# Lecture 3

# Protein Structure Prediction

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August 22, 2003



- Protein Structure Prediction and why is it useful?
- Methods in Protein Structure Prediction
- Comparative Modeling
  - ✓ Steps in CM (overview + resources)
  - ✓ Accuracy/Applications of comparative models
  - ✓ Case example in MODELLER
  - ✓ CM and Structural Genomics



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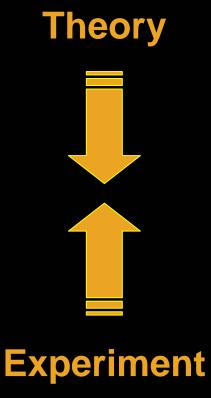
# Why protein structure prediction?

	Y 2003	Y 2005
Sequences	1,000,000	millions
Structures	28,000	50,000



# Why protein structure prediction?

	Y 2003
Sequences	1,000,000
Structures	300,000



http://salilab.org/modbase/

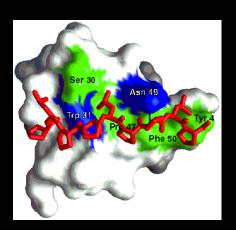


# Function via Structure

# Sequence → Structure → Function

**ASILPKRLFGNC** 

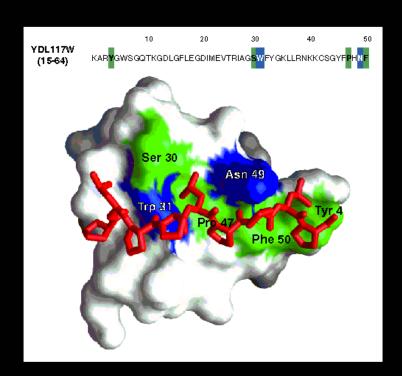






# Why is it useful to know the structure of a protein, not only its sequence?

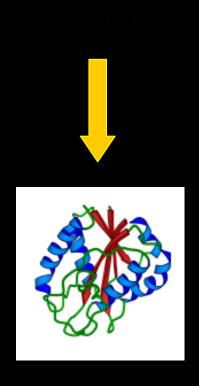
- The biochemical function (activity) of a protein is defined by its interactions with other molecules.
- The biological function is in large part a consequence of these interactions.
- The 3D structure is more informative than sequence because interactions are determined by residues that are close in space but are frequently distant in sequence.



In addition, since evolution tends to conserve function and function depends more directly on structure than on sequence, structure is more conserved in evolution than sequence

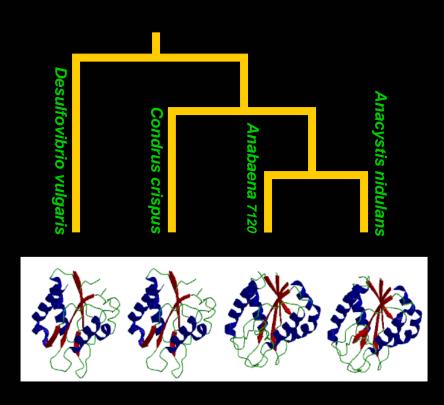
The net result is that patterns in space are frequently more recognizable than patterns in sequence.

# **Principles of Protein Structure**



**Folding** 

Ab initio prediction



**Evolution** 

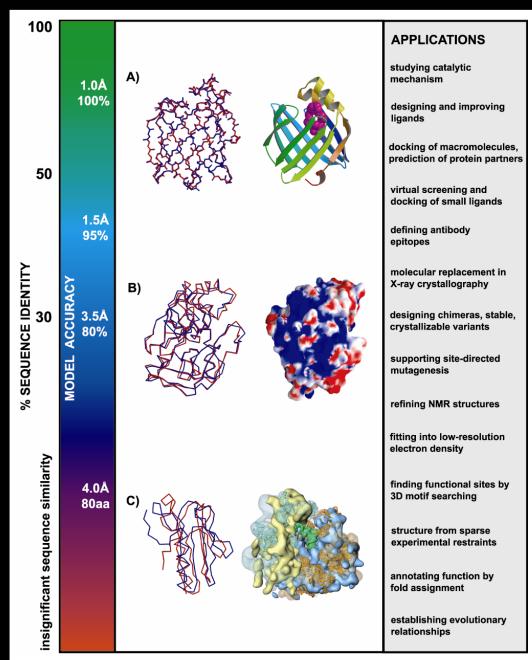
Threading Comparative Modeling



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#### **Resolution** ←→ **Methods**



A. Šali & J. Kuriyan. *TIB*S **22**, M20, 1999.



### **Methods** for Protein Structure Prediction

- Ab Initio
  - ROSETTA

[http://depts.washington.edu/bakerpg/]

- Threading Fold assignment
  - THREADER

[http://www.hgmp.mrc.ac.uk/Registered/Option/threader.html]

- Comparative Modeling
  - MODELLER

[http://www.salilab.org/modeller]



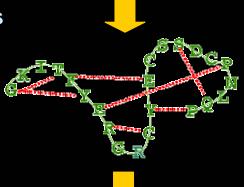
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#### **Comparative Modeling by Satisfaction of Spatial Restraints (MODELLER)**

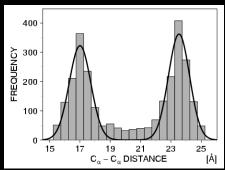
3D GKI TFYERGFQGHCYESDC-NLQP... SEQ GKI TFYERG---RCYESDCPNLQP...

#### 1. Extract spatial restraints



2. Satisfy spatial restraints





$$F(\mathbf{R}) = \prod_{i} p_{i}(f_{i}/I)$$

A. Šali & T. Blundell. *J. Mol. Biol.* **234**, 779, 1993. J.P. Overington & A. Šali. *Prot. Sci.* **3**, 1582, 1994. A. Fiser, R. Do & A. Šali, *Prot. Sci.*, 9, 1753, 2000.

