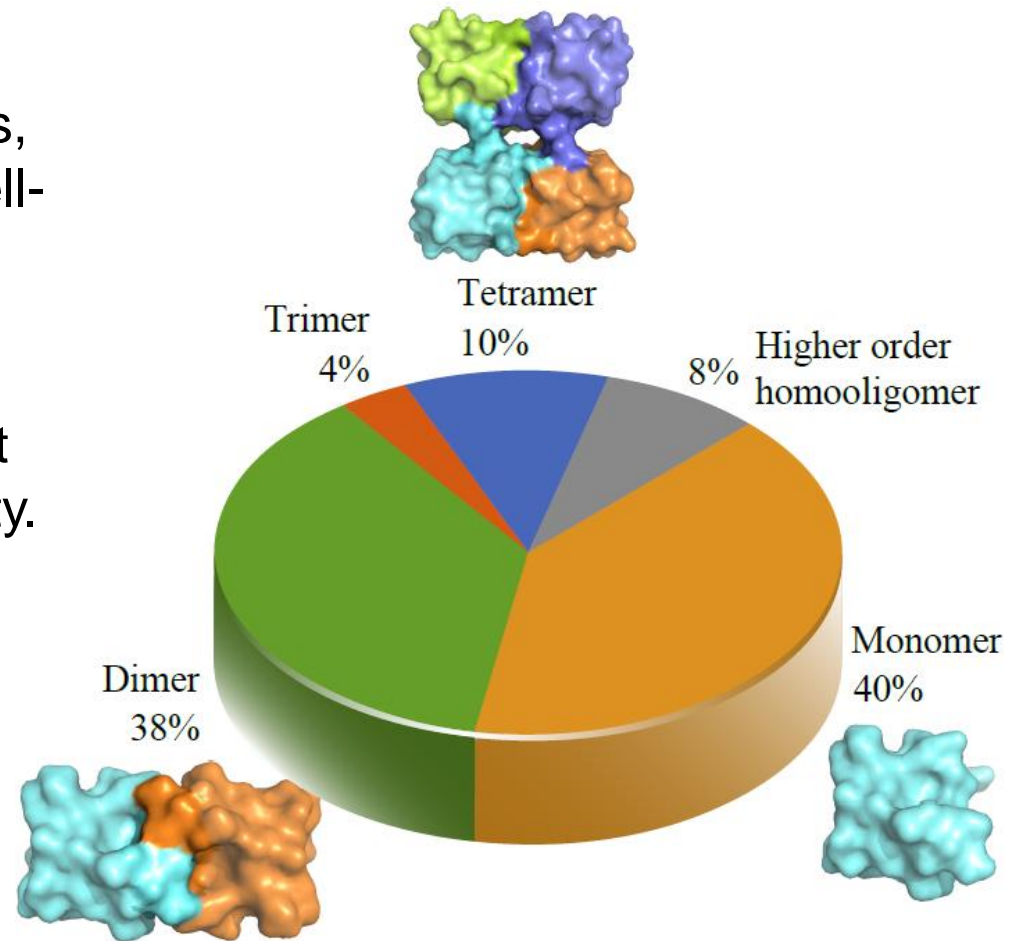
$K_d$  nM-fM



Bovine G protein dissociates into  $G\alpha$  and  $G\beta\gamma$  subunits upon GTP, but forms a stable trimer upon GDP

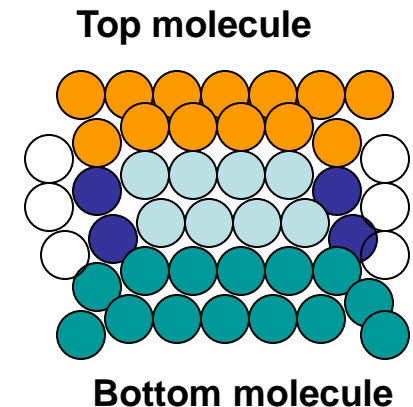
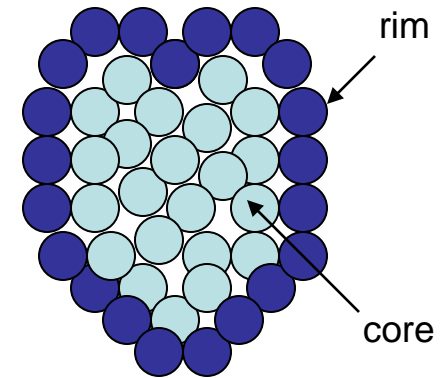
# Role of homooligomers in a cell

- Mediate and regulate gene expression, activity of enzymes, ion channels, receptors and cell-cell adhesion processes.
- Provide sites for allosteric regulation, new binding sites at interfaces to increase specificity.
- Provides stability, protection against denaturation.

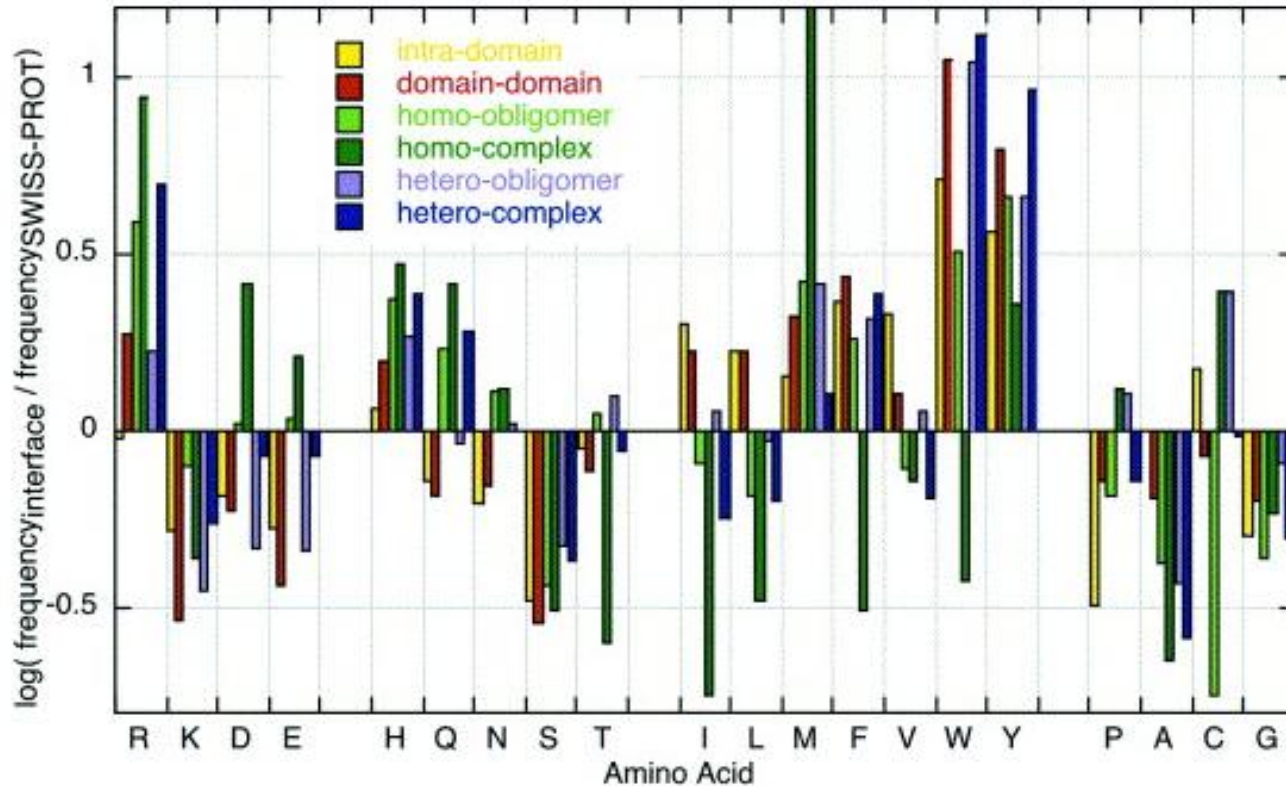


# Common properties of protein-protein interactions.

- Majority of protein complexes have a buried surface area  $\sim 1600 \pm 400 \text{ \AA}^2$  (“standard size” patch).
- Complexes of “standard size” do not involve large conformational changes while large complexes do.
- Protein recognition site consists of a completely buried **core** and a partially accessible **rim**.



# Amino acid composition of different types of complexes



*Ofran & Rost, JMB, 2003*

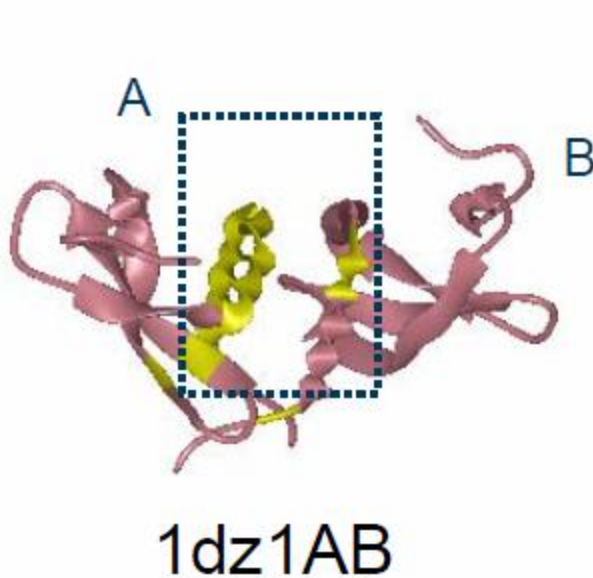


# Properties of different types of interfaces

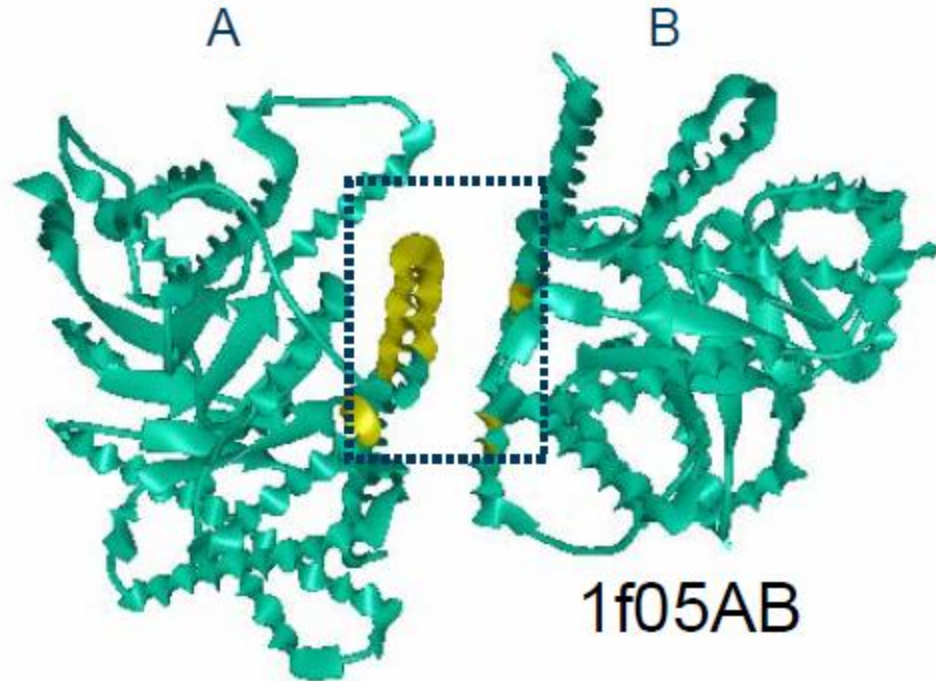
- Non-obligate complexes tend to be more hydrophilic.
- Hydrophobic groups tend to be buried upon complex formation.
- Electrostatics, hydrogen bonds, salt bridges confer specificity.
- Permanent interfaces tend to be larger, less planar, and tightly packed.

# Classification of interfaces

Similar interfaces- dissimilar functions



Chromatin, Mouse hp1 (m31) C  
terminal domain

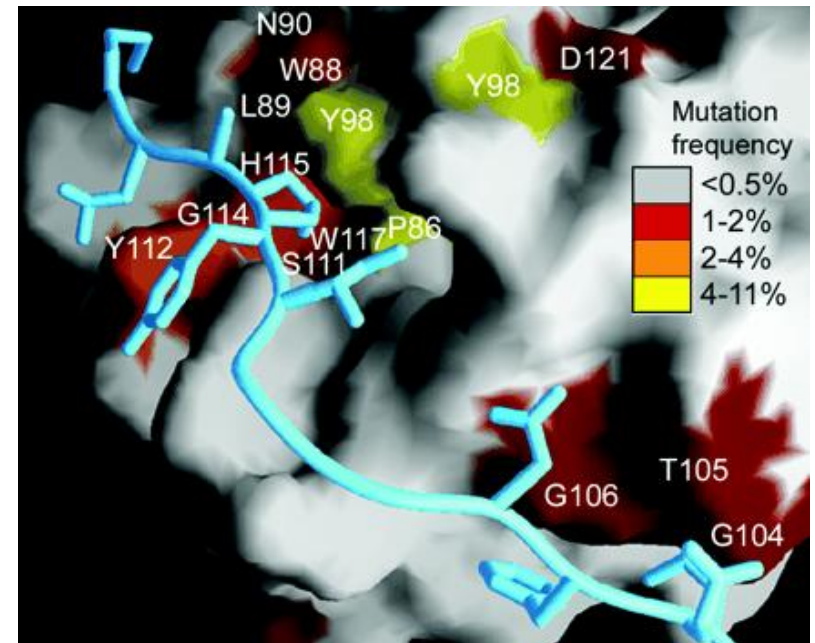


Human transaldolase

*Keskin, Gursoy, Nussinov, PRISM*

# Binding hot spots

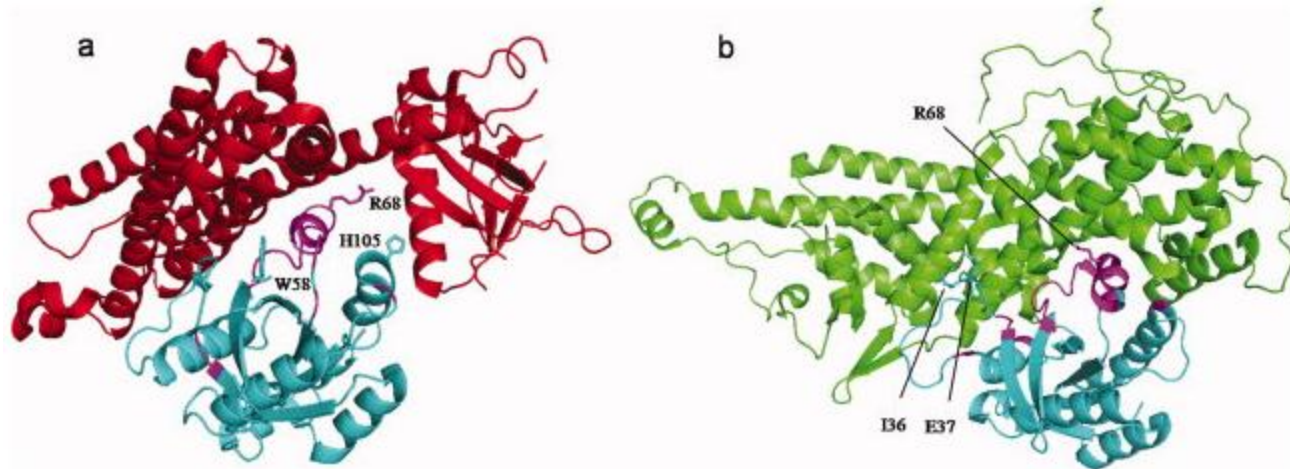
- Interface sites which contribute the most to binding energy (>2kcal/mol).
- Amino Acid composition: aromatic, Thr, Ser, Cys.
- Structurally and sequence conserved



# Why do we need to identify binding hotspots?

- To understand how proteins bind to different partners – “binding promiscuity”

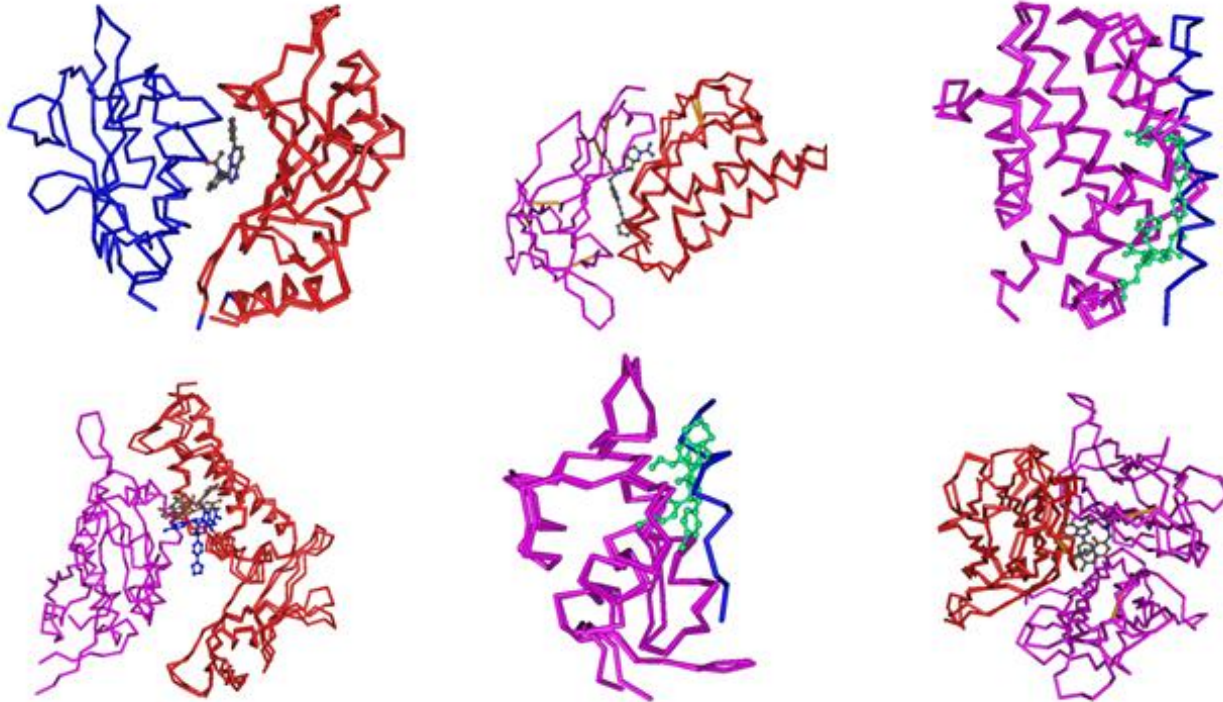
*Interaction between GTPase domain and GEF*



*Tyagi et al, Protein Science 2009*

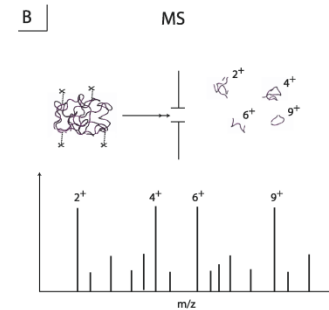
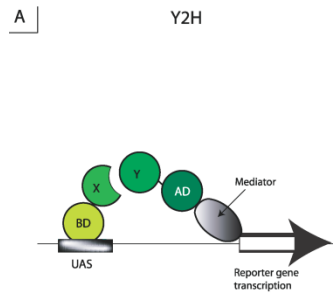
# Why do we need to identify binding hotspots?

