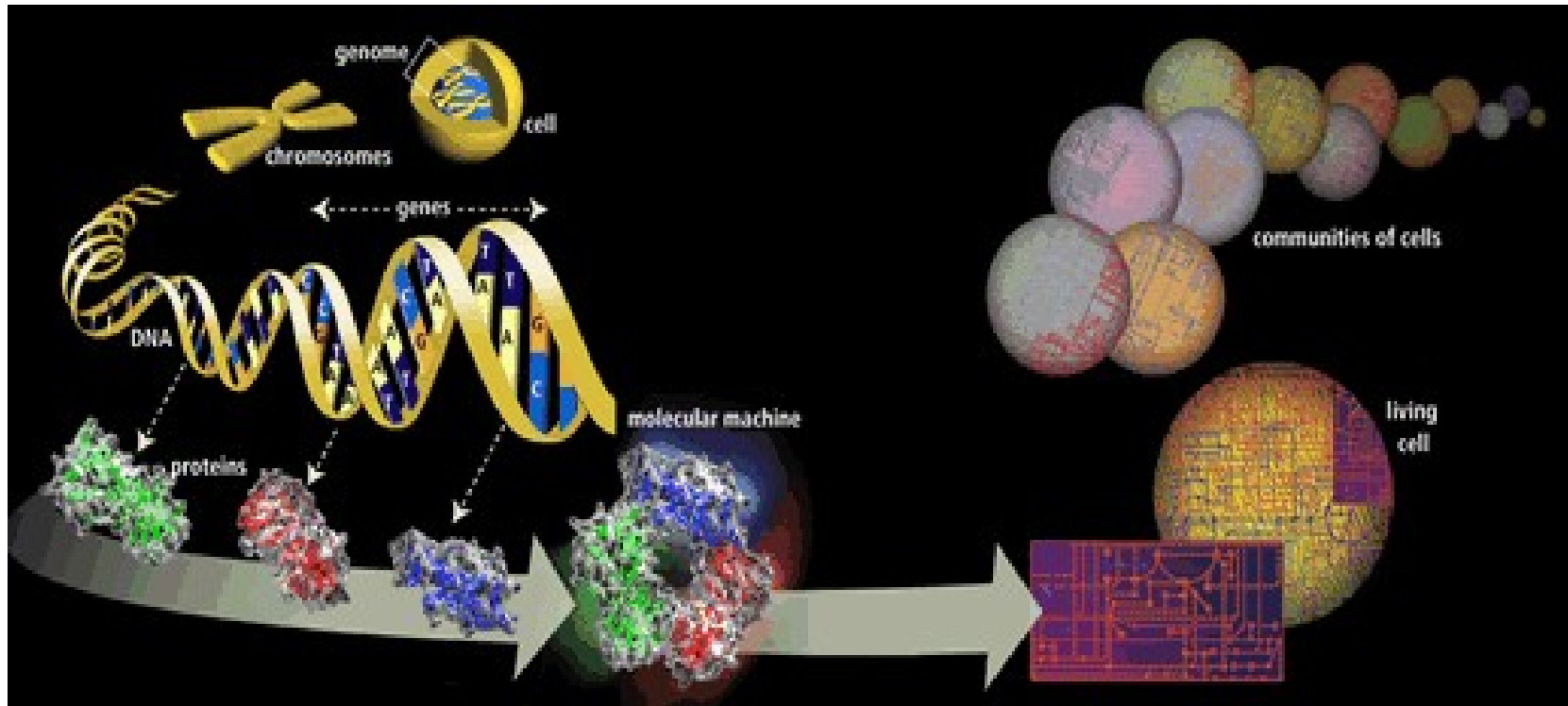


# Comparative Modeling



---

# Comparative Modeