

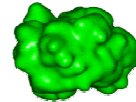
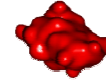
# Protein-Protein Docking

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Princeton University  
CS597A, Fall 2005

## Introduction

Goal:

- Given two protein structures, predict how they form a complex



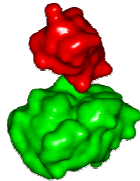
Applications:

- Quaternary structure prediction
- Protein interaction prediction
- etc.

## Introduction

Goal:

- Given two protein structures, predict how they form a complex



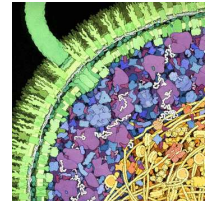
Applications:

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## Introduction

Proteins are densely packed inside cell

- 20-30% of total volume inside cell



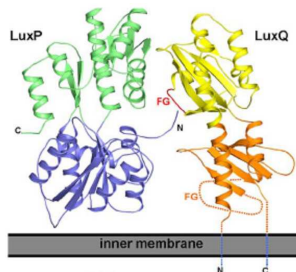
Representation of the approximate numbers, shapes and density of packing of macromolecules inside a cell of *Escherichia coli*. (Illustration by David S Goodsell)

[Szilágyi05]

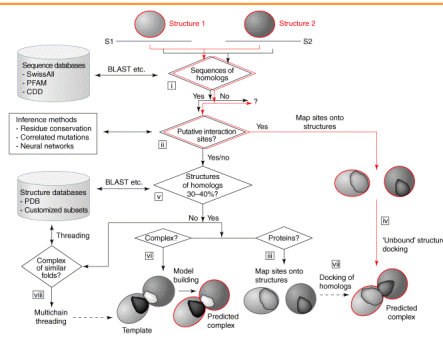
## Introduction

Many biological processes are controlled by protein-protein interactions

- Signal transduction
- Transport
- Cellular motion



## Protein Interaction Prediction



## Outline

Introduction  
 Binding analysis  
 Docking methods  
 Evaluation  
 Discussion



## Outline

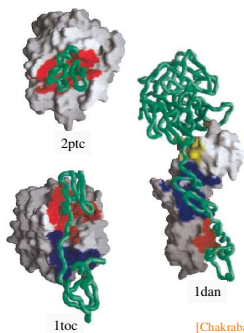
Introduction  
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## Binding Site Analysis

Proteins sometimes contact each other in more than one distinct patch

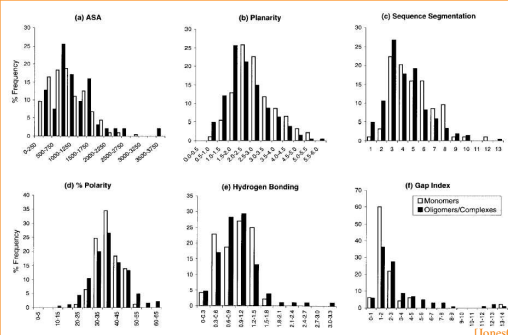
- One patch (46/70)
- Two patches (18/70)
- More patches (6/70)



[Chakrabarti02]



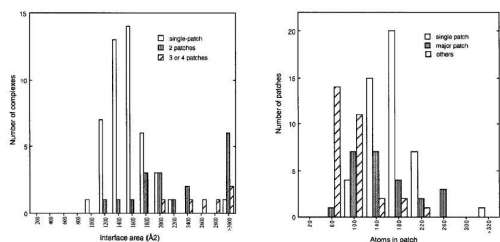
## Binding Site Analysis



[Jones00]

## Binding Site Analysis

Protein interfaces tend to bury  $1320 \pm 520 \text{ \AA}^2$



[Chakrabarti02]