- To target protein-protein interfaces by small molecule drugs



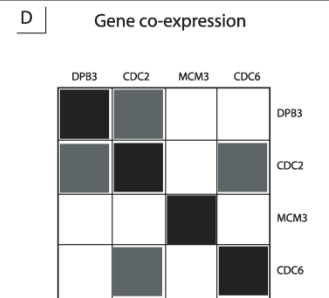
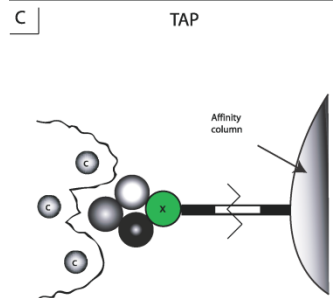
# High-throughput methods to detect protein-protein interactions

Yeast two hybrid



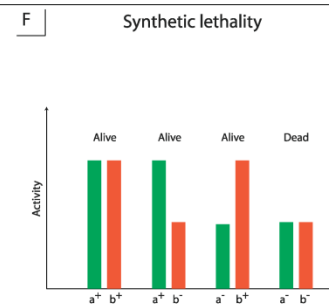
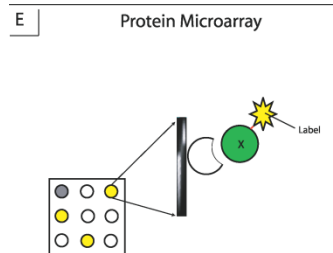
Mass spectroscopy

Tandem Affinity Purification



Gene co-expression

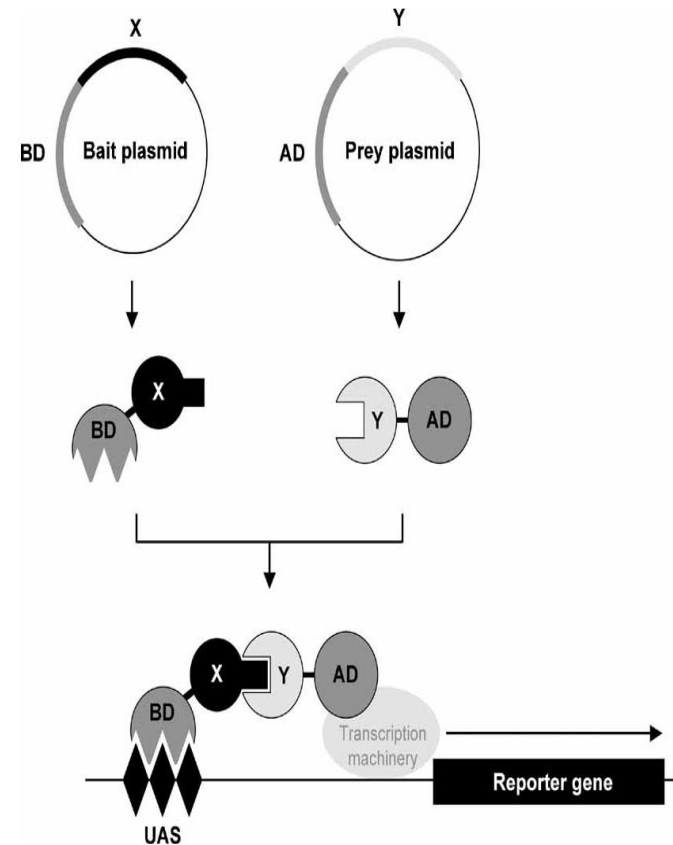
Protein Microarray



Synthetic lethality

# Yeast two-hybrid experiments.

- Many transcription factors (ex: Gal4, LexA) have two distinct domains; one that directs binding to a promoter DNA sequence (BD) and another that activates transcription (AD).
- Fields and Song (1989) demonstrated that DNA-binding domain can not activate transcription at a promoter unless physically (not necessarily covalently) associated with an activating domain.



*Causier, Mass Spectroscopy Reviews, 2004*

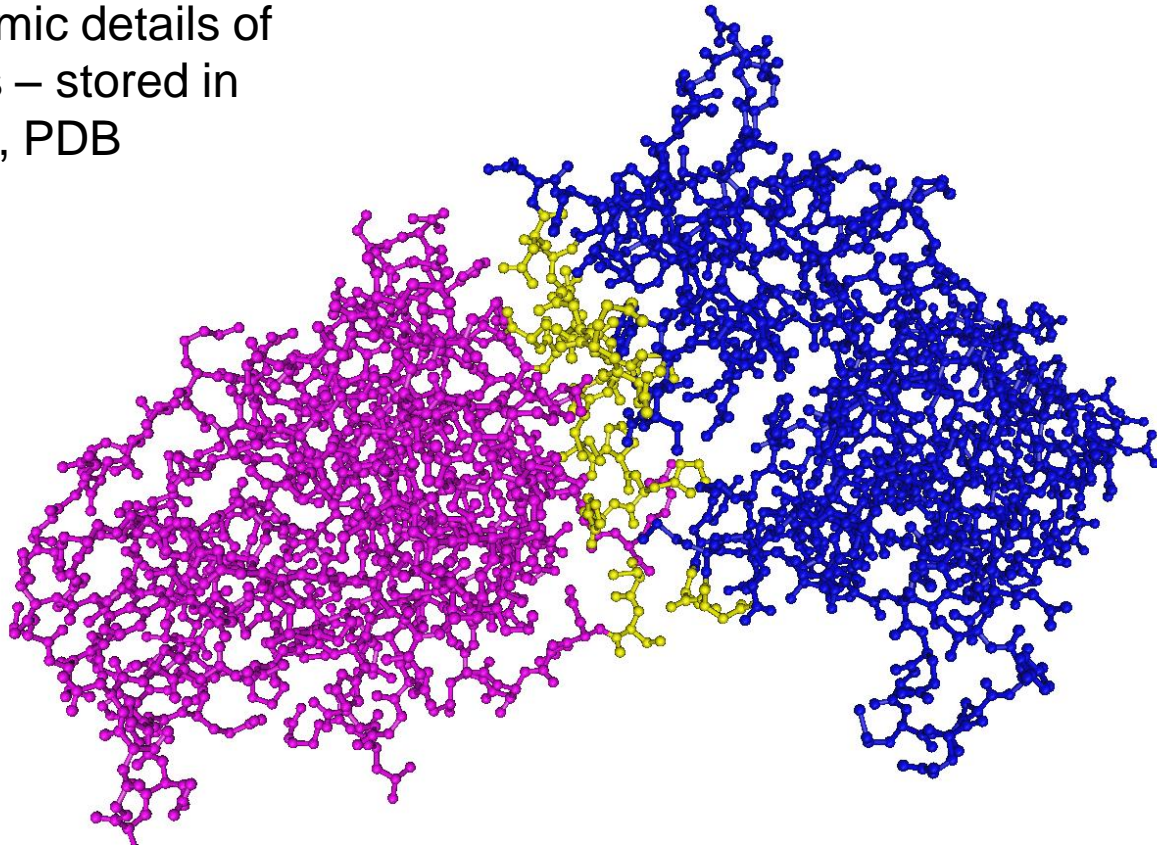
# Low-throuput biophysical methods

- X-ray crystallography, NMR
- Fluorescence resonance energy transfer (FRET)
- Surface plasmon resonance (SPR)
- Isothermal titration calorimetry (ITC)
- Atomic force microscopy



# Resolving atomic details of interaction interfaces

X-ray, NMR – atomic details of binding interfaces – stored in Protein Databank, PDB



# Prediction of protein-protein interactions

# Methods of prediction of functional associations and protein interactions

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| <b>Method Name</b>             | <b>Protein/Domain Interaction</b> | <b>Physical Interaction/<br/>Functional Association</b> |
|--------------------------------|-----------------------------------|---|
| Gene co-expression             | P                                 | F   |
| Synthetic lethality            | P                                 | F   |
| Gene cluster and gene neighbor | P                                 | F   |
| Phylogenetic profile           | P, D                              | F   |
| Rosetta Stone                  | P                                 | F   |
| Sequence co-evolution          | P, D                              | F   |
| Classification                 | P, D                              | P   |
| Integrative                    | P, D                              | P   |
| Domain association             | D                                 | P   |
| Bayesian networks              | P, D                              | F, P  |
| Domain pair exclusion          | D                                 | P   |
| <i>p</i> -Value                | D                                 | P   |

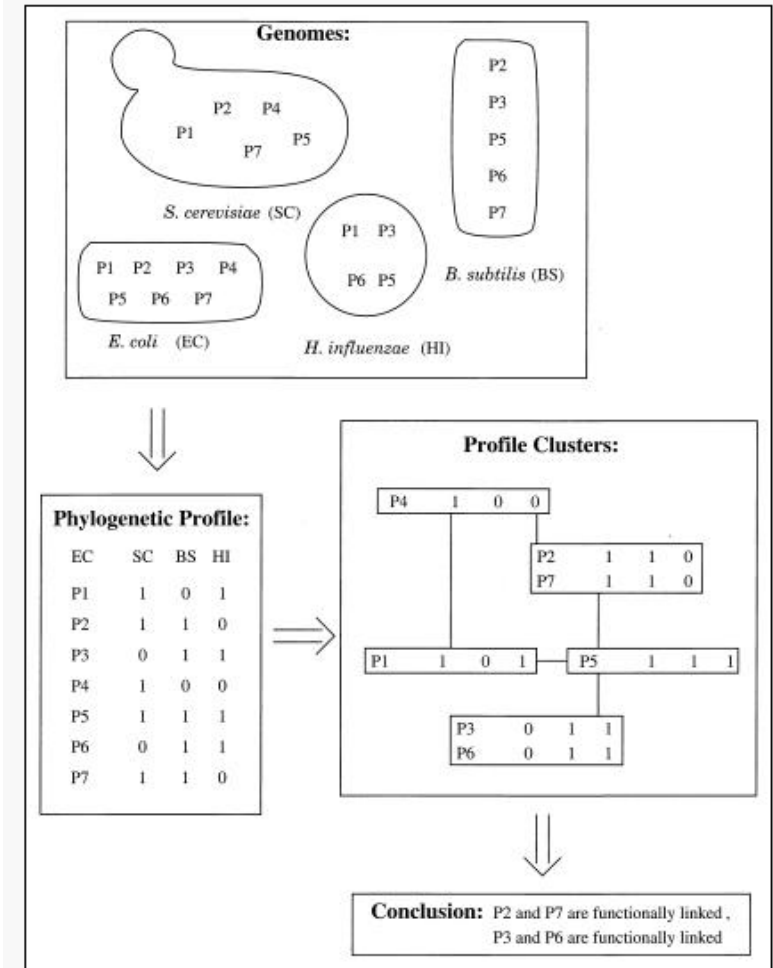
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# Phylogenetic profile method.

Functionally linked and putative interacting proteins should have orthologs in the same subset of fully sequenced organisms (Pellegrini et al, *PNAS* 1999).

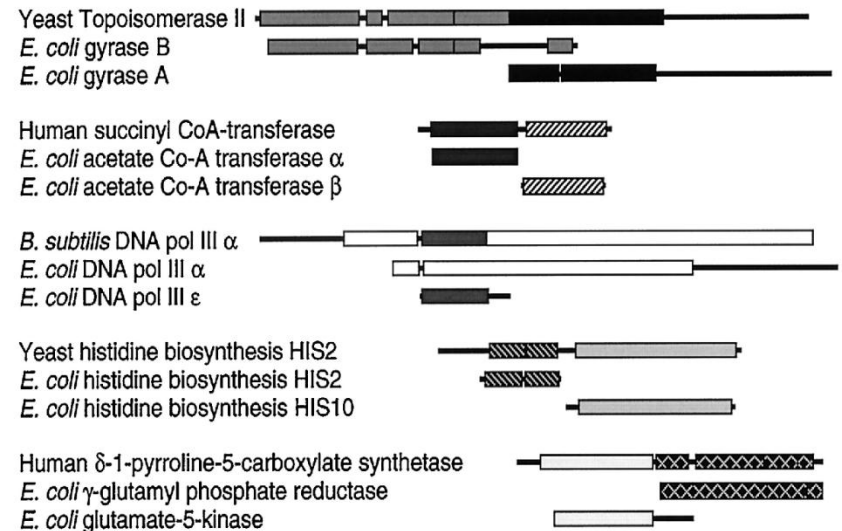
Drawbacks:

- high computational cost;
- dependence on homology detection between distant organisms;
- ubiquitous unlinked proteins present in all genomes – false positives;
- shared phylogenetic history between two proteins – false positives.



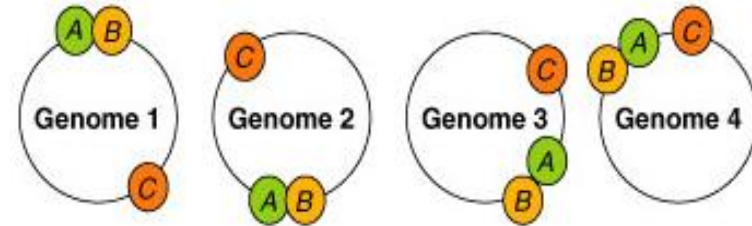
# Rosetta Stone approach.

- Some pairs of interacting domains have homologs which are fused into one protein chain – “Rosetta Stone” protein (Marcotte et al, *Science*, 1999).
- In *E.coli* ~ 6809 pairs of non-homologous proteins; both proteins from each pair could be mapped to a single protein from some other genome.



# Gene neighborhood method.

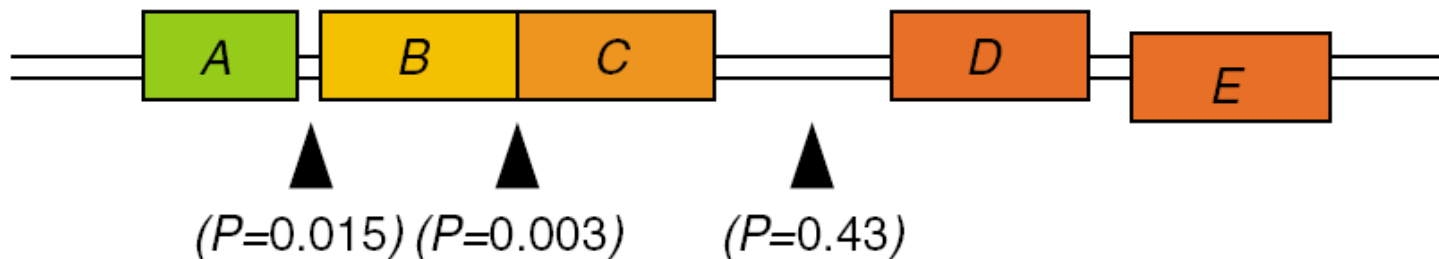
- Gene pairs from conserved gene clusters encode proteins which are functionally related and possibly interact.
- Conservation of gene order can be used to predict gene function.
- Analysis of gene order conservation : 65%–75% of co-regulated genes interact physically (prediction of archaeal exosome by comparing GN in archaea, *Koonin et al, Genome Res 2001*)



Bowers et al, Genome Biology, 2004

# Gene cluster method.

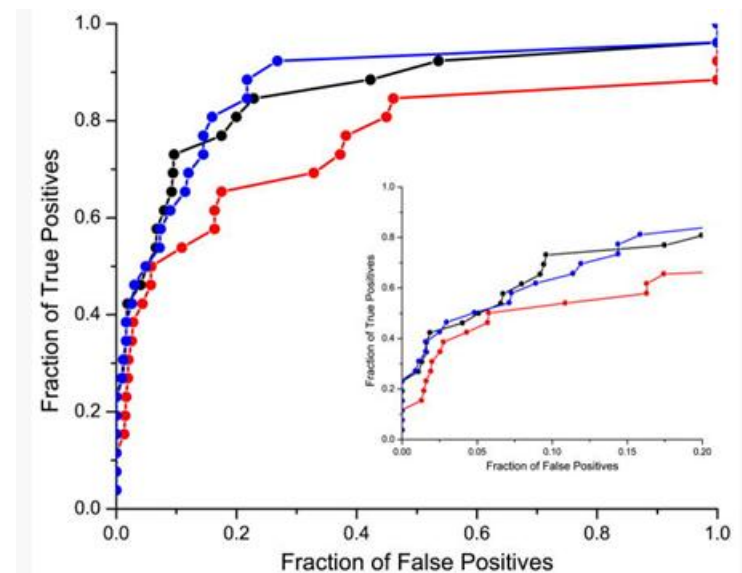
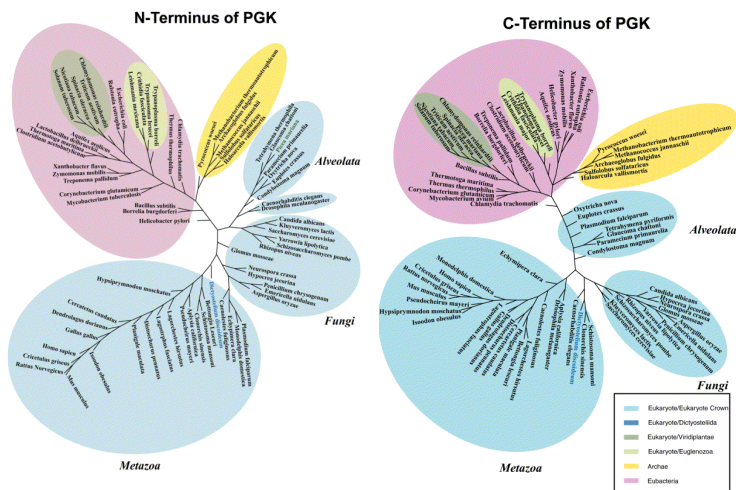
- Bacterial genes of related function are often transcribed simultaneously – operon.
- Identification of operons is based on intergenic distances.