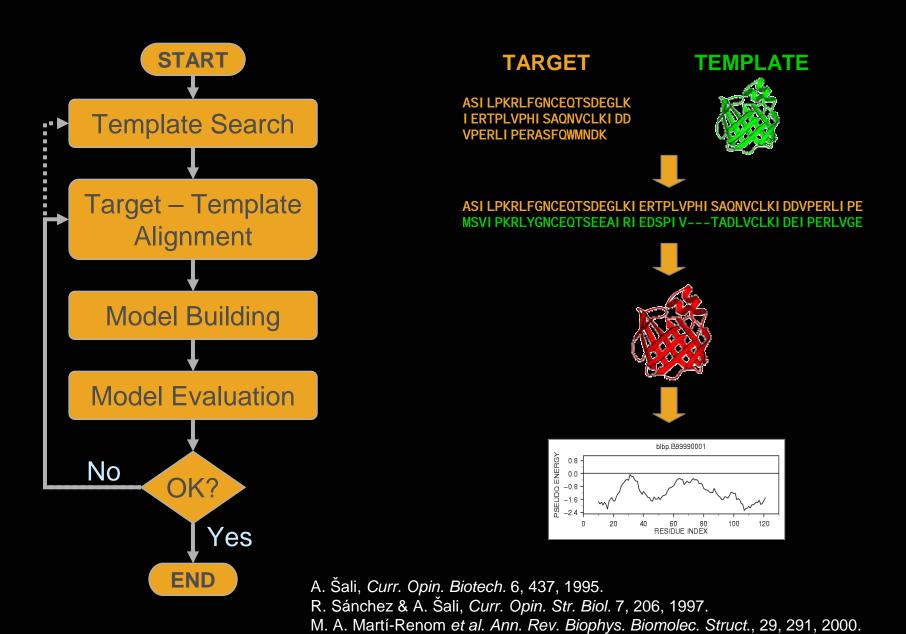
http://www.salilab.org/



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#### **Steps in Comparative Protein Structure Modeling**





# **Template Search Methods**

- Sequence similarity searches
  - BLAST [http://www.ncbi.nlm.nih.gov/BLAST/]
  - FastA program [http://www.ebi.ac.uk/fasta33/]
- Profile and iterative methods
  - HMMs [http://www.cse.ucsc.edu/research/compbio/HMM-apps/]
  - PSI-BLAST [http://www.ncbi.nlm.nih.gov/BLAST/]
- Structure based threading
  - THREADER [http://bioinf.cs.ucl.ac.uk/threader/]
  - PROFIT [http://www.came.sbg.ac.at/]

# **Target – Template Alignment Methods**

- Dynamic Programming Pairwise Alignment
  - ALIGN [http://www.salilab.org/modeller/]
- Multiple Alignments,
  - Psi-Blast [http://www.ncbi.nlm.nih.gov/BLAST/]
  - HMM [http://www.cse.ucsc.edu/research/compbio/HMM-apps/]
  - ALIGN4D [http://www.salilab.org/modeller/]
  - CLUSTALW [http://www.ebi.ac.uk/clustalw/]
- Structure based approaches
  - Threading [http://bioinf.cs.ucl.ac.uk/threader/]

# **Model Building Methods**

- Rigid Body Assembly
  - COMPOSER [http://www-cryst.bioc.cam.ac.uk/]
- Segment Matching
  - SEGMOD
- Satisfaction of Spatial Restraints
  - MODELLER [http://www.salilab.org/modeller/]



#### **Model Evaluation methods**

- Stereochemistry
  - PROCHECK/ WHAT-IF [http://www.biochem.ucl.ac.uk/~roman/procheck/procheck.html]
- Environment
  - VERIFY3D [http://www.doe-mbi.ucla.edu/Services/Verify\_3D/]
- Statistical potentials based methods
  - PROSAII [http://www.came.sbg.ac.at/]
  - ANOLEA [http://protein.bio.puc.cl/cardex/servers/index.html]

http://www.salilab.org/bioinformatics\_resources.shtml



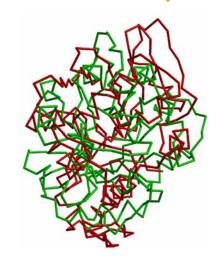
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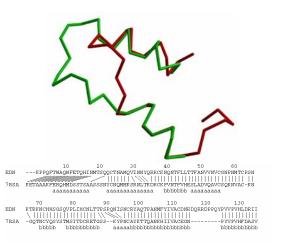
### **Typical Errors in Comparative Models**