## Binding Site Analysis

Some residues have higher propensity to be in site

TABLE II. Amino Acid Composition of Protein-Protein Interfaces

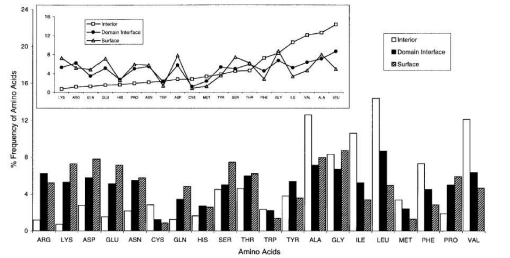
Residue	Number (a)			Area (b)			Propensities (c)		Lo Conte et al. (d)	Jones and Thornton (e)
	Interface	Core	Rim	Interface	Core	Rim	Core	Rim		
All	100.0	100.0	99.9	99.9	100.0	100.0				
Ala	3.9	4.0	3.8	2.8	2.7	3.3	-0.40	-0.26	-0.43	-0.17
Arg	6.4	5.9	7.0	10.1	10.1	8.9	0.13	0.11	0.13	0.27
Asn	5.9	5.4	6.4	5.7	5.4	6.4	-0.14	0.03	-0.12	0.12
Asp	6.6	5.4	8.0	5.1	4.5	6.6	-0.46	-0.07	-0.21	-0.28
Cys	3.5	4.7	2.1	1.7	1.9	1.3	1.00	0.62	0.36	0.43
Glu	3.7	3.7	3.8	4.3	4.3	4.2	-0.34	-0.36	-0.36	-0.11
Gln	6.5	4.6	8.6	6.0	4.4	10.0	-0.80	0.02	-0.47	-0.13
Gly	8.1	7.5	8.7	4.8	4.2	6.4	-0.08	0.35	0.02	-0.07
His	3.4	4.4	2.3	3.8	4.4	2.4	0.84	0.23	0.64	0.41
Ile	3.6	4.1	3.1	4.6	4.9	3.5	0.71	0.38	0.56	0.44
Leu	5.0	5.2	4.5	5.7	5.8	5.3	0.34	0.25	0.29	0.40
Lys	5.7	3.7	8.0	6.5	5.2	9.7	-0.82	-0.29	-0.57	-0.36
Met	2.0	2.6	1.4	3.2	3.7	2.0	1.13	0.51	0.88	0.68
Phe	3.5	5.1	1.7	4.1	5.5	1.1	1.01	-0.69	0.79	0.82
Pro	3.8	3.4	4.2	3.6	3.5	4.1	-0.38	-0.22	-0.25	-0.25
Ser	7.9	7.8	8.1	5.4	4.8	7.3	-0.56	-0.14	-0.42	-0.33
Thr	6.2	5.7	6.8	5.9	4.7	5.9	-0.44	-0.21	-0.35	-0.18
Trp	2.8	4.1	1.3	4.2	5.3	1.6	1.41	0.21	1.25	0.85
Tyr	8.8	8.1	5.4	9.4	10.9	5.3	1.22	0.50	1.04	0.66
Val	4.5	4.5	4.7	3.8	3.8	3.9	0.08	0.11	0.08	0.27

[Chakrabarti02]



## Binding Site Analysis

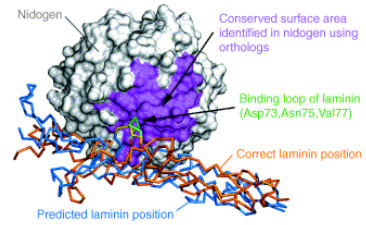
Some residues have higher propensity to be in site



[Jones00]

## Binding Site Analysis

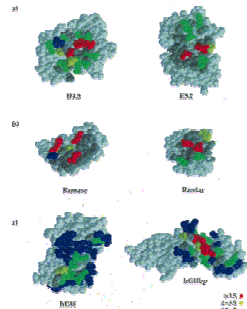
Residues in protein-protein interfaces are often better conserved than others



[Wodak04]

## Binding Site Analysis

Many residues often contribute to binding energetics



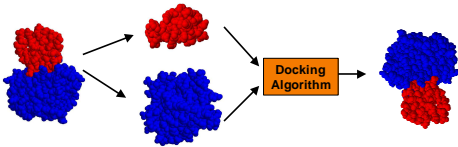
Mapping of  $\Delta\Delta G$  of individual residues onto their location in the complexes [Bogan98]

## Outline

- Introduction
- Binding analysis
- Docking methods** ←
- Evaluation
- Discussion

## Protein-Protein Docking

Bound docking:



Unbound docking:



[Gidalevitz]

## Protein-Protein Docking

Similar to protein-ligand docking

- Search of conformations
- Scoring of energetics

## Protein-Protein Docking



Main differences:

- Sites have ...
  - § Large, flat surfaces
  - § Conservation, maybe
  - § Hydrophobic core
- Binding energetics are usually dominated by ...
  - § Geometry
  - § Hydrophobicity
- Protein flexibility is important
  - § Side-chains
  - § Backbone

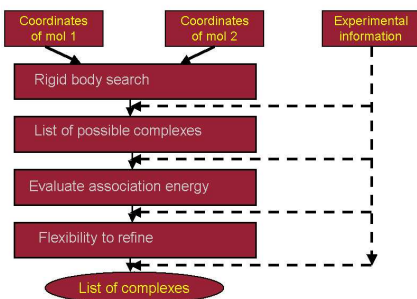
## Protein-Protein Docking



Programs:

- 3D-Dock
- HEX
- GRAMM
- PPD
- DOT
- BIGGER
- DOCK
- AutoDock
- FlexX
- Darwin
- ZDOCK

## Protein-Protein Docking Pipeline

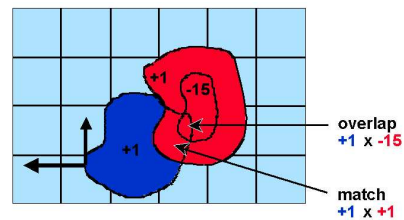


[Smith02] [Lesk&Sternberg]