*Bowers et al, Genome Biology, 2004*

# Coevolution of interacting proteins – “mirrortree” methods.

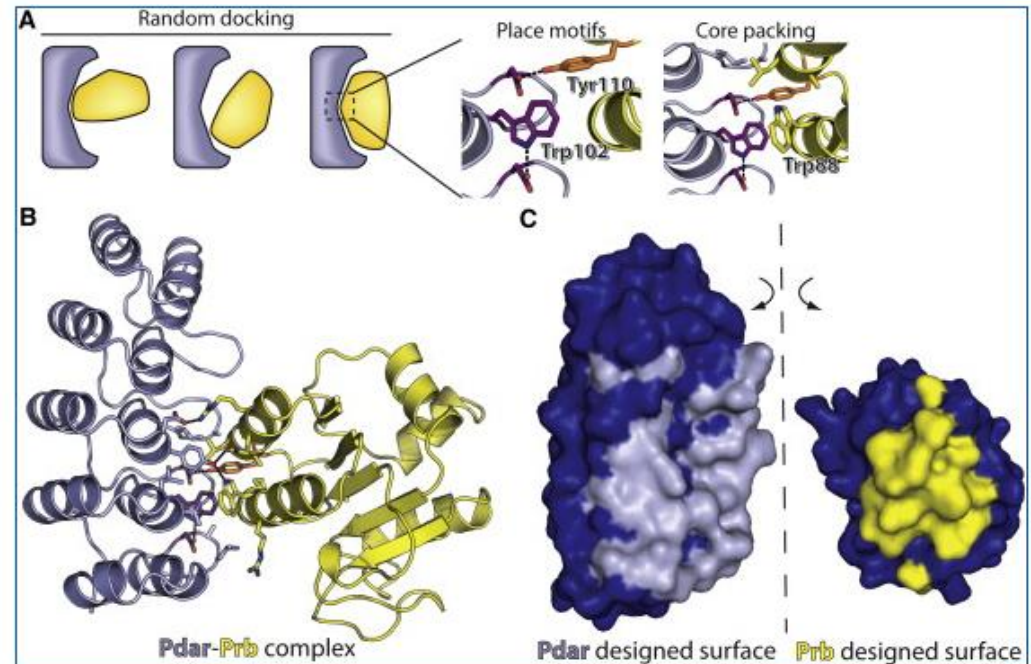
- Interacting proteins may co-evolve and their phylogenetic trees show similarity (*Goh et al, J.Mol.Biol.,2000*).
- Similarity between phylogenetic trees is measured by correlation coefficient between distance matrices.
- Signal comes from both correlated evolution of binding sites and whole protein sequence (*Kann et al, JMB 2009*).





# Interface design

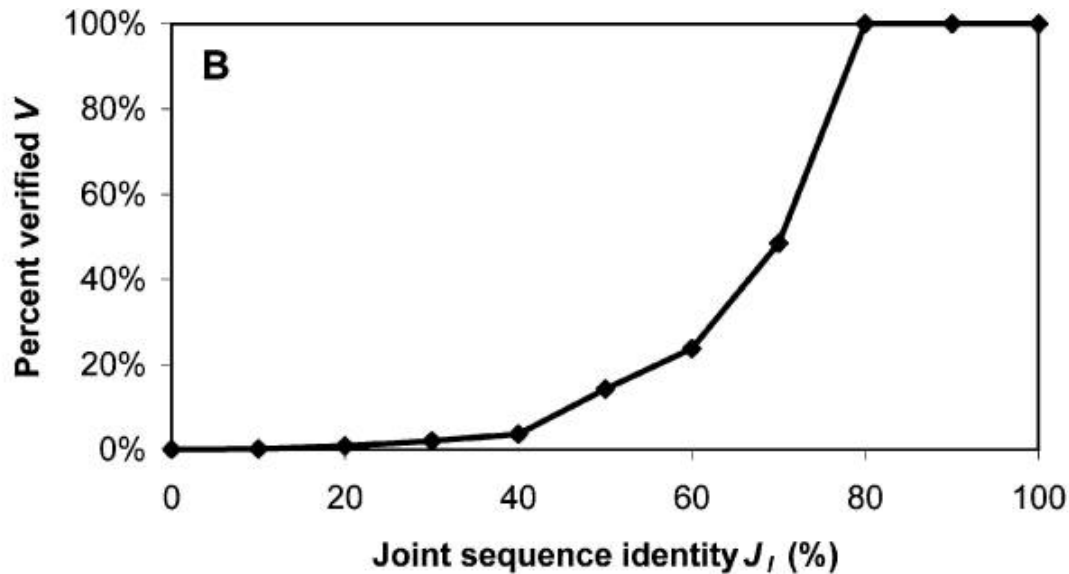
- Computationally alter interface to modify function
- Create useful properties
- Alter oligomeric state
- Alter specificity
- Novel interactions



# Evolution of protein interactions

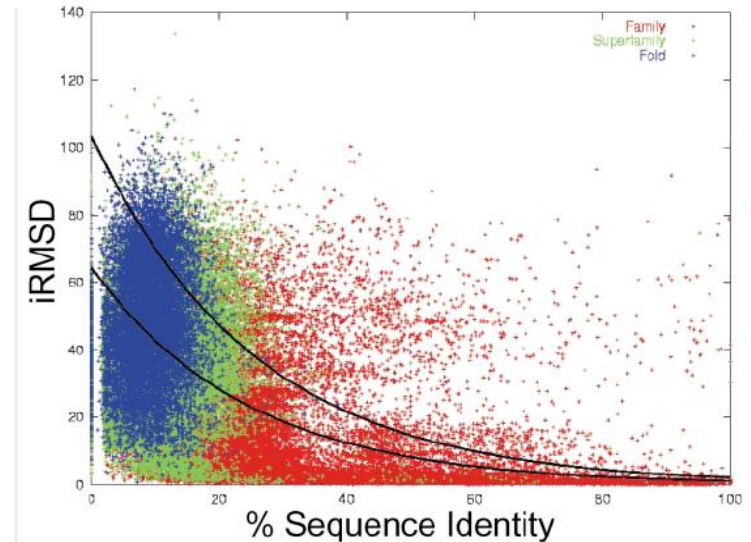
# Conservation of protein-protein interactions.

Conservation of interologs



*Yu et al, Genome Res, 2004*

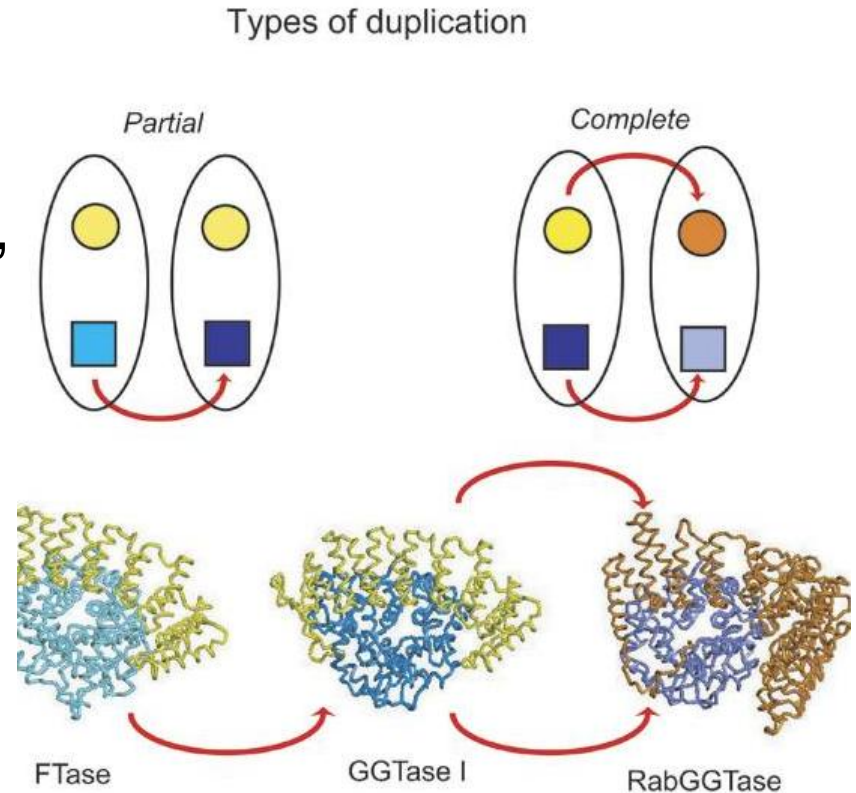
Conservation of binding interfaces



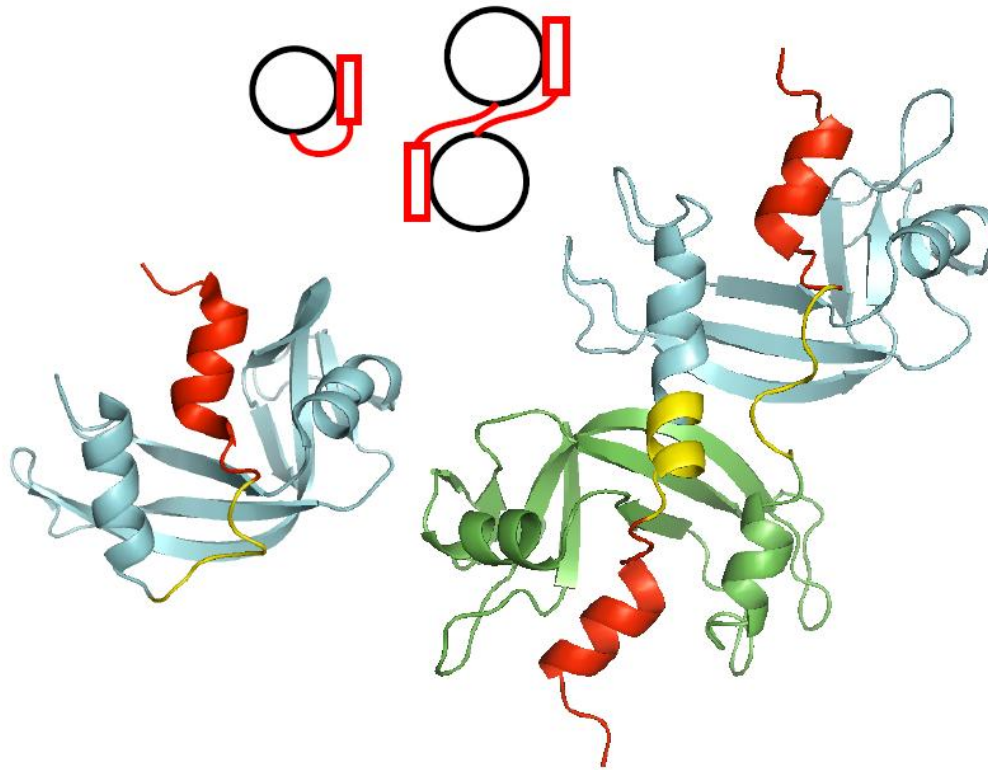
*Aloy et al, J. Mol. Biol., 2003*

# Mechanisms of evolution of novel interfaces

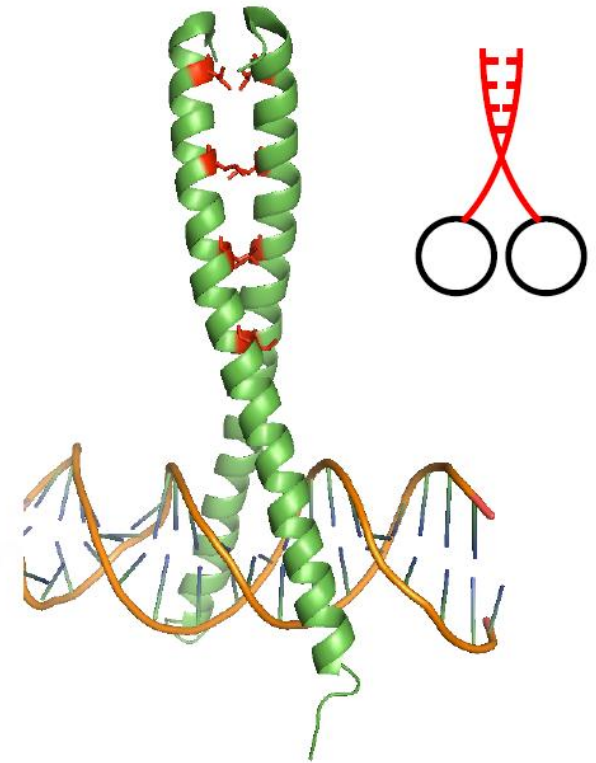
- Gene duplication with subsequent diversification (Pereira-Leal and Teichmann, *Genome Res*, 2005; Reid et al, *BMC Genomics*, 2010)
- Domain shuffling
- Point mutations on interfaces
- Insertions and deletions
- Other