#### **Incorrect template**

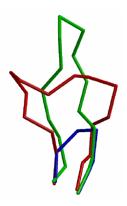
# MODEL X-RAY TEMPLATE



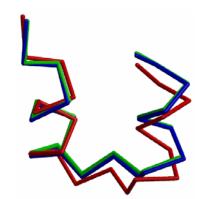
#### **Misalignment**



# Region without a template



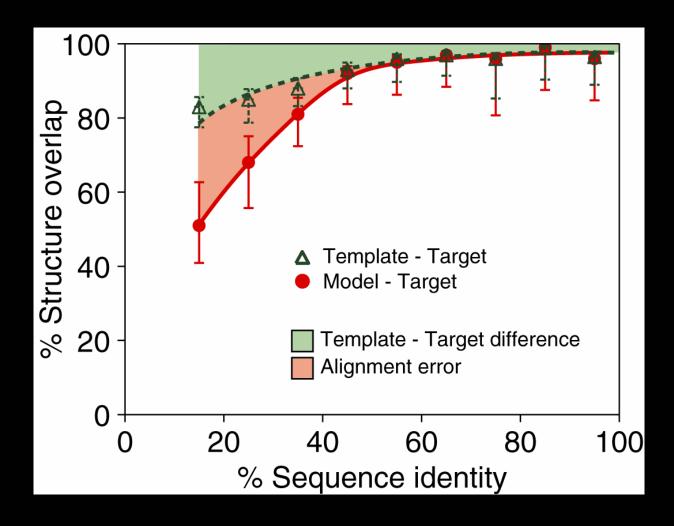
Distortion in correctly aligned regions



#### Sidechain packing



#### **Model Accuracy** as a Function of Target-Template Sequence Identity



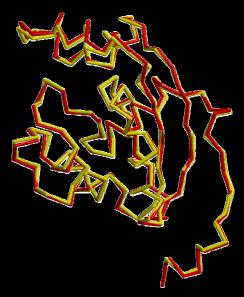
Sánchez, R., Šali, A. Proc Natl Acad Sci U S A. 95 pp13597-602. (1998).



Model Accuracy
Marti-Renom *et al.* Annu.Rev.Biophys.Biomol.Struct. **29**, 291-325, 2000.

#### HIGH ACCURACY

**NM23** Seq id 77% Cα equiv 147/148 **RMSD 0.41**Å

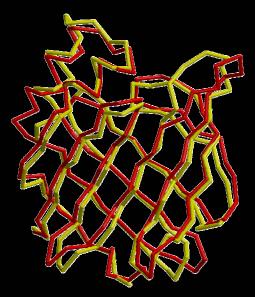


Sidechains

X-RAY **MODEL** 

#### MEDIUM ACCURACY

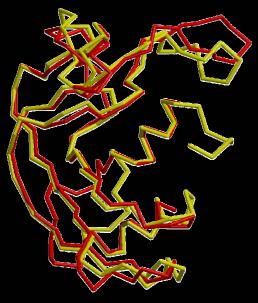
**CRABP** Seq id 41% **C**α equiv 122/137 **RMSD 1.34Å** 



Sidechains Core backbone Loops

#### **LOW ACCURACY**

**EDN** Seq id 33%  $C\alpha$  equiv 90/134 **RMSD 1.17Å** 

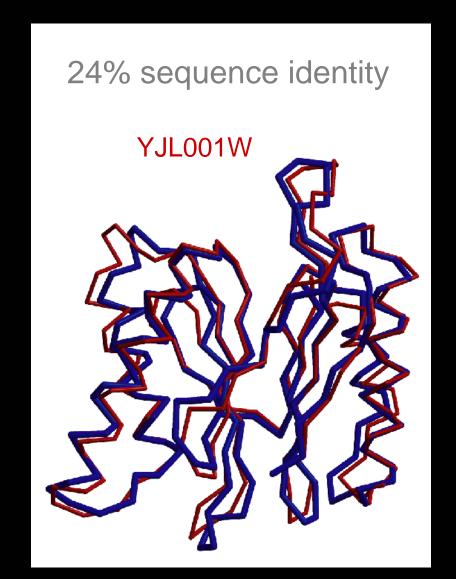


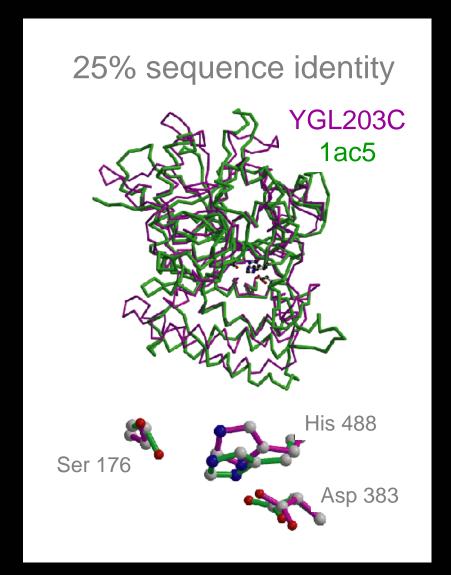
**Sidechains** Core backbone Loops Alignment Fold assignment



#### **Some Models Can Be Surprisingly Accurate**

(in Some Core or Active Site Regions)





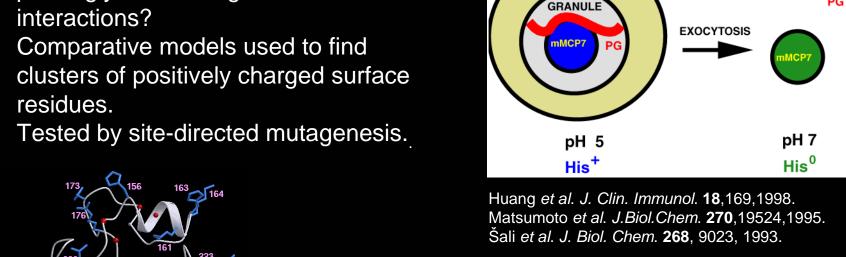


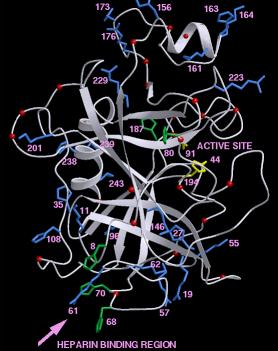
#### Do mast cell proteases bind proteoglycans? Where? When?