## Rigid Docking



Shape complementarity:



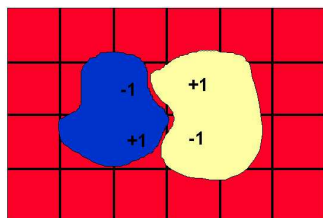
$$C = \sum \sum \sum A(i,j,k) \times B(l,m,n)$$

[Lesk&Sternberg]

## Rigid Docking



Electrostatic complementarity:



$$\text{Charge in 1} = Q(i,j,k) \quad \text{Potential outside 2} = V(l,m,n)$$

$$E = \sum \sum \sum Q(i,j,k) \times V(l,m,n)$$

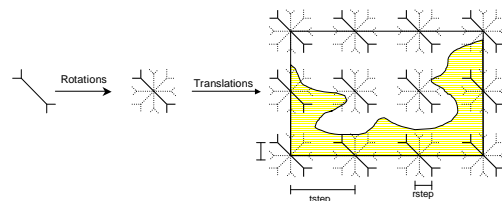
[Lesk&Sternberg]

## Rigid Docking



Search methods:

- Exhaustive
- FFT



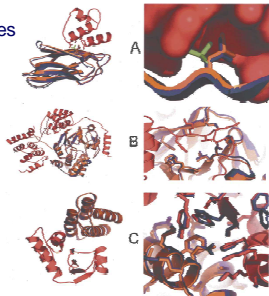
FRED [Yang04]

## Flexible Docking



Search methods:

- Side-chain rotamer libraries
- Monte Carlo algorithms
- Genetic algorithms



[Wang05]

## Outline



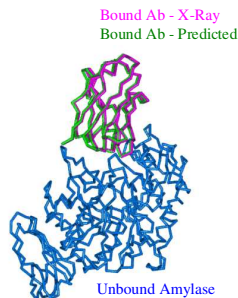
- Introduction
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## Evaluation Methods



Metrics:

- RMSD (usually C $\alpha$ )
- % of contacts predicted



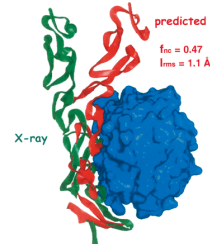
[Lesk&Sternberg]

## Evaluation Methods



Metrics:

- RMSD (usually C $\alpha$ )
- % of contacts predicted



[Janin05]

## Evaluation Methods



Benchmarks:

- CAPRI

Target	Reference	Substrate groups	Model quality*		
			High/Good	Acceptable	
T01	EDS-HumanE8H	Fordyce et al. 2002	16	0	8
T02 <sup>a</sup>	Bacteriophage T4 Fab	Thompson et al. 2001	15	1	6
T03	Flu hemagglutinin Fab	Barkley-Martin et al. 2002	13	2	0
T04	Amylase/antibody Y <sub>100</sub>	Dreyer et al. 2002	13	0	0
T05	Amylase/antibody Y <sub>100</sub>	Dreyer et al. 2002	13	0	0
T06	Amylase/antibody Y <sub>100</sub>	Dreyer et al. 2002	13	0	0
T07 <sup>b</sup>	Superoxide Dismutase	Stadler et al. 2002	14	12	8
T08	Nidovirus hemagglutinin	Takag et al. 2003	18	11	18
T09	Lactalbumin	H. van Tilburg and M. Gralle, in prep.	17	0	0
T10	TBS virus E protein	Brennink et al. 2004	20	1	3
T11	Chikungunya (unknown)	Carrillo et al. 2004	19	0	13
T12	Chikungunya (known)	Carrillo et al. 2004	22	20	10
T13	SARS-CoV-2	M. Gralle and F. Ducrocq, in prep.	21	5	8
T14	Phosphatase 1HMEPPT1	Torok et al. 2004	25	30	32
T15 <sup>a</sup>	Chikungunya D	Gralle et al. 2004	10	9	6
T16 <sup>b</sup>	Xenopus GAD2	Starrs et al. 2004	26	5	4
T19	Oxcarbazepine Fab	Eghoian et al. 2004	24	11	9

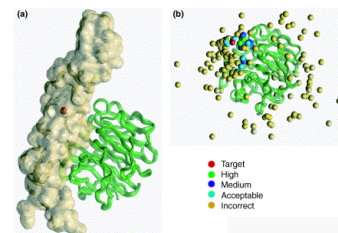
[Janin05]

## Evaluation Methods



Benchmarks:

- CAPRI



X-Ray Structure for Capri Target 08

Distribution of Centers of Mass for predicted Complexes

[Wodak04]

## Discussion



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## References



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