# Evolutionary mechanisms to form oligomers

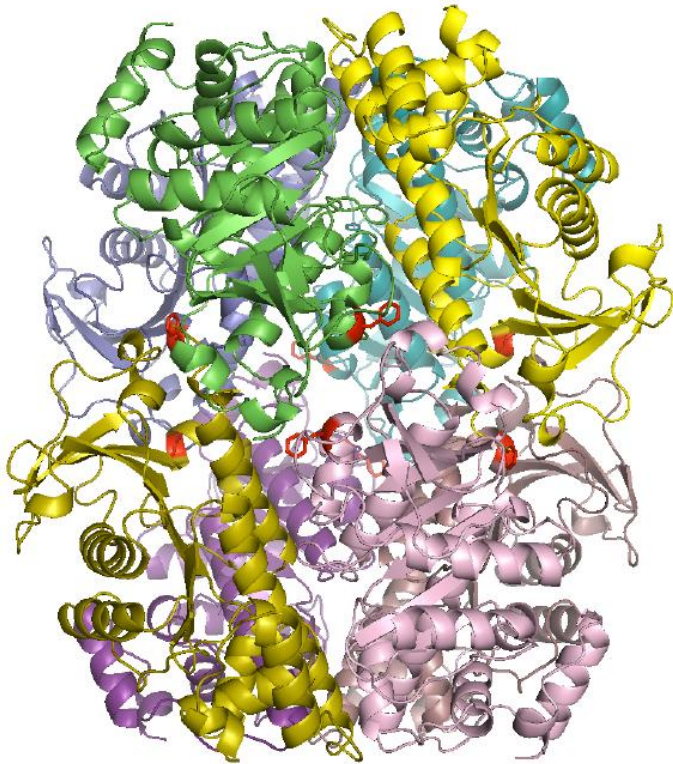


Domain swapping

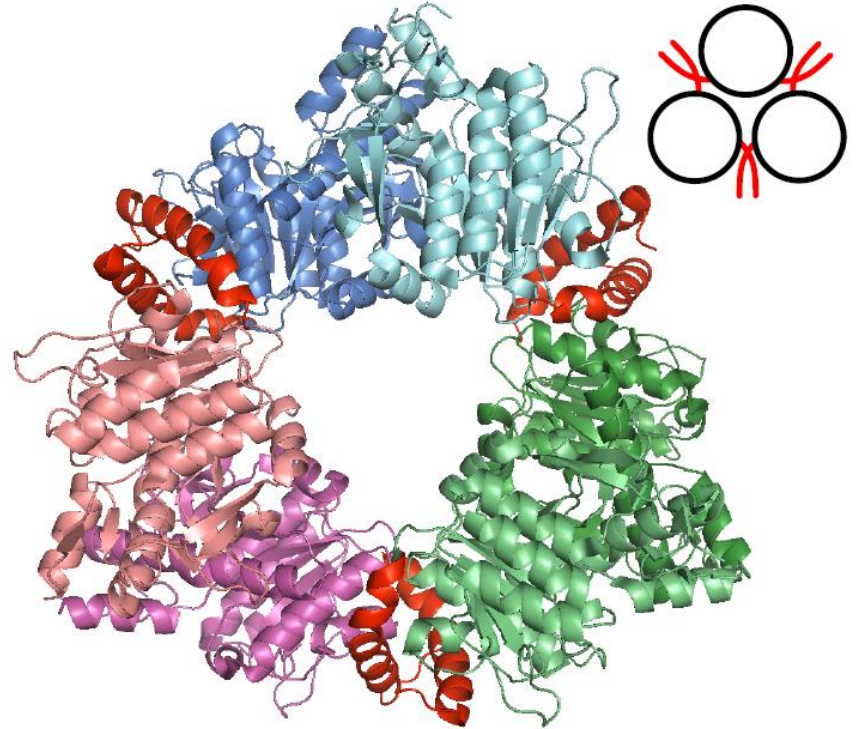


Leu zipper

# Evolutionary mechanisms to form oligomers



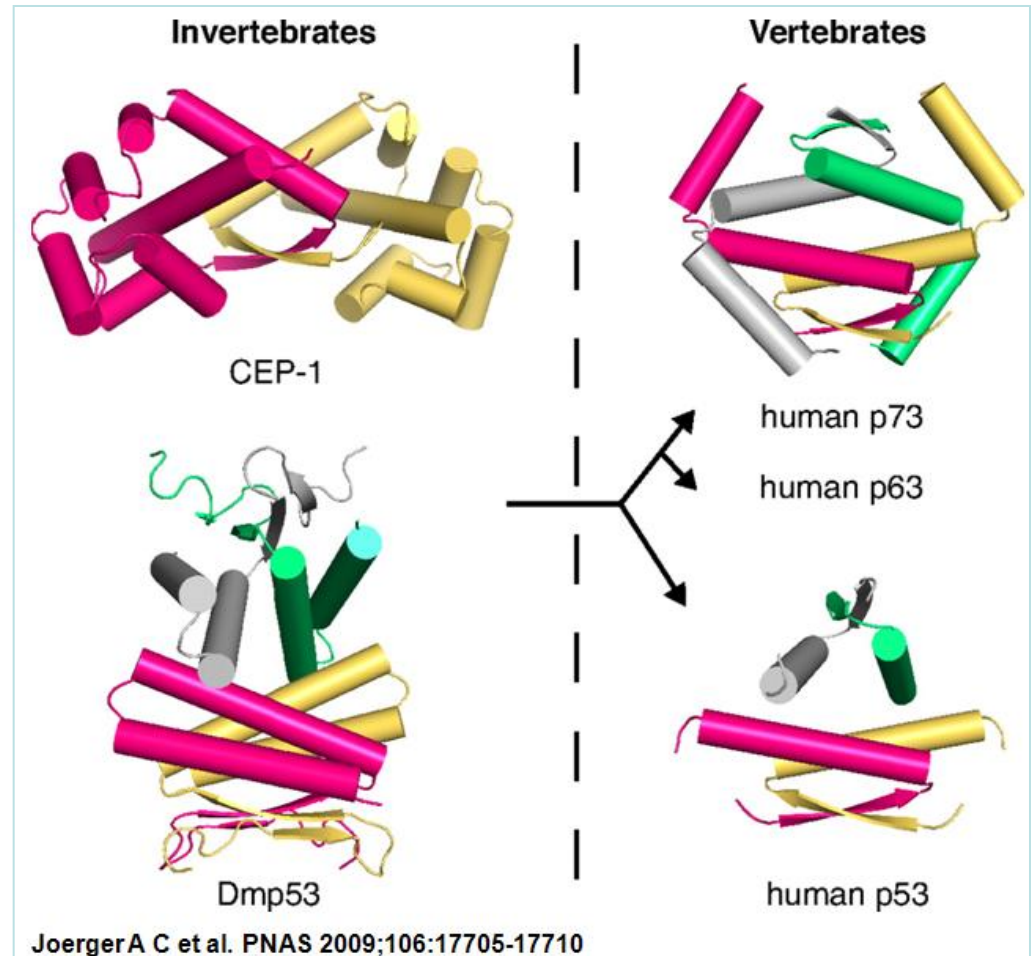
Mutations on interface



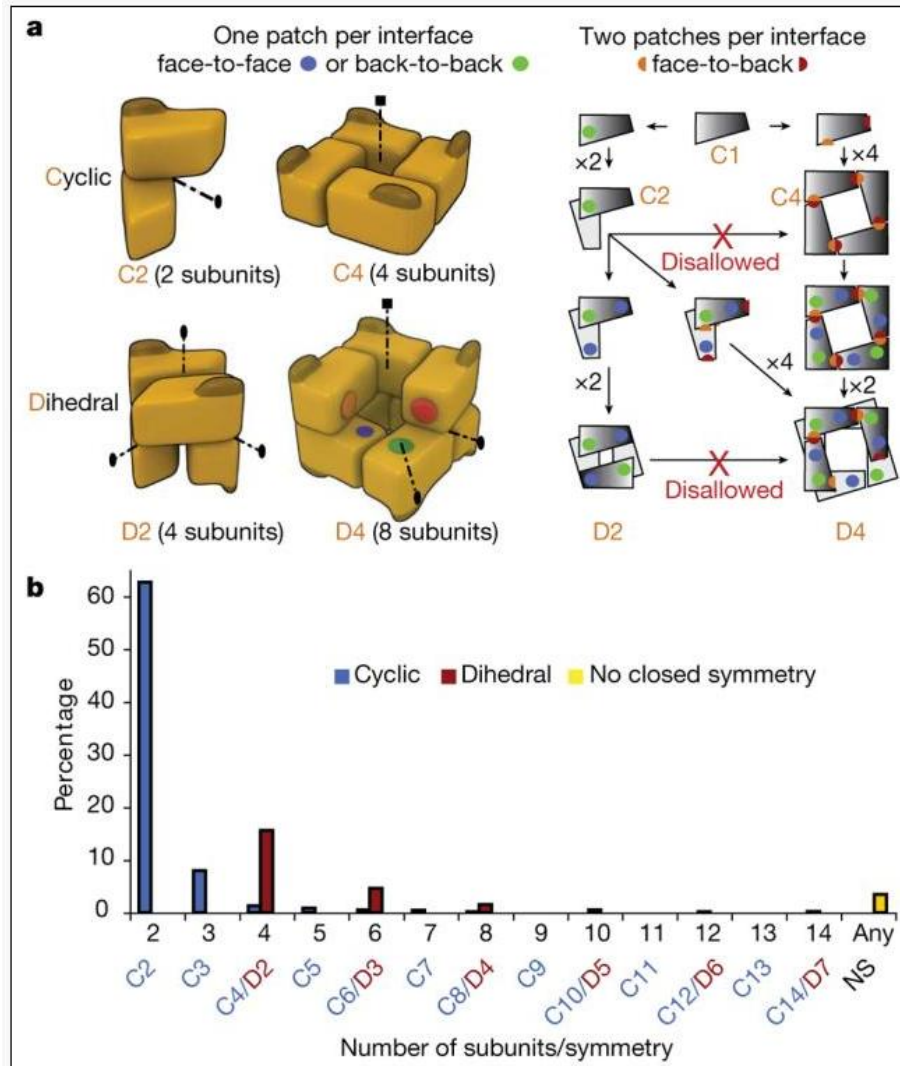
Insertions/deletions

# Evolution of new specificity through oligomerization

Stabilization of p63/p73 tetramer leads to separation of their pathways from p53 pathway



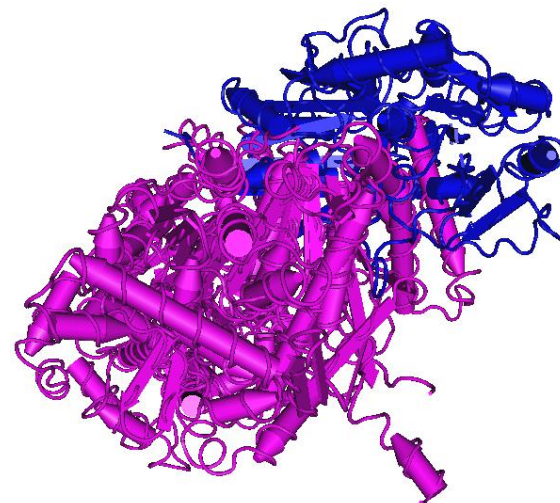
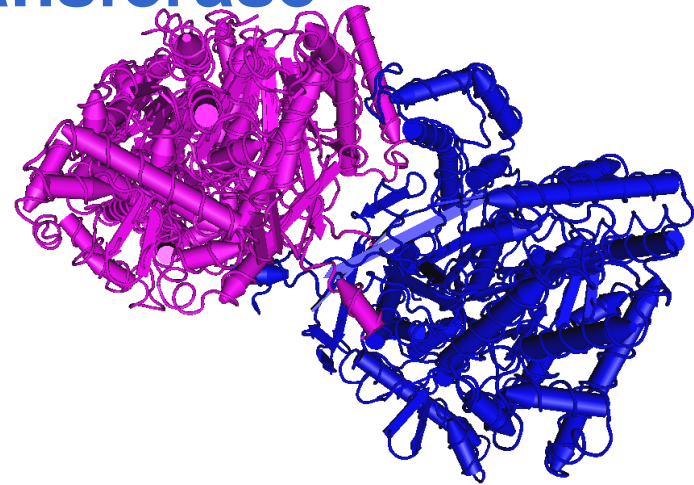
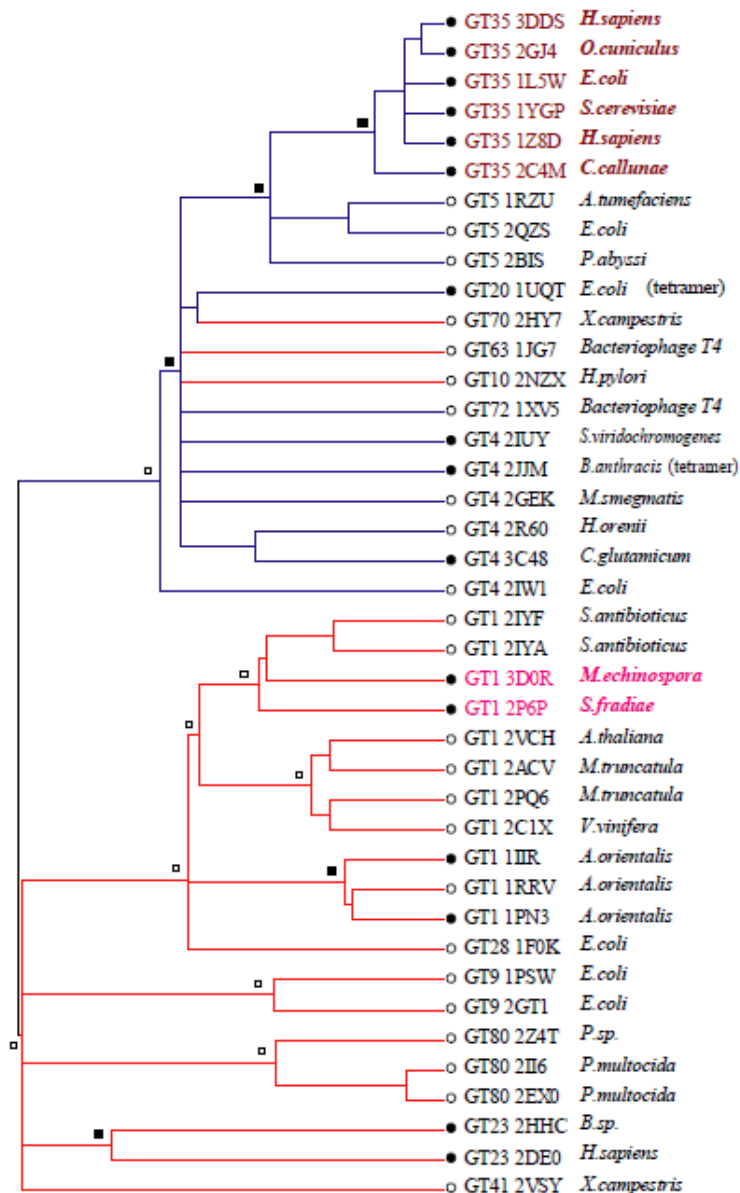
# Assembly pathway mimics the evolutionary pathway



*Levy et al, Nature, 2008*

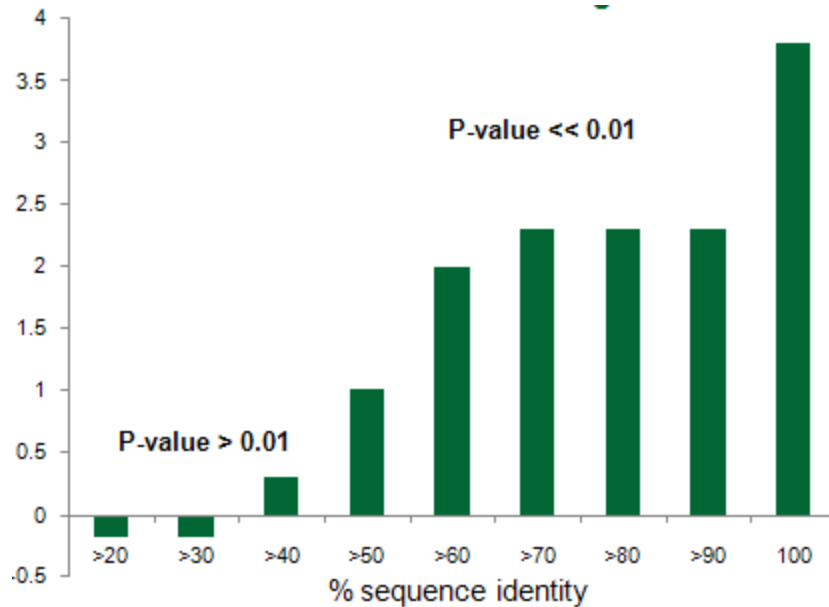


# Evolution of homooligomeric binding modes: Glycosyltransferase



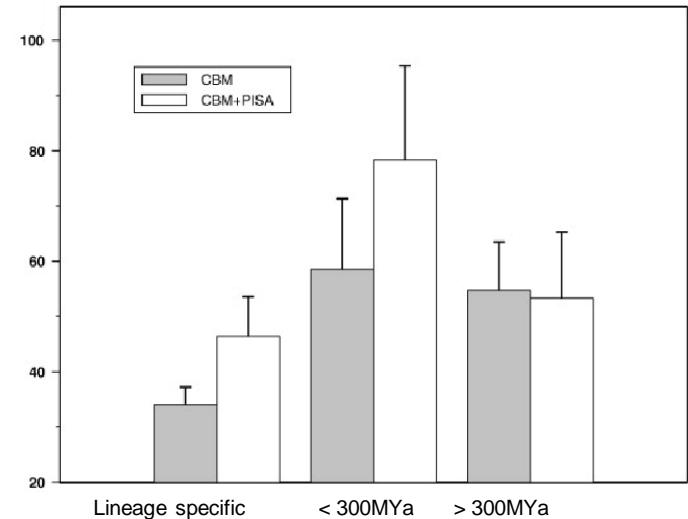
# Conservation of binding modes in evolution

Logarithm of probability ratio for finding the same or different binding modes on phylogenetic tree



Dayhoff et al, JMB 2010

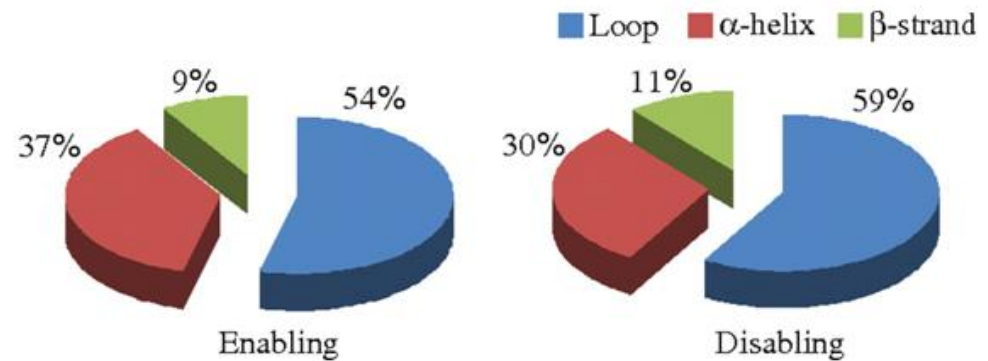
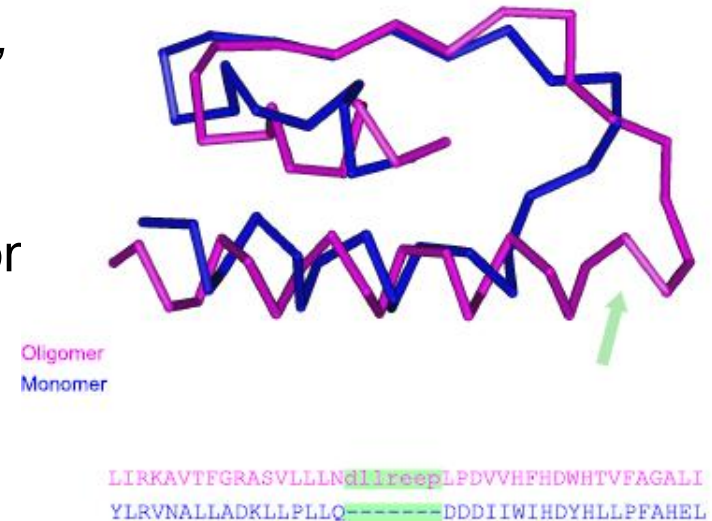
Interface size