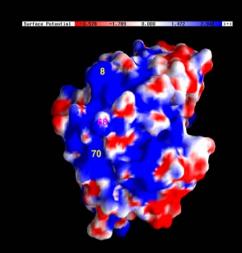
MAST CELL

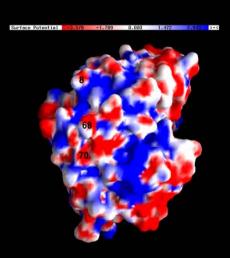
#### Predicting features of a model that are not present in the template

- mMCPs bind negatively charged proteoglycans through electrostatic interactions?
- 2. residues.
- 3.





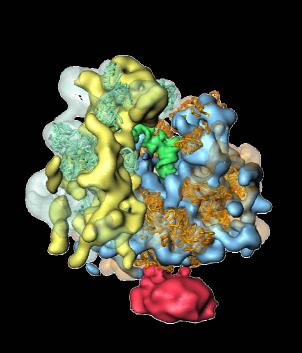


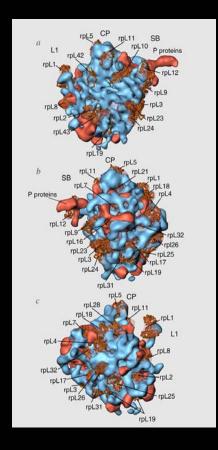




# Some Models Can Be Used in Docking to Density Maps

(Yeast Ribosomal 40S subunit)





Docking of comparative models into the cryo-EM map.

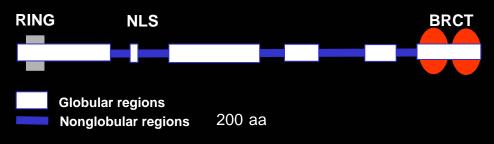
Spahn et al. 2001 Cell **107**:373-386

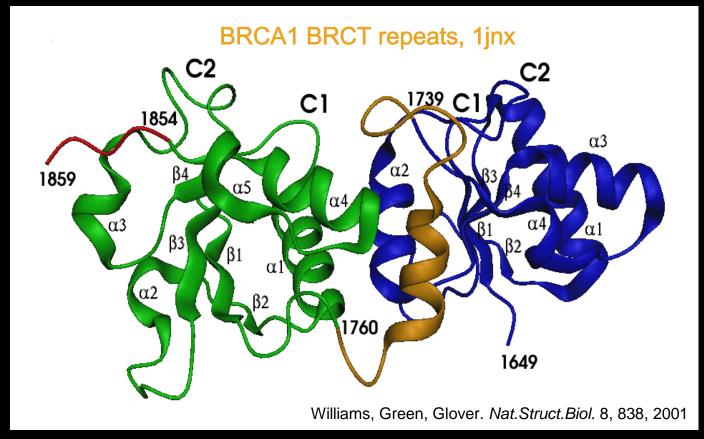
Small 30S subunit from *Thermus thermophilus* Large 50S subunit from *Haloarcula marismortui* 



# Human BRCA1 and its two BRCT domains

(structural analysis of missense mutations SNPs)





CONFIDENTIAL



BRACAnalysis <sup>™</sup>
Comprehensive BRCA1-BRCA2 Gene Sequence Analysis Result

Niecee Singer, MS

Strang Cancer Prevention Center 428 E 72nd St New York, NY 10021 SPECIMEN Specimen Type: Blood

Draw Oate: n/a Accession Date: Oct 27, 2000 Report Date: Nov 17, 2000 PATIENT

Name: Date of Birth: Feb 02, 1953 Patient ID:

Gender: Female Accession #: 00019998 Requisition #: 56694

Physician: Fred Gilbert, MD

**Test Result** 

Gene Analyzed BRCA2 BRCA1 Specific Genetic Variant H2116R None Detected

#### Interpretation

#### GENETIC VARIANT OF UNCERTAIN SIGNIFICANCE

The BRCA2 variant H2116R results in the substitution of arginine for histidine at amino acid position 2116 of the BRCA2 protein. Variants of this type may or may not affect BRCA2 protein function. Therefore, the contribution of this variant to the relative risk of breast or ovarian cancer cannot be established solely from this analysis. The observation by Myriad Genetic Laboratories of this particular variant in an individual with a deleterious truncating mutation in BRCA2, however, reduces the likelihood that H2116R is itself deleterious.

Authorized Signature:

Brian E. Ward, Ph.D. Laboratory Director Thomas S. Frank, M.O. Medical Director

These testresults should only be used in conjunction with the pacent's choical history and any previous analysis of appropriate family members. It is strongly recommended that those results be communicated to the pallent in a sening that includes appropriate counseling. The accompanying Technical Specifications summary describes the analysis, method, performance characteristics, former counseling. This test may be considered investigational by some states. This test was developed and its performance characteristics determined by Myriad Genefic Laboratories. Blues not been reviewed by the U.S. Food and Orug Administration. The FDA has determined that such cearance or approval in not necessary.