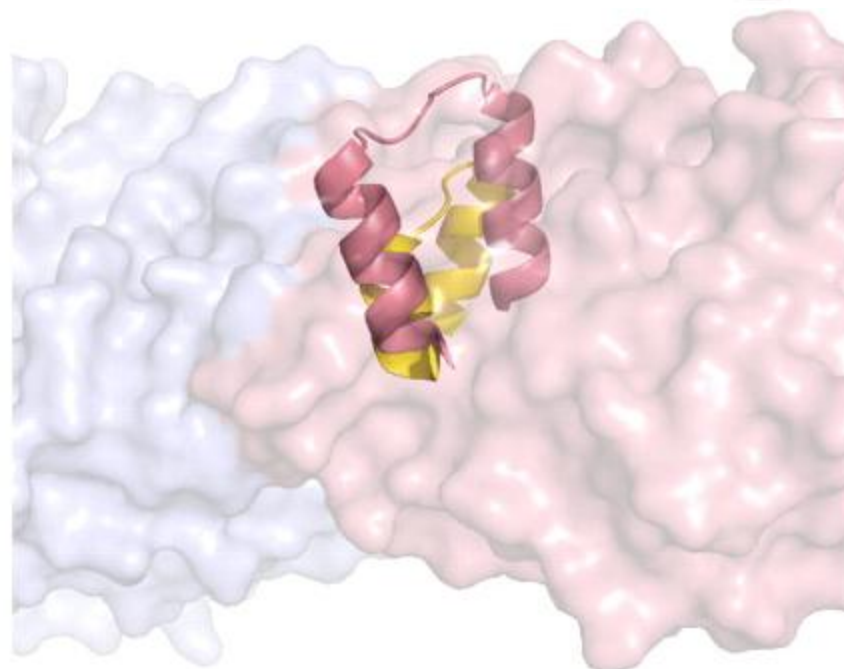
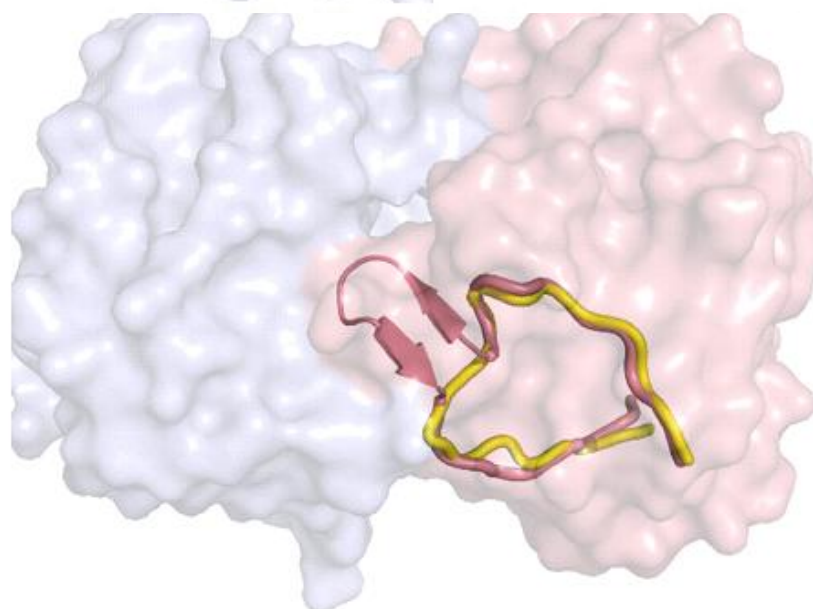
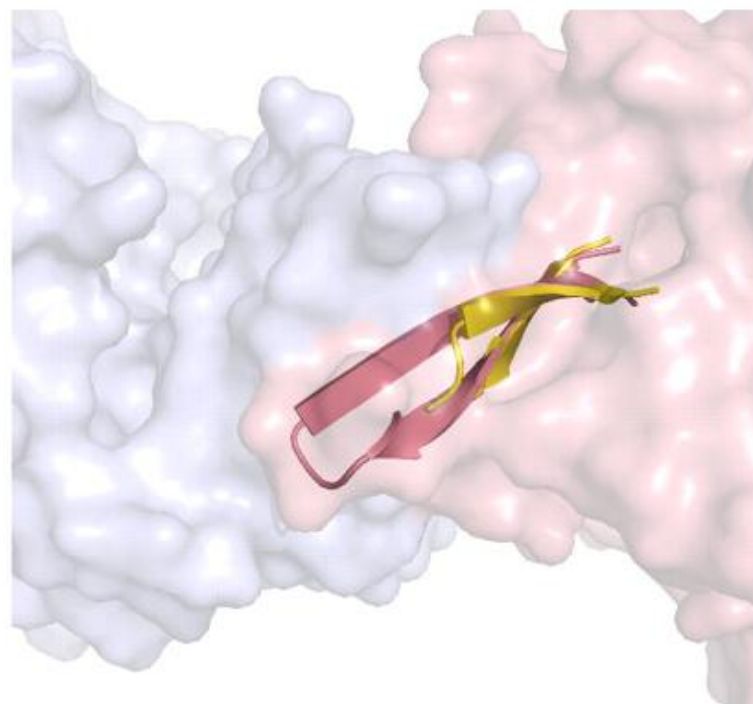
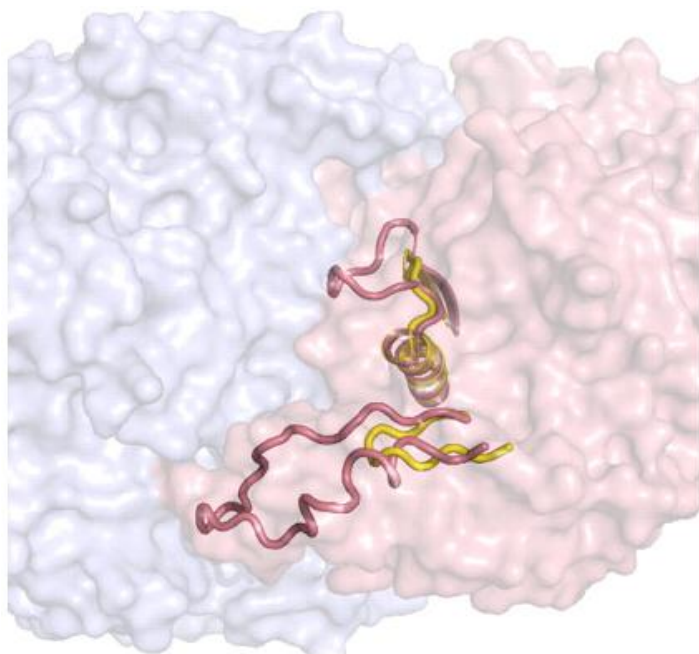




- binding modes are well conserved within phylogenetic clades sharing more than 50% sequence identity
- lineage-specific binding modes are smaller, less stable. Newer interactions are weaker

# Role of Insertions and deletions in formation of oligomers

- “enabling” and “disabling” loops (*Akiva et al, PNAS 2008*)
- Insertions/deletions occur more frequently or the interface than on the surface ( $P$ -value  $\ll 10e-7$ ) – “enabling” and “disabling regions”
- 25% homooligomers have enabling and disabling regions;
- they contain more polar and charged residues, Gly and Pro than “conventional interfaces”

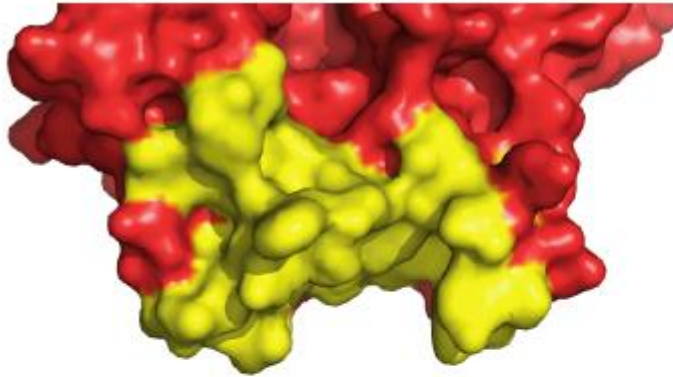




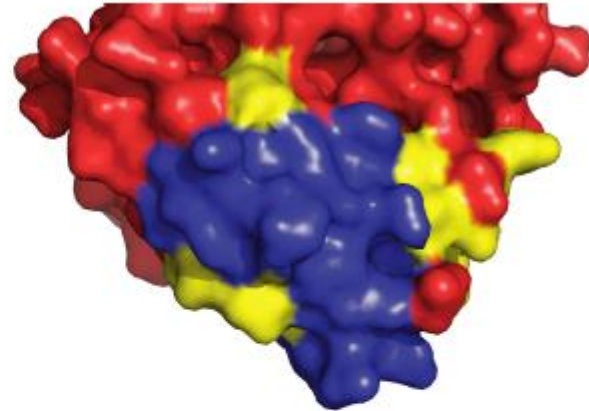
-  Enabling region in homodimer (1P3C)
-  Aligned region in monomer (1FQ3)

# Disabling regions

Glycogenin glucosyltransferase,  
disrupting features



*Eukaryotes, dimer*



*Bacteria, monomer*

```
1LL2: 122 aap-----dpgwpDCFNSGVFVYQPSVETyNQLLHVASEQGs----- 158
1G9R: 123 nwlgasidlfverqegyqkigxadgeYYFNAGVLLINLKKWRrHDIFKXSSEWVe qykdv 183

1LL2: 159 FDGGDQGLLNTFFNSWattdirKHLPIYNLSSISISYlpafk-----afgaNAK 209
1G9R: 184 XQYQDQDILNGLFKGGv-----CYANSRFNFXPTNYAFXanwfasrhtdplyrdrtntvxPVA 241
```

# Prediction of oligomeric states from sequence

|                                    | Sensitivity | Specificity | Precision | Error rate |
|------------------------------------|-------------|-------------|-----------|------------|
| <b>Enabling/disabling features</b> | 0.70        | 0.74        | 0.94      | 0.36       |
| <b>% identity</b>                  | 0.71        | 0.62        | 0.91      | 0.38       |
| <b>RMSD</b>                        | 0.72        | 0.60        | 0.90      | 0.40       |
| <b>GSAS</b>                        | 0.81        | 0.57        | 0.91      | 0.43       |
| <b>BLAST</b>                       | 0.74        | 0.53        | 0.89      | 0.47       |

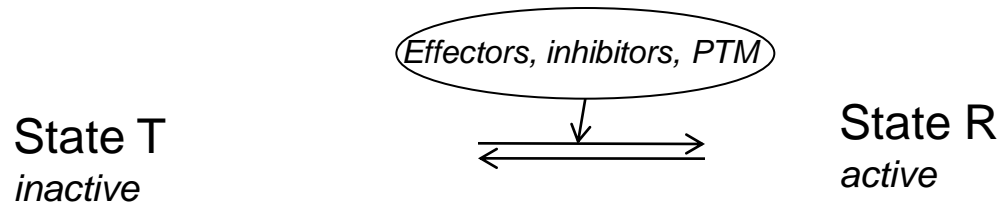
# Regulation of protein-protein binding

# Mechanisms of regulation

- Availability/abundance
  - Gene expression, translation
  - Translocation of proteins or substrates
  - Turnover
- Proteolytic activation
- Inteins



# Mechanisms of protein regulation



- Regulation by another protein or small molecule
- Reversible covalent post-translational modifications
- Allosteric activation and inhibition

# Mechanisms of protein regulation

State T  
*inactive*

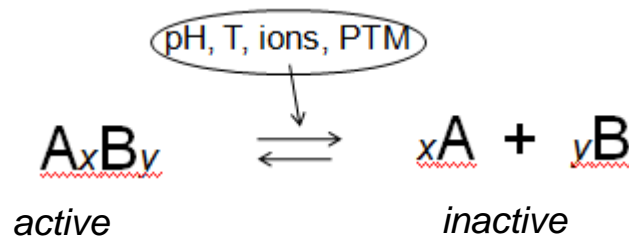
Effectors, inhibitors, PTM



State R  
*active*

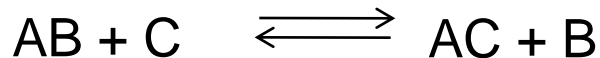
- Regulation by another protein or small molecule
- Reversible covalent post-translational modifications
- Allosteric activation and inhibition

Transitions between different oligomeric states



$$K_d = \frac{[A]^x \times [B]^y}{[A_x B_y]} = e^{-\Delta G_{diss}/RT}$$

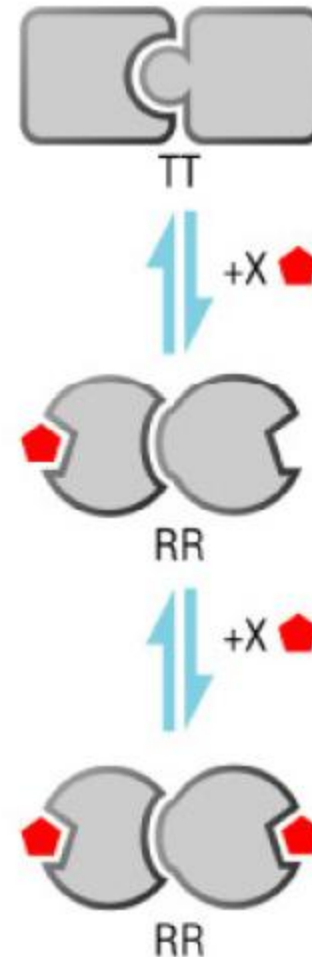
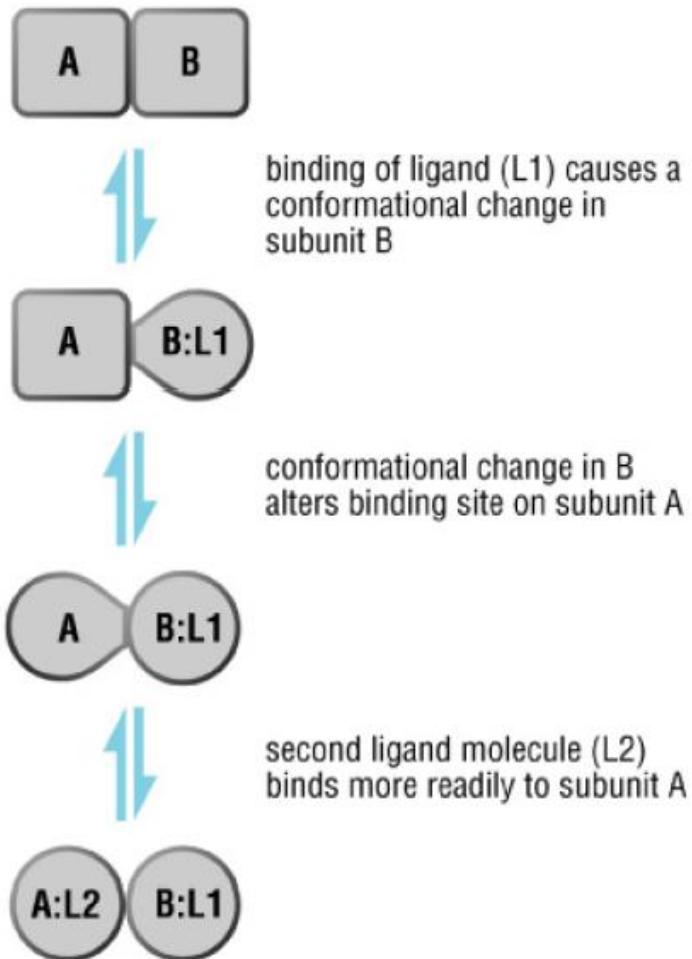
*Dissociation constant*



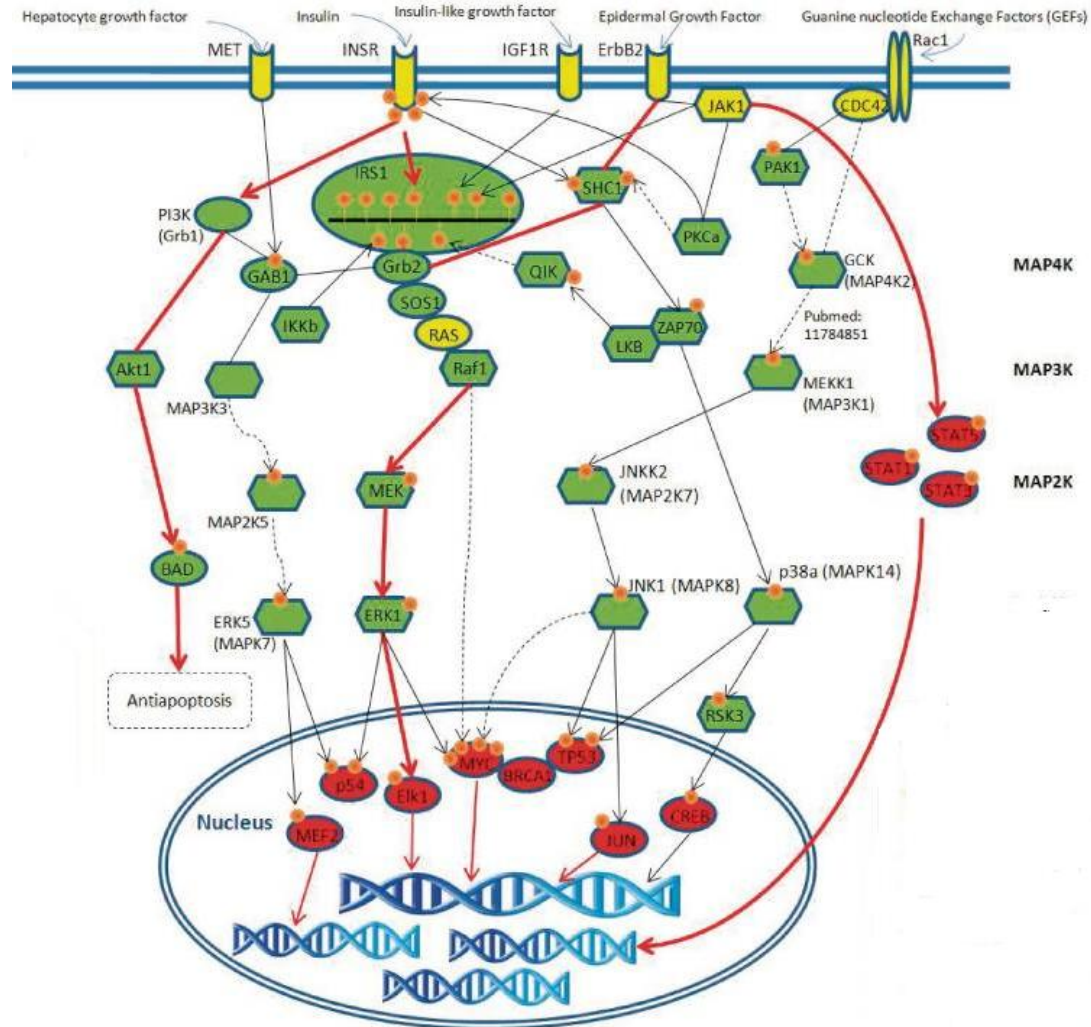
$$K_{BC} = \frac{K_{AC}}{K_{AB}}$$

*Binding selectivity constant*

# Allosteric regulation

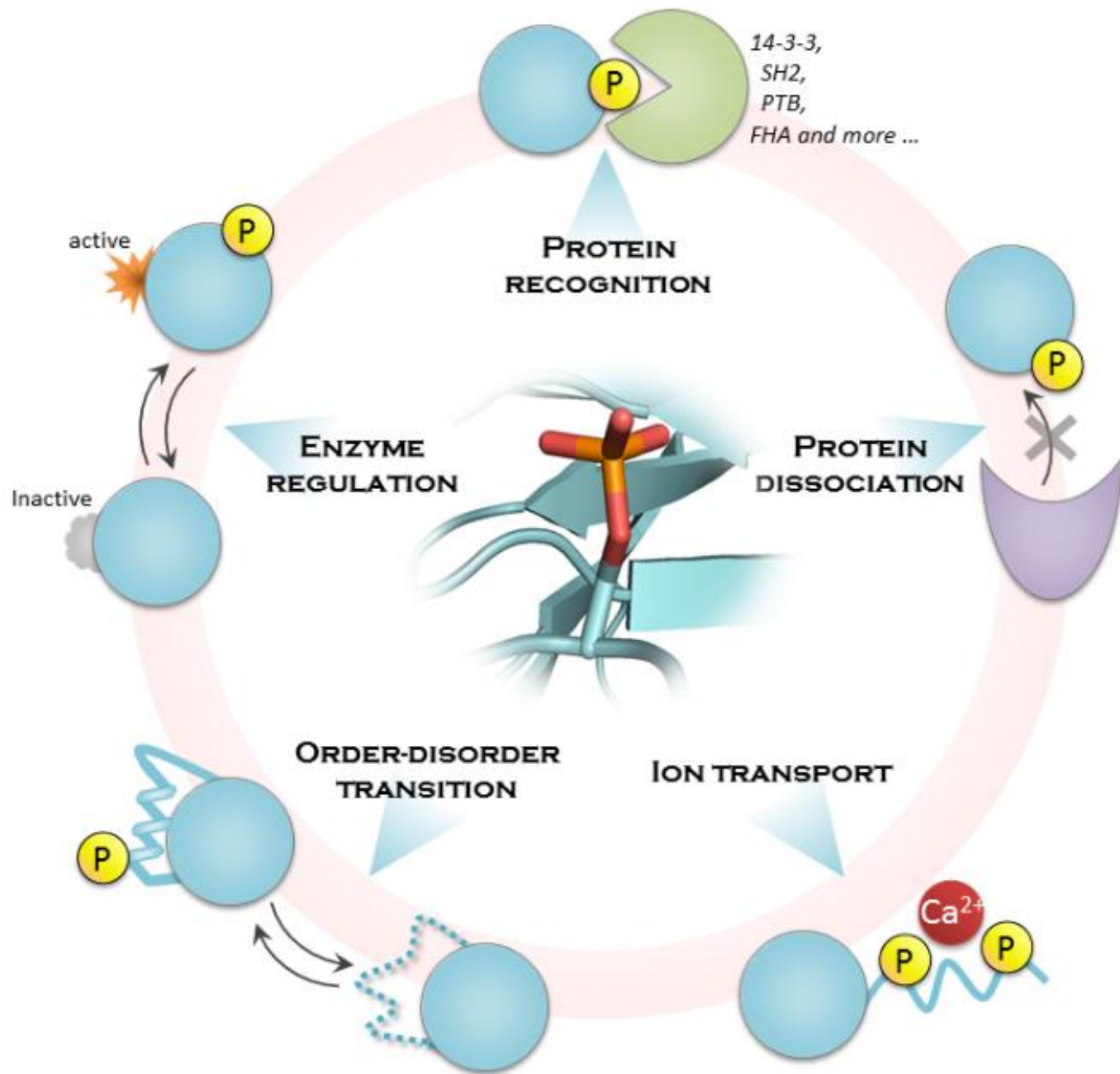


# Signal transduction through protein-protein interactions and post-translational modifications

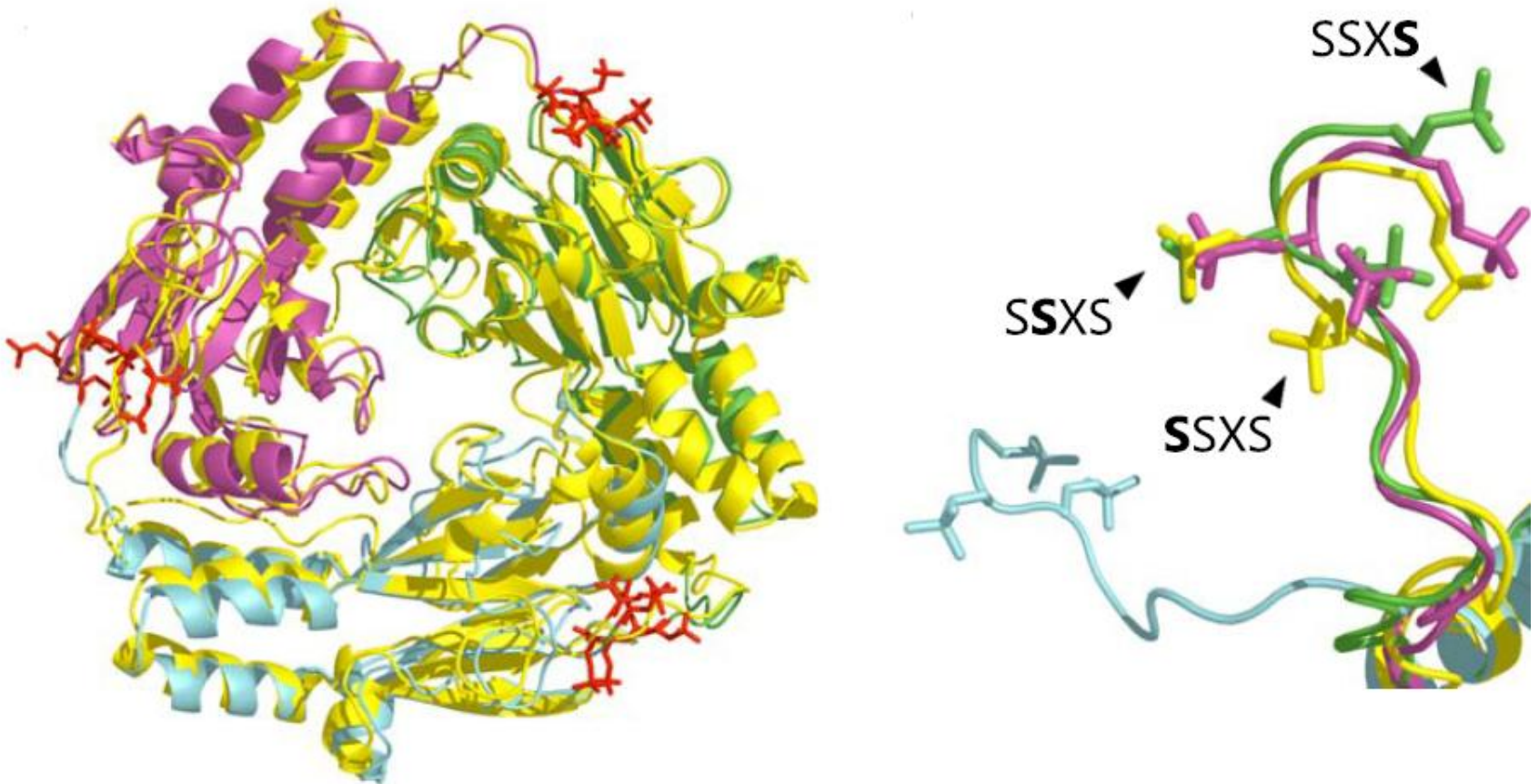


# Protein control through covalent modifications

- 50-90% of human proteins is post-translationally modified
- over 40 different modifications have been described
- most important: phosphorylation, glycosylation, lipidation, methylation, N-acetylation, S-nitrosylation, SUMOylation



# Smad2-MH2 trimer: phospho-group promotes the trimer formation



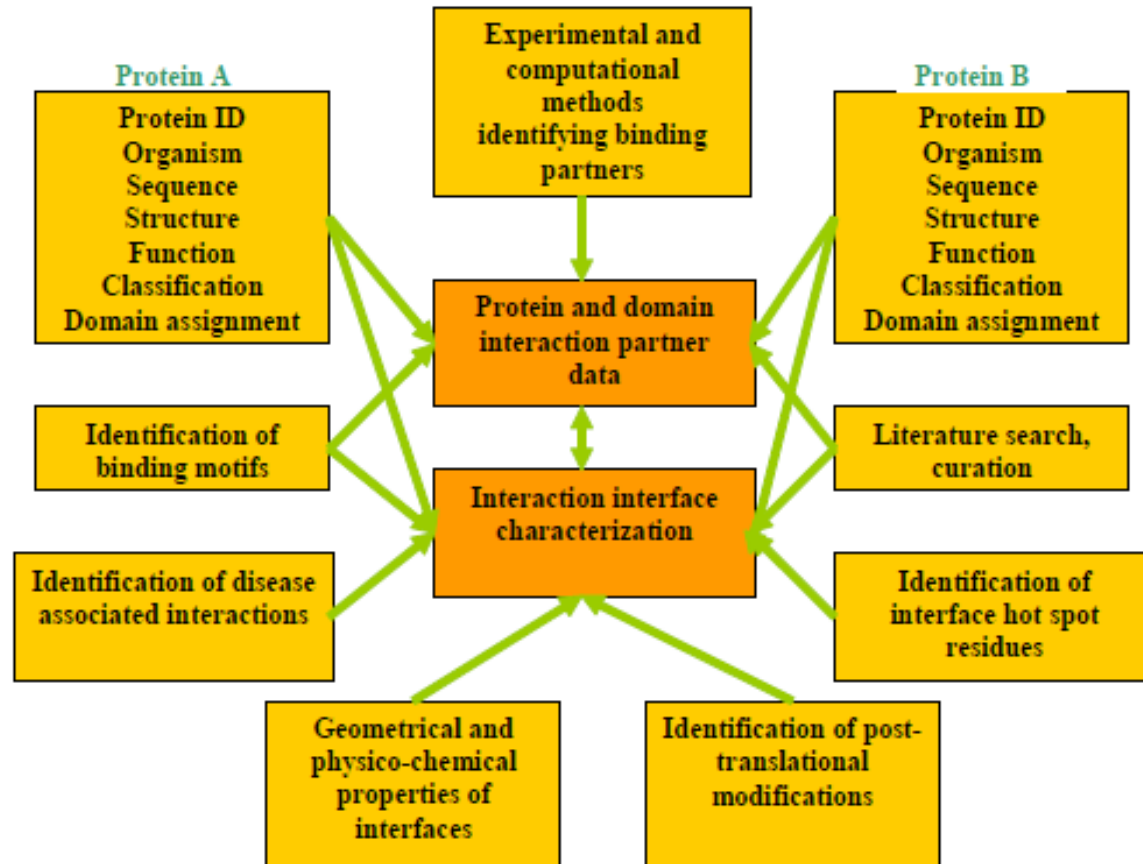
# Effect of phosphorylation/dephosphorylation on Smad complex formation

| Protein      | Site          | pSite | AB    | BC    | AC    | Average $\Delta\Delta\Delta G$ , kcal/mol |
|--------------|---------------|-------|-------|-------|-------|---|
| Smad2 (1kx)  | <u>SSXS</u>   | S->pS | 0.59  | 0.59  | 0.59  | 0.59                                      |
|              | SS <u>X</u> S | pS->S | 0.88  | 0.88  | 0.88  | 0.88                                      |
|              | SSX <u>S</u>  | pS->S | 1.53  | 1.53  | 2.86  | 1.97                                      |
| Smad1 (1khu) | <u>SSXS</u>   | S->pS | -2.11 | 1.58  | -0.22 | -0.25                                     |
|              | SS <u>X</u> S | S->pS | -0.9  | 1.49  | -1.74 | -0.38                                     |
|              | SSX <u>S</u>  | S->pS | -1.45 | -1.87 | -1.08 | -1.47                                     |



# Protein-protein interaction databases

# Data flow in protein interaction databases



# Protein interaction databases

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| <b>Database</b>            | <b>Proteins/Domains</b> | <b>Type</b> | <b>Number of Interactions</b> |
|----------------------------|-------------------------|-------------|-------------------------------|
| DIP <sup>a</sup> , LiveDIP | P                       | E,S         | 55,733                        |
| BIND <sup>a</sup>          | P                       | E,C,S       | 83,517                        |
| MPact/MIPS <sup>a</sup>    | P                       | E,C,F       | 15,488 (4,300) <sup>b</sup>   |
| STRING                     | P                       | E,P,F       | 730,000 (proteins)            |
| MINT <sup>a</sup>          | P                       | E,C         | 71,854                        |
| IntAct <sup>a</sup>        | P                       | E,C         | 68,165                        |
| BioGRID <sup>a</sup>       | P                       | E,C         | 116,000 (30,000) <sup>b</sup> |
| HPRD                       | P                       | E,C         | 33,710                        |
| ProtCom                    | P,D                     | S,H         | 1,770                         |
| 3did, Interprets           | D                       | S,H         | 3,304                         |
| Pibase, ModBase            | D                       | S,H         | 2,387                         |
| CBM                        | D                       | S           | 2,784                         |
| SCOPPI                     | D                       | S           | 3,358                         |
| iPfam                      | D                       | S           | 3,019                         |
| InterDom                   | D                       | P           | 30,037                        |
| DIMA                       | D                       | F,S         | —                             |
| Prolinks                   | P                       | F           | —                             |

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# BioGRID, Stark et al, NAR 2011

| Organism | Experiment Type | Raw Interactions | Non-Redundant Interactions | Unique Proteins | Unique Publications |
|----------|-----------------|------------------|----------------------------|-----------------|---------------------|
| Human    | PHYSICAL        | 60570            | 39635                      | 10259           | 12411               |
|          | GENETIC         | 513              | 489                        | 525             | 198                 |
|          | COMBINED        | 61083            | 39938                      | 10448           | 12470               |
| All      | PHYSICAL        | 204613           | 140813                     | 31754           | 20369               |
|          | GENETIC         | 184715           | 132714                     | 9420            | 8827                |
|          | COMBINED        | 389328           | 267879                     | 33563           | 26894               |

# IBIS – NCBI server to analyze and infer interactions and binding sites

<http://www.ncbi.nlm.nih.gov/Structure/ibis/ibis.cgi>

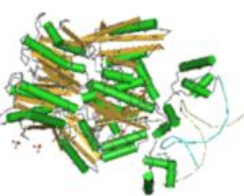


“Observed” interactions – from structures

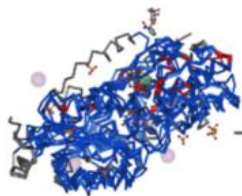
“Inferred” interactions – from homologous structures with observed interactions

## Biological relevance of binding sites:

- occurs in several non-redundant homologs;
- structurally and sequence conserved;
- binds biologically active molecules;
- validated by PISA algorithm (Krissinel & Henrick, 2007);
- overlaps with the curated binding site

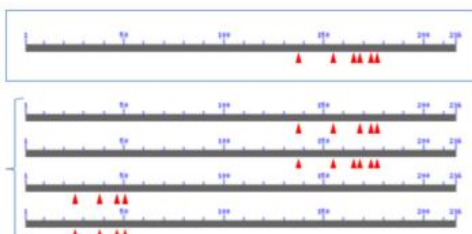


VAST



Related structures

Interactions observed in query structure  
Interactions observed in related structures



Extracting structurally aligned binding sites

|      |      |      |      |      |      |      |
|------|------|------|------|------|------|------|
|      | Lig1 | Lig2 | Lig3 | Lig4 | Lig5 | Lig6 |
| Lig1 |      |      |      |      |      |      |
| Lig2 |      |      |      |      |      |      |
| Lig3 |      |      |      |      |      |      |
| Lig4 |      |      |      |      |      |      |
| Lig5 |      |      |      |      |      |      |
| Lig6 |      |      |      |      |      |      |

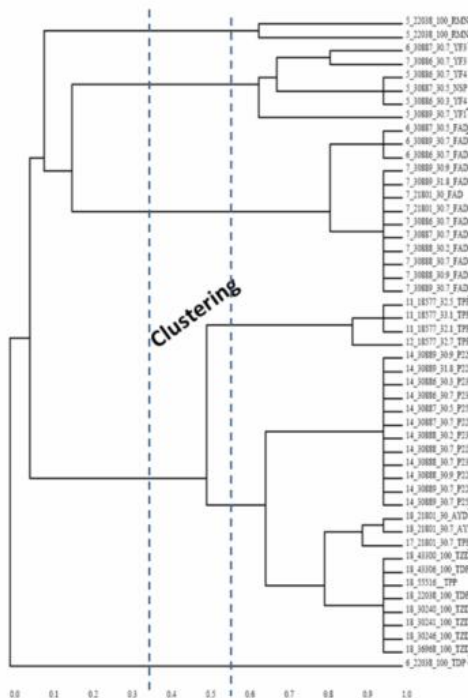
Binding Site Str+Seq Similarity Matrix

Protein Structure

BLAST

Protein Sequence

>Transcriptional Regulator-Phosphoprotein-  
XNVTIYVAREASVSKATVSRVNGNPNVK  
PSTRKKVLETIERLGYRPNVARGLASKKT  
TTVGVIFDINIFYELARIGIEDIATXYKYNI  
LNSNDQNDKELHLLNNDLKGQVDGIIFXS  
GNVTEEHVEELKSPV.....