# Missense Mutations in **BRCT** Domains by Function

F1761S

M1775E

cancer associated	not cancer associated	
		M1652K L1705P
C1697R		I 1657P S1715N

no transcription activation

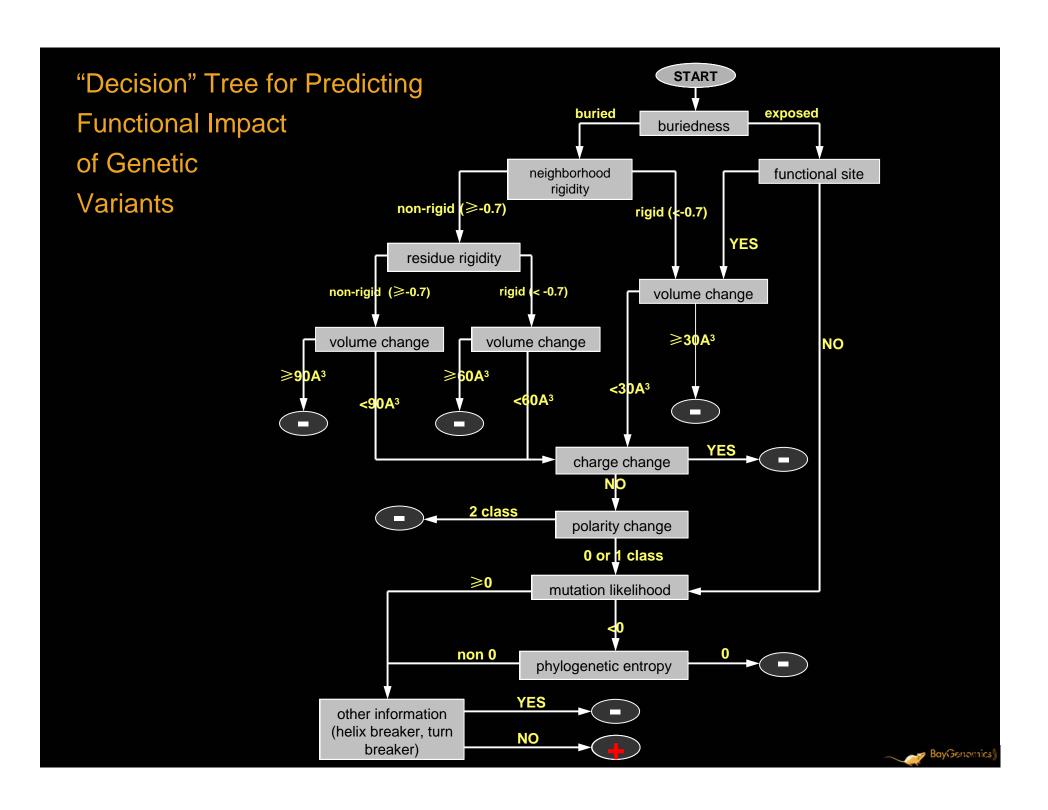
tra	ns	cri	pti	or	
	cti				

R1699W E1660G M1775K S1722F A1708E F1734L L1780P H1686Q S1715R G1738E **I1807S** R1699Q P1749R G1743R V1833E K1702E M1775R A1843T Y1703H A1752P F1761I F1704S V1665M D1692N M1652I G1706A A1669S D1733G M1775V P1806A M1652T W1718S R1751P C1787S A1823T R1751Q G1788D V1833M V1653M T1720A L1664P W1730S R1758G W1837R G1788V T1685A F1734S W1837G L1764P G1803A T1685I E1735K 11766S V1804D S1841N M1689R V1736A A1843P P1771L V1808A D1692Y G1738R T1773S V1809A T1852S P1776S P1856T F1695L D1739E V1809F V1696L D1739G D1778N V1810G P1859R R1699L D1739Y D1778G Q1811R G1706E V1741G D1778H P1812S W1718C H1746N M1783T N1819S

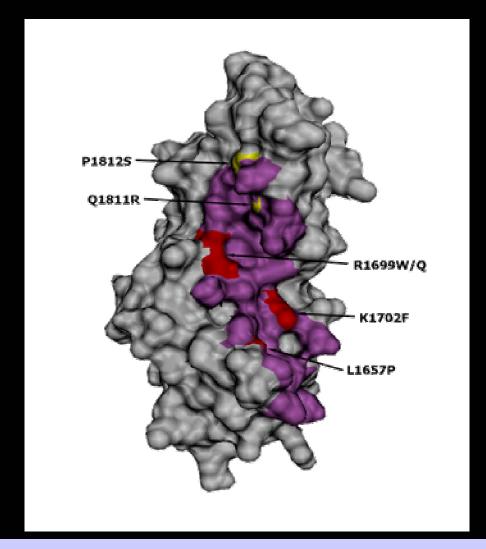
L1657P

S1715N





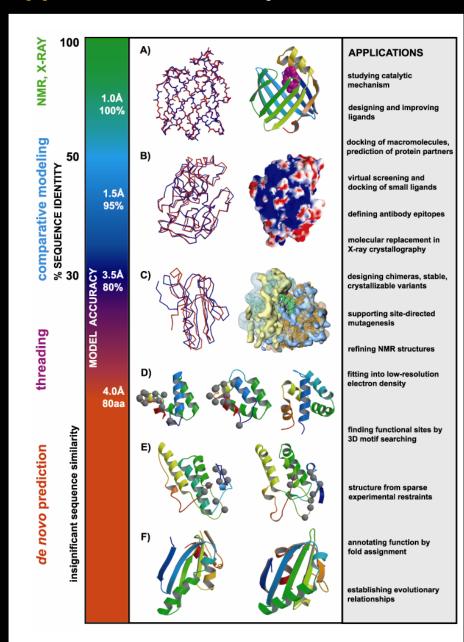
# **Putative Binding Site on BRCA1**



RMSMV**VSGL**TPEE**FM**LV**Y**KFARKHHIT**L**TNLITEETTHVVMKTDAEFVC**ERTLK**Y**F**LGIAGGKWVVSYFWVTQSIKERKM LNEHDFEVRGDVVNGRNHQGPKRARESQDRKIFRGLEICCYGPF**TNM**PTDQLEWMVQLCGASVVKELSSFTLGTGVHPIV VVQPDAWTEDNGFHAIGQMCEAPVVT**RE**WV**L**DSVALYQCQELDTYLIPQIP



### **Applications of Comparative Models**



Baker & Sali Science **294**, 93-96, 2001

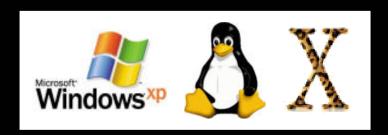


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## **Obtaining Modeller** and related information