Clustering of binding sites and choosing a cutoff to define binding site clusters

Inferred binding site clusters

| Structure of complex | Ranking Score | Number of Cluster Members | Average %Identity to Query | Number of Binding Site Residues | Curator Annotation       | Taxonomic Diversity |
|----------------------|---------------|---------------------------|----------------------------|---------------------------------|--------------------------|---------------------|
| SH2                  | 2.6           | 4                         | 39                         | 11                              | SH3/SH2 domain interface | Homo sapiens        |
| PTKc_Syk             | 5.2           | 3                         | 47                         | 19                              | -                        | Homo sapiens        |
| PTKc_Src_like        | 2.6           |                           |                            | 23                              | -                        | Amniota             |
| PTKc_Abl             | 2.5           |                           |                            | 22                              | -                        | Euarchontoglires    |
| PTKc_Ack_like        | 2.4           |                           |                            | 19                              | -                        | Euarchontoglires    |
| PTKc_Csk             | 2.1           |                           |                            | 28                              | -                        | Amniota             |
| S_TKc                | 2.0           |                           |                            | 15                              | -                        | Homo sapiens        |
| No Domain Assigned   | Singleton     |                           |                            | 28                              | -                        | Homo sapiens        |

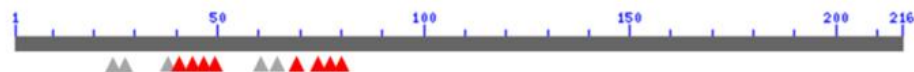
Binding site alignment

Alignment of binding site residues



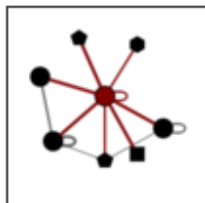
Scoring of binding sites for biological relevance using PSSMs, conservation, contacts, and sequence similarity

Transfer of the inferred binding site on to query sequence



## Query 20CJ\_B

P53 Tumor Suppressor



All interactions for query sequence

### Search 20CJ B interactions

#### Similarity to query

Sequence Identity:

Structure RMSD:

#### Interaction partner type

PDB Code:

Taxonomy:

Reset

PISA Validation:

Protein-Protein (4)

Protein-Chemical (1)

Protein-DNA/RNA (3)

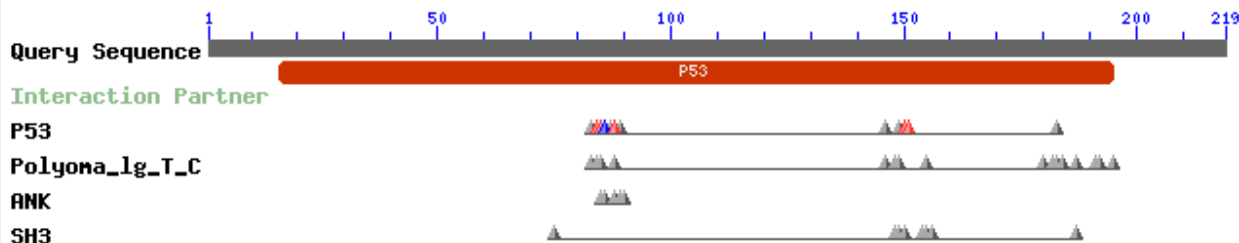
Protein-Ion (1)

Protein PDB ID or GI

New Search

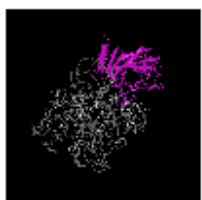
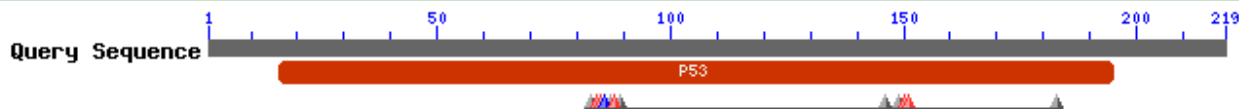
## P53 Tumor Suppressor (sequence B)

[Other 20CJ sequences](#) ▼



List of protein interaction partners and binding sites. Similar binding sites of homologs of the query are grouped into clusters. To view the cluster members click on the plus sign. "O" denoted observed interactios. Note: singletons might not provide enough evidence for biological relevance of binding site.

| Interaction Partner | Ranking Score | Number of Cluster Members | Average %Identity to Query | Number of Binding Site Residues | Taxonomic Diversity |
|---------------------|---------------|---------------------------|----------------------------|---------------------------------|---------------------|
| P53                 | 6.1           | 29                        | 98                         | 12                              | Euarchontoglires    |



View Binding Sites

Download Cn3D

| Homologous complex | Homolog | Interaction partner | %Identity to query | Binding site  |
|--------------------|---------|---------------------|--------------------|---|
|                    | -       | -                   | -                  | 83 84 85 86 87 88 89 146 149 150 151 183<br>C P H H E R C N C M G A |
| 2AC0               | A       | B                   | 100                | - P H H - R - - - M G -   |
| 3EXJ               | B       | A                   | 88                 | C P H H - R - - - M G -   |

\* click structure accession or sequence letter to explore structure and sequence information.

|   |                |           |   |     |    |              |
|---|----------------|-----------|---|-----|----|--------------|
| + | Polyoma_lg_T_C | singleton | 3 | 100 | 16 | Homo sapiens |
| + | ANK            | singleton | 1 | 100 | 5  | Homo sapiens |
| + | SH3            | singleton | 1 | 100 | 8  | Homo sapiens |

**Shapes**

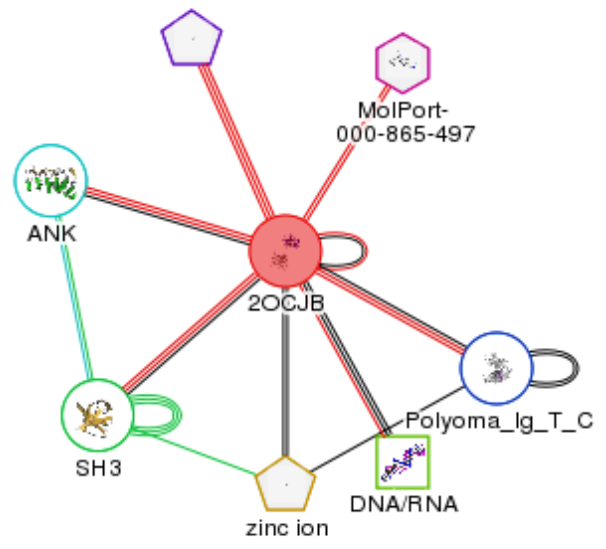
- Protein/domain
- Chemical
- DNA/RNA
- Peptide
- Ion
- Self-interaction

**Colors**

- Observed interactions
- Query protein & query's inferred interactions
- Other nodes & inferred interactions

[Close](#)  
[Help](#)

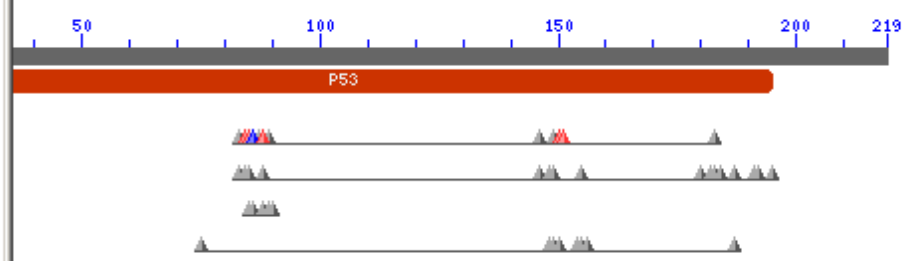
**Query 20CJB: P53 Tumor Suppressor Interaction network (using default parameters)**



**Protein-Chemical (1) Protein-DNA/RNA (3) Protein-Ion (1)**

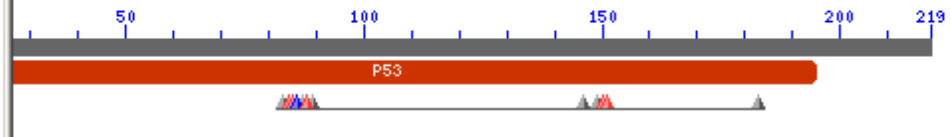
**P53 Tumor Suppressor (sequence B)**

[Other 20CJ sequences](#) ▾



...ers and binding sites. Similar binding sites of homologs of the query are grouped into ...ers click on the plus sign. "O" denoted observed interactios. Note: singletons might not provide ...ance of binding site.

| Ranking Score | Number of Cluster Members | Average %Identity to Query | Number of Binding Site Residues | Taxonomic Diversity |
|---------------|---------------------------|----------------------------|---------------------------------|---------------------|
| 6.1           | 29                        | 98                         | 12                              | Euarchontoglires    |



| Homologous complex | Homolog | Interaction partner | %Identity to query | Binding site  |
|--------------------|---------|---------------------|--------------------|---|
| -                  | -       | -                   | -                  | 83 84 85 86 87 88 89 146 149 150 151 163<br>C P H H E R C N C M G A |
| ACO                | A       | B                   | 100                | - P H H - R - - - M G -   |
| EXJ                | B       | A                   | 88                 | C P H H - R - - - M G -   |

[Download Cn3D](#)

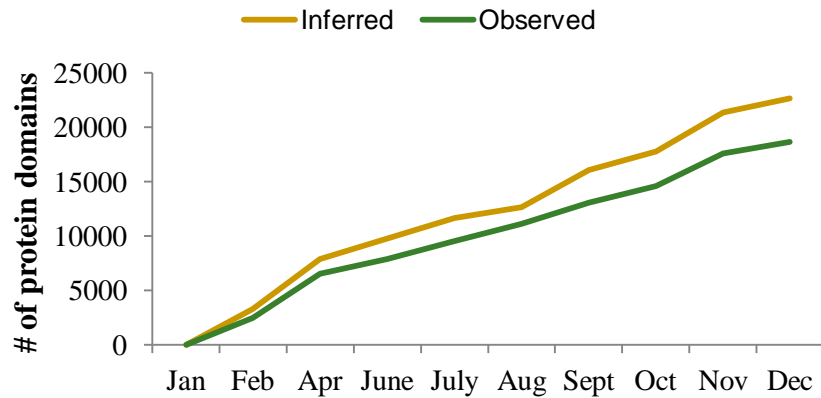
\* click structure accession or sequence letter to explor structure and sequence information.

|   |                |           |   |     |    |              |
|---|----------------|-----------|---|-----|----|--------------|
| + | Polyoma_Ig_T_C | singleton | 3 | 100 | 16 | Homo sapiens |
| + | ANK            | singleton | 1 | 100 | 5  | Homo sapiens |
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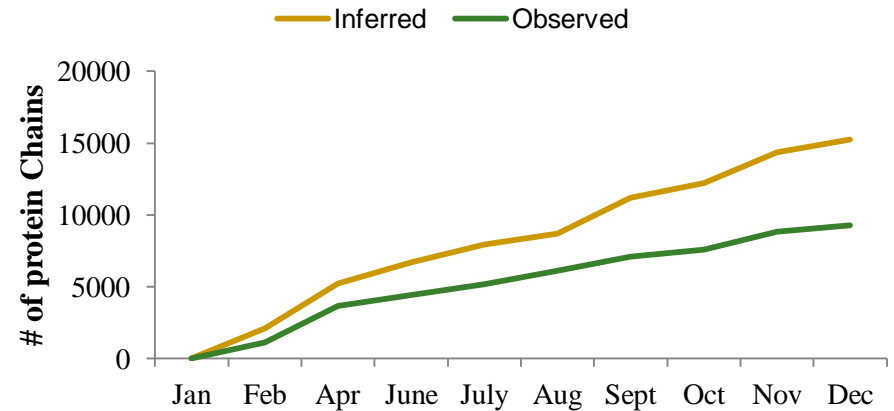