- MODELLER (6v2) web page
- http://www.salilab.org/modeller/
  - Download Software (Linux/Windows/Mac)
  - HTML Manual
  - Join Mailing List





### **Using Modeller**

- No GUI! ⊗
- Controlled by command file (script) ⊗ ⊗
- Script is written in TOP language ⊗⊗⊗
- TOP language is simple ②②②②



# **Using Modeller**

- INPUT:
  - Target Sequence (FASTA/PIR format)
  - Template Structure (PDB format)
  - TOP command file
- OUTPUT:
  - Target-Template Alignment
  - Model in PDB format
  - Other data

- ✓ Target: Brain lipid-binding protein (BLBP)
- ✓ BLBP sequence in PIR (MODELLER) format:

```
>P1;blbp
sequence:blbp::::::
VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSI
DDRNCKSVVRLDGDKLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA*
```

PSI-BLAST template search: Template: PDB file 1HMS:\_



#### STEP 1: Align blbp and 1hms sequences

TOP script for target-template alignment

```
READ_MODEL FILE = 'lhms.pdb'

SEQUENCE_TO_ALI ALIGN_CODES = 'lhms'

READ_ALIGNMENT FILE = 'blbp.seq', ALIGN_CODES = 'blbp', ADD_SEQUENCE = on

ALIGN

WRITE_ALIGNMENT FILE='blbp-lhms.ali', ALIGNMENT_FORMAT = 'PIR'

WRITE_ALIGNMENT FILE='blbp-lhms.pap', ALIGNMENT_FORMAT = 'PAP'
```



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```



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READ_MODEL FILE = 'lhms.pdb'

SEQUENCE_TO_ALI ALIGN_CODES = 'lhms'

READ_ALIGNMENT FILE = 'blbp.seq', ALIGN_CODES = 'blbp', ADD_SEQUENCE = on ALIGN

WRITE_ALIGNMENT FILE='blbp-1hms.ali', ALIGNMENT_FORMAT = 'PIR'

WRITE_ALIGNMENT FILE='blbp-1hms.pap', ALIGNMENT_FORMAT = 'PAP'
```



STEP 1: Align blbp and 1hms sequences
Output

```
>P1;1hms
structureX:1hms: 1 :: 131 :: undefined:undefined:-1.00:-1.00
VDAFLGTWKLVDSKNFDDYMKSLGVGFATRQVASMTKPTTIIEKNGDILTLKTHSTFKNTEISFKLGVEFDETTA
DDRKVKSIVTLDGGKLVHLQKWDGQETTLVRELIDGKLILTLTHGTAVCTRTYEKE*
>P1;blbp
sequence:blbp: :: :: :: 0.00: 0.00
VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSI
DDRNCKSVVRLDGDKLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA*
```



STEP 1: Align blbp and 1hms sequences
Output

```
>P1;1hms
structureX:1hms: 1 : : 131 : :undefined:undefined:-1.00:-1.00
VDAFLGTWKLVDSKNFDDYMKSLGVGFATRQVASMTKPTTIIEKNGDILTLKTHSTFKNTEISFKLGVEFDETTA
DDRKVKSIVTLDGGKLVHLQKWDGQETTLVRELIDGKLILTLTHGTAVCTRTYEKE*
>P1;blbp
sequence:blbp: : : : : : 0.00: 0.00
VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSI
DDRNCKSVVRLDGDKLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA*
```



# STEP 1: Align blbp and 1hms sequences Output





STEP 2: Model the blbp structure using the alignment from step 1.

TOP script for model building

```
INCLUDE

SET ALNFILE = 'blbp-1hms.ali'

SET KNOWNS = 'lhms'

SET SEQUENCE = 'blbp'

SET STARTING_MODEL = 1

SET ENDING_MODEL = 1

CALL ROUTINE = 'model'
```

Run by typing mod model.top.
Check file model.log



STEP 2: Model the blbp structure using the alignment from step 1.

TOP script for model building

```
INCLUDE

SET ALNFILE = 'blbp-1hms.ali'

SET KNOWNS = 'lhms'

SET SEQUENCE = 'blbp'

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SET STARTING_MODEL = 1

SET ENDING_MODEL = 1

CALL ROUTINE = 'model'
```

Run by typing mod model.top. Check file model.log



STEP 2: Model the blbp structure using the alignment from step 1.

Output coordinates file

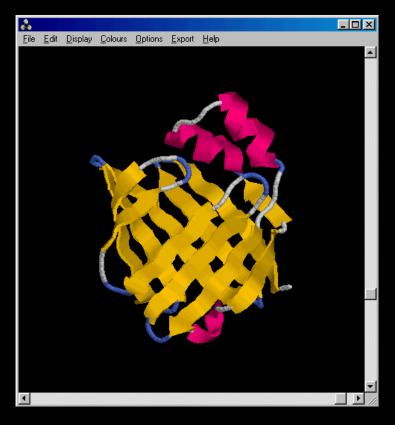
## Model file → blbp.B99990001

- PDB file
- Can be viewed with Chimera

[http://www.cgl.ucsf.edu/chimera/]

#### Rasmol

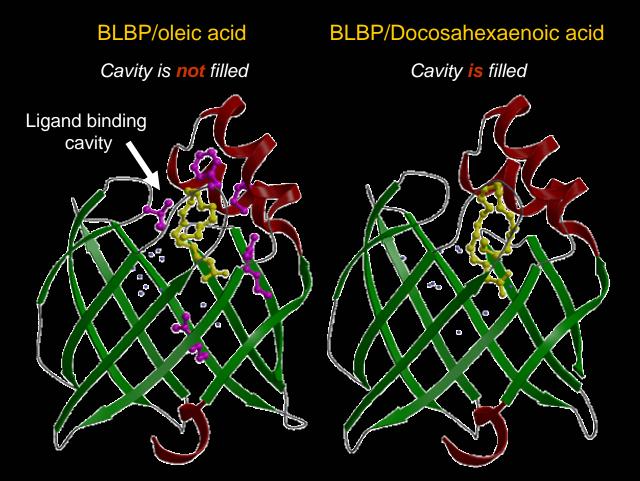
[http://www.bernstein-plus-sons.com/software/rasmol/]





#### What is the physiological ligand of Brain Lipid-Binding Protein?

#### Predicting features of a model that are not present in the template



BLBP binds fatty

acids.

2. Build a 3D model.

3. Find the fatty acid that fits most snuggly into the ligand binding cavity.

L. Xu, R. Sánchez, A. Šali, N. Heintz, *J. Biol. Chem.* **271**, 24711, 1996.

## Summary

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## **Structural Genomics**

#### Definition:

The aim of structural genomics is to put every protein sequence within a modeling distance of a known protein structure.

#### Size of the problem:

- There are a few thousand domain fold families.
- There are ~16,000 sequence families (30% sequence id).

#### Solution:

- Determine many protein structures.
- Increase modeling distance.

Šali. *Nat. Struct. Biol.* **5**, 1029, 1998. Šali & Kuriyan. *TIBS* **22**, M20, 1999. Burley et al. Nat. Genet. 23, 151, 1999. Sanchez et al. Nat. Str. Biol. 7, 986, 2000



# How can Comparative Modeling be used in Structural Genomics?

## Target Selection

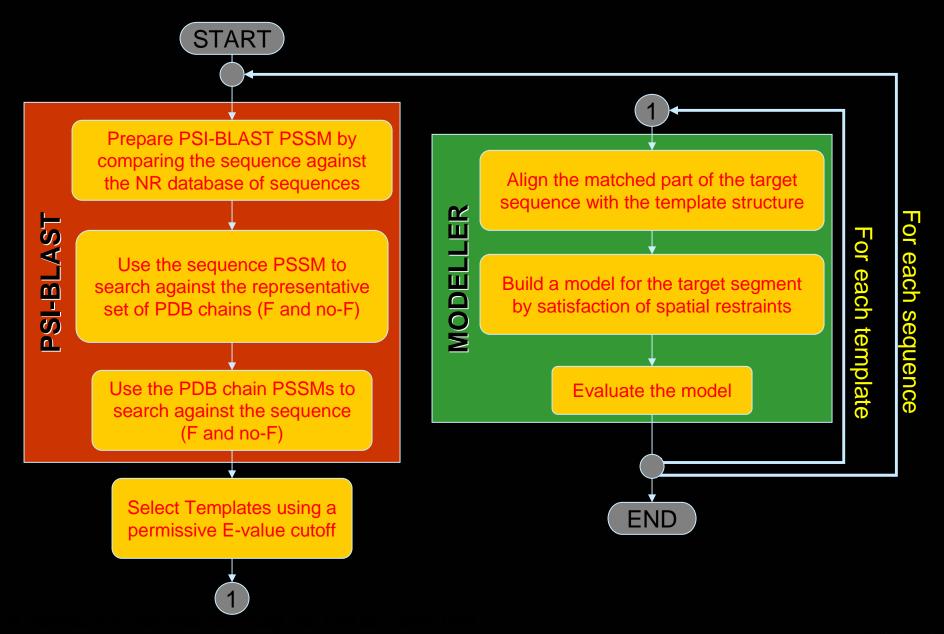