# Growth of IBIS data over 2010

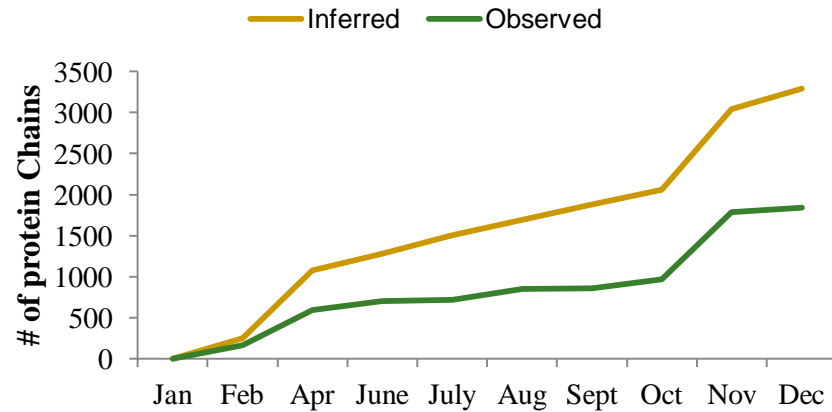
## Protein-Protein Interactions



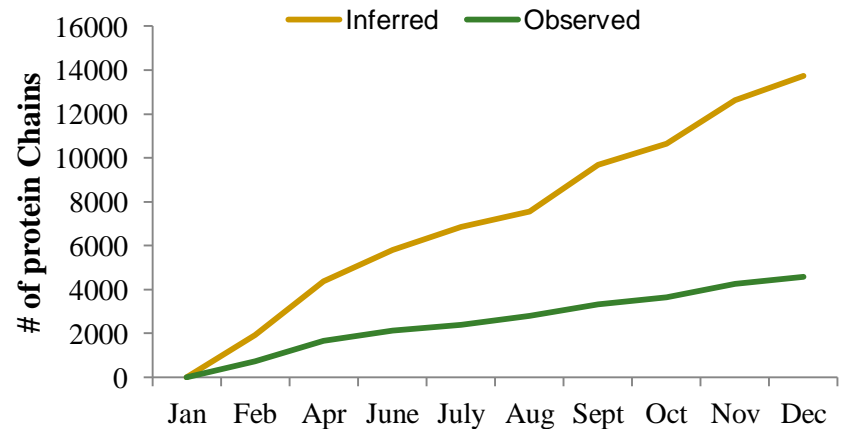
## Protein-Chemical Interactions

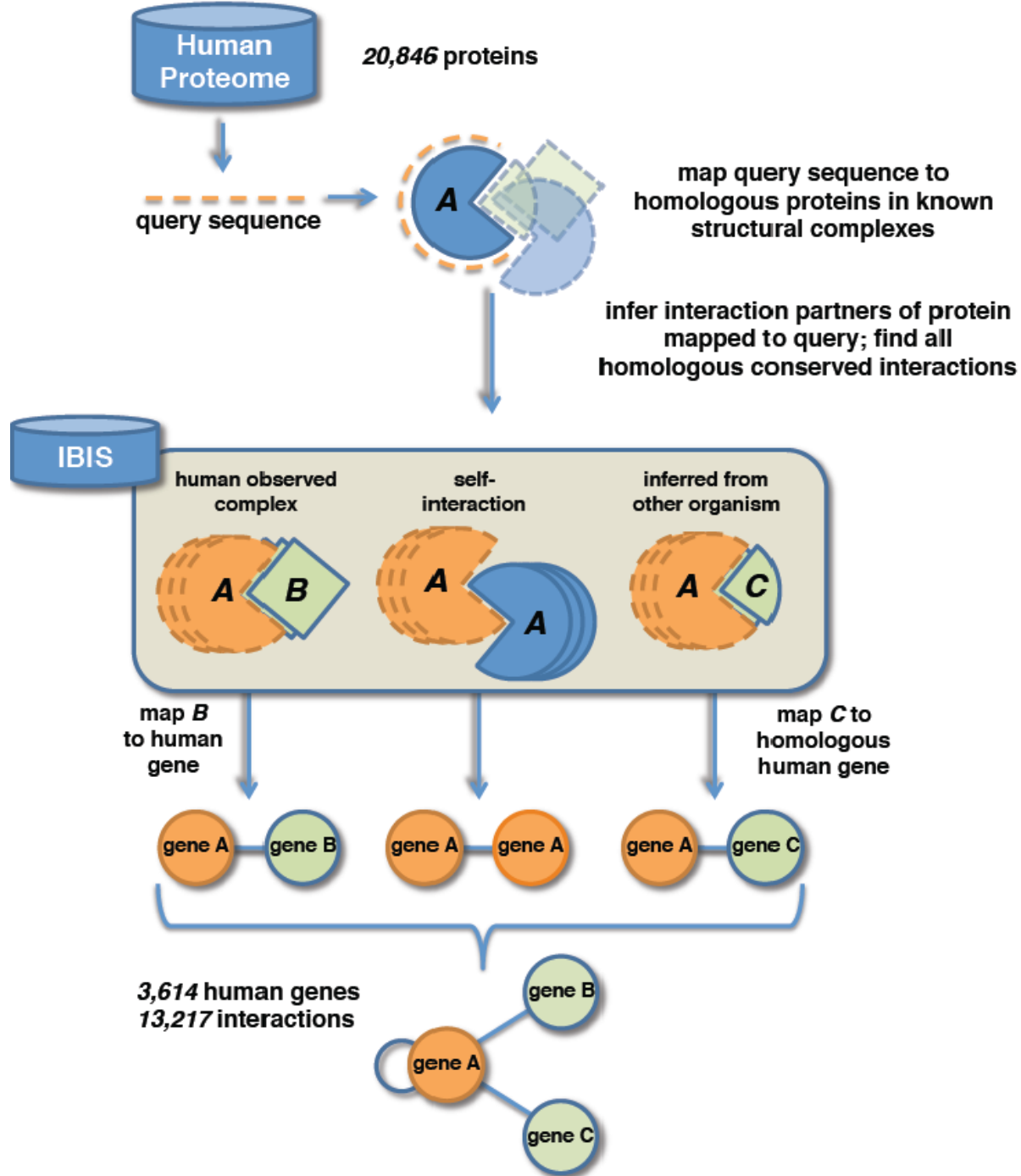


## Protein-RNA Interactions

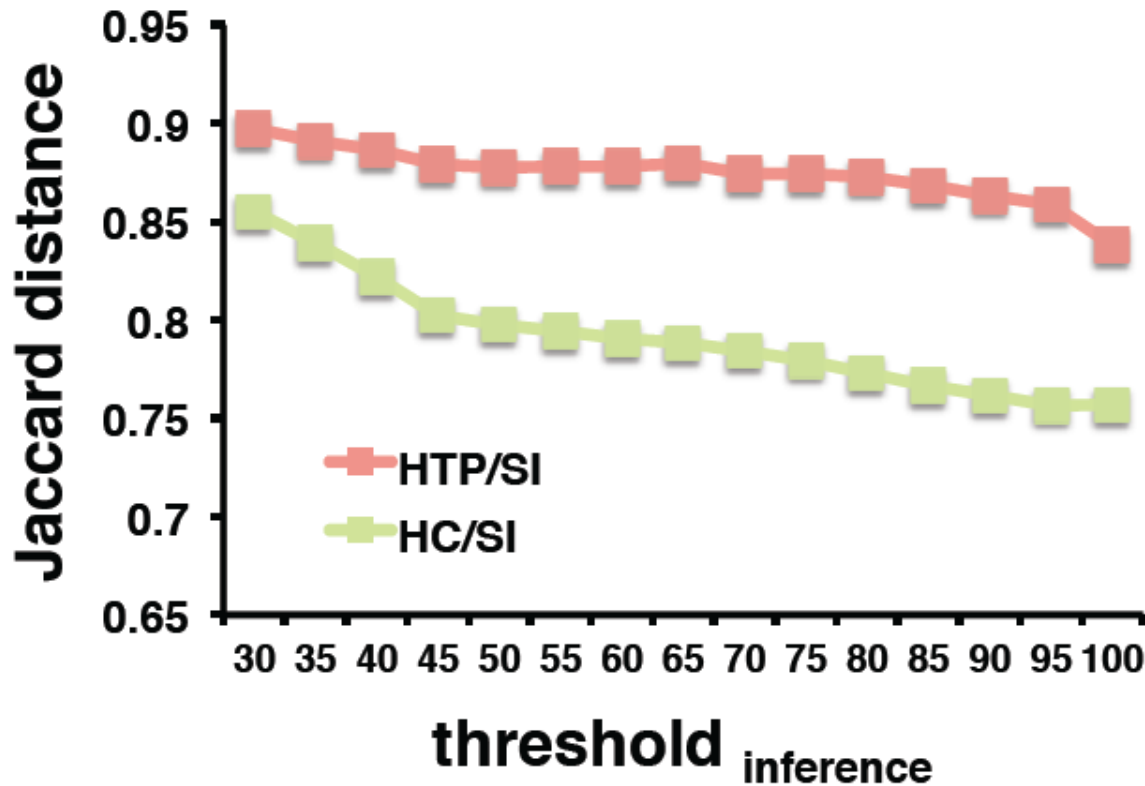


## Protein-Ion Interactions



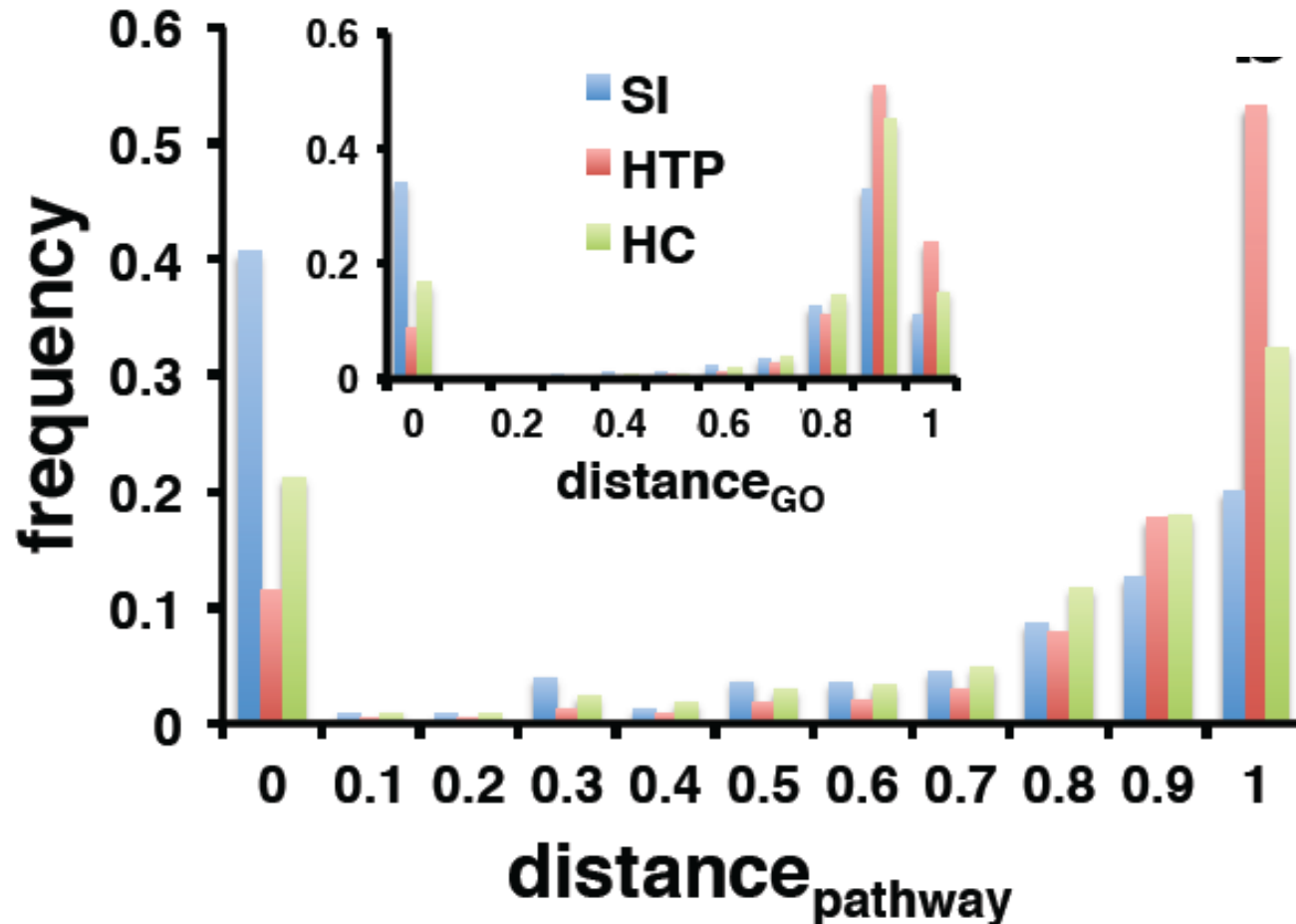


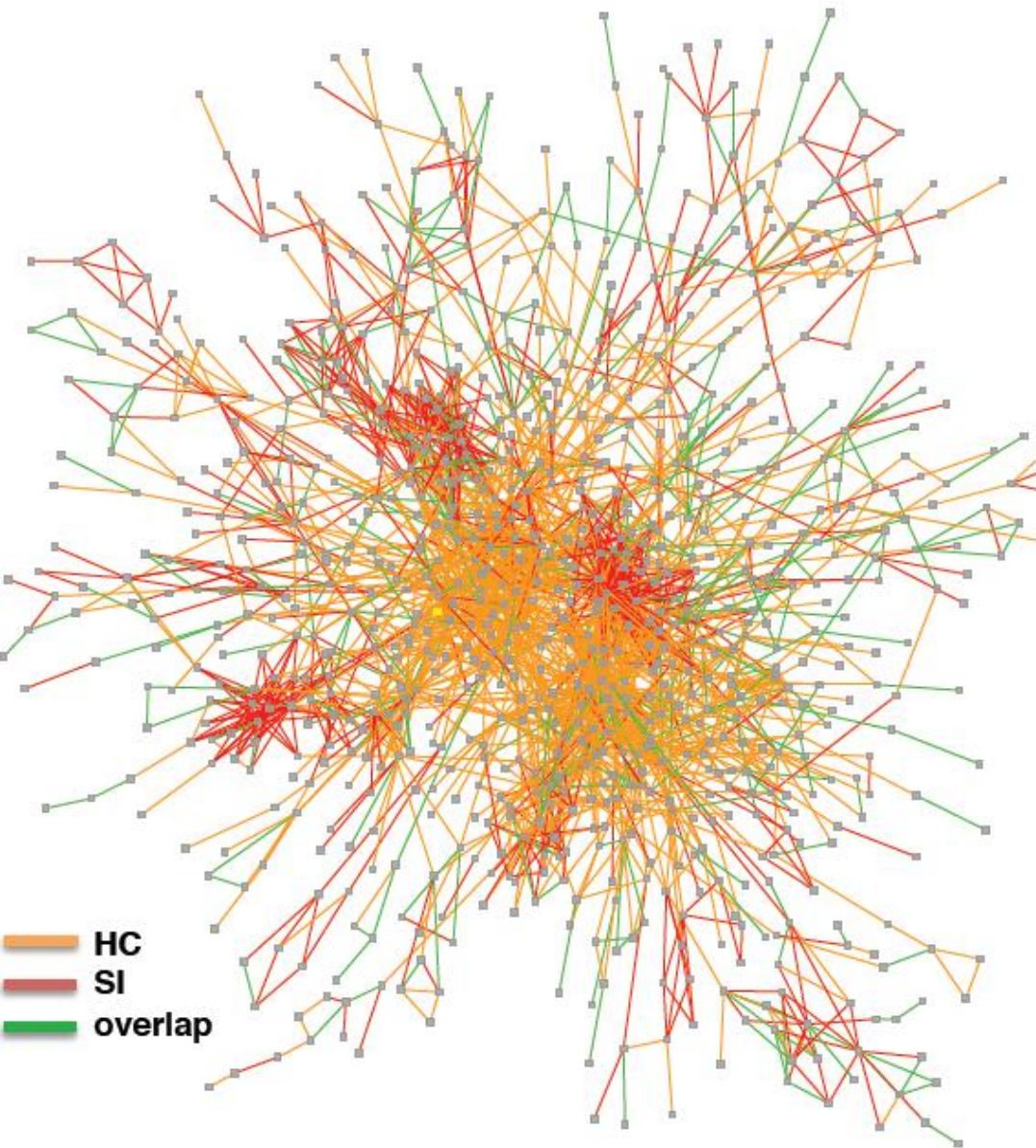
# Comparison of structurally inferred (SI), high-throughput (HTP) and high confidence HTP (HC) networks



**Inference threshold**  
– similarity between query protein and closest homolog with known complex

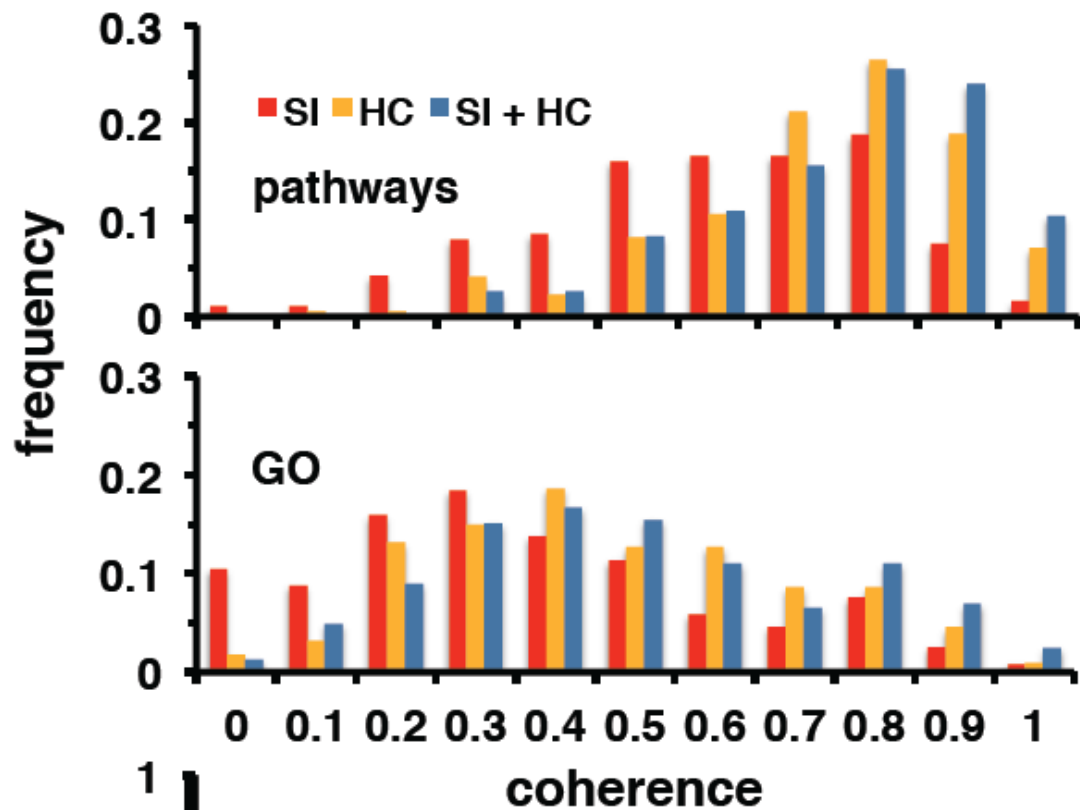
# Structurally inferred networks are more functionally coherent than high-throughput networks



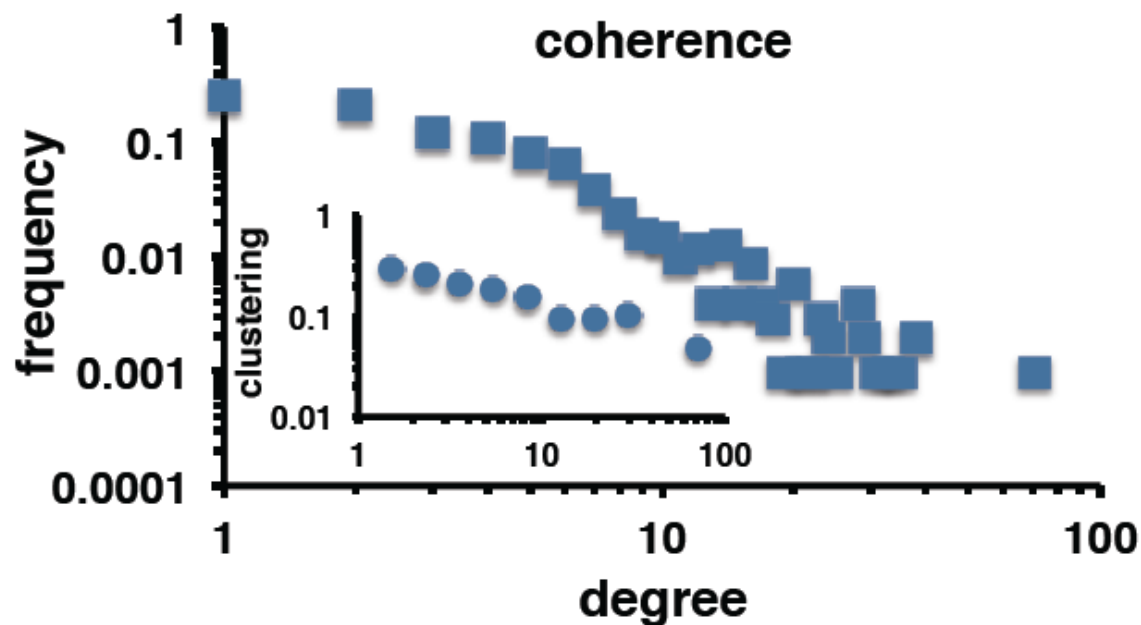


**“Merged” networks =  
structurally inferred (SI)  
+ high confidence high-  
throughput (HC), ~5500  
proteins and ~17000  
interactions**

**SI and HC complement  
each other; ~20% of HC  
interactions are  
observed in SI and ~50%  
SI interactions are  
observed in HC**



**Coherence – fraction of proteins in a network composed by proteins from a given pathway**



**Scale-free, modularity, “small-world” properties` of merged network**

# Acknowledgments

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Dachuan Zhang