How many structures need to be solved? Which structures should we solve first?

## Target Amplification

How much of the sequence space is covered by: a new structure all structures

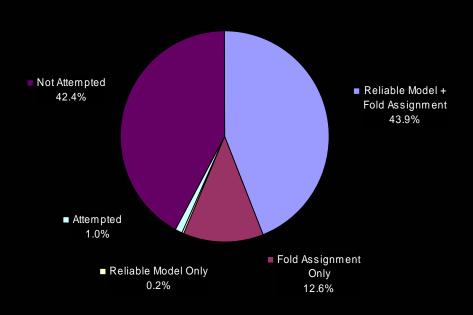


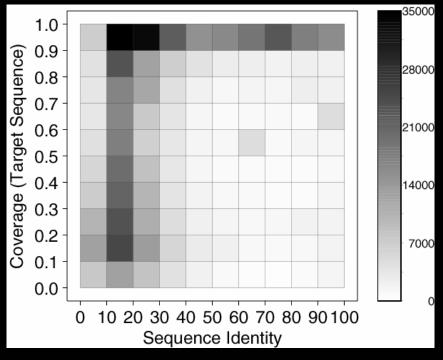
#### **MODPIPE:** Large-Scale Comparative Protein Structure Modeling





## **Modeling Coverage Of The Sequence Space**



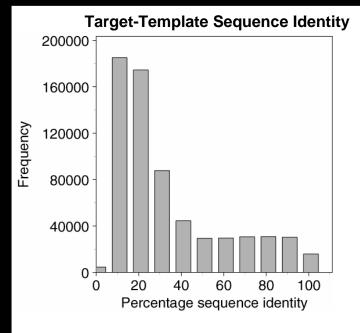


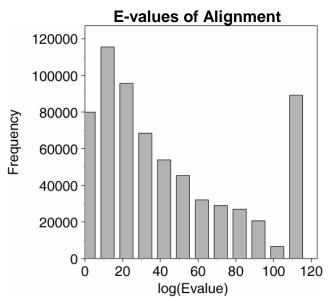
Fold assignment: Reliable Model:

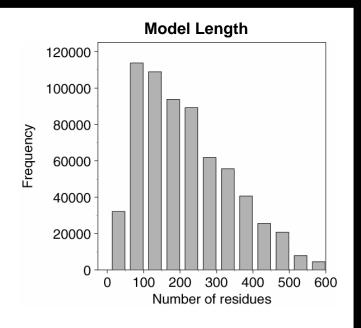
PSI-BLAST E-value ≤ 1e<sup>-4</sup> Model Score ≥ 0.7

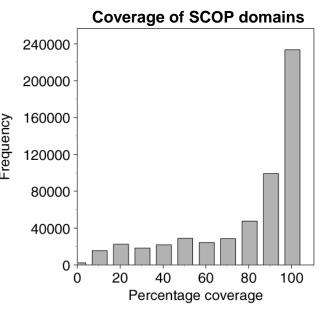


## **Comparative Models for TrEMBL Sequences**

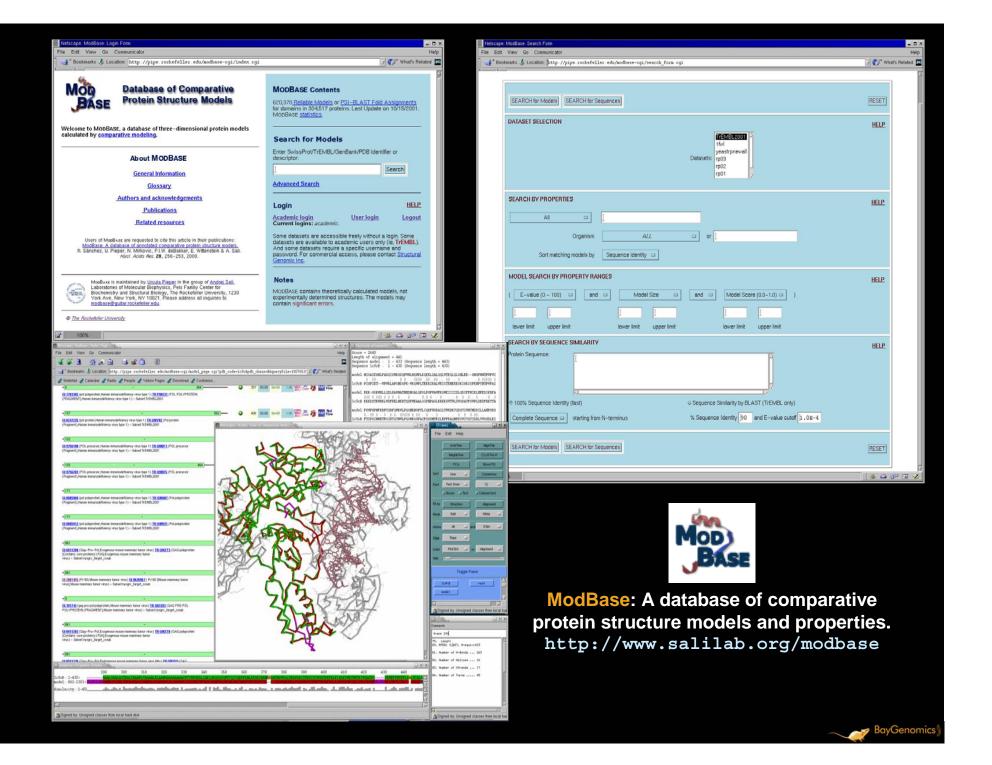








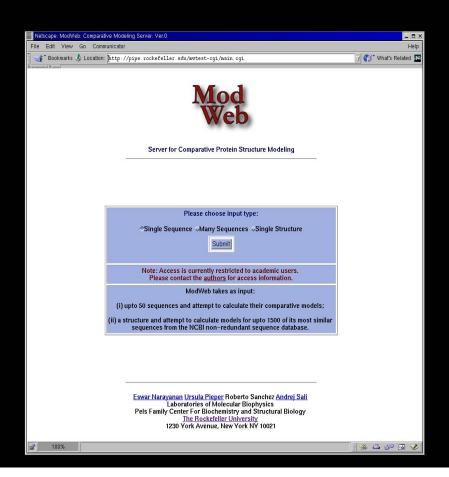


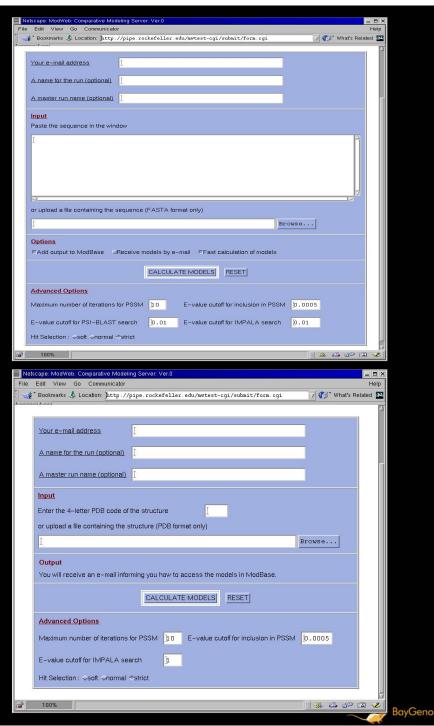




# A Server for Comparative Protein Structure Modeling

http://www.salilab.org/modweb





## Conclusions

- ✓ Comparative models help to understand protein's function:
  - ✓ Detecting remote structural (functional?) relationships.
  - ✓ Revealing features that are not present in the templates.
  - ✓ Revealing features that are not recognizable from the sequence.
- ✓ Currently, useful 3D models can be obtained for domains in approximately 50% of the proteins (30% of domains), because of the improved methods and because of the many known protein structures and sequences.
- ✓ We will be able to calculate useful models for most globular domains soon after the completion of the genome projects, because of structural genomics.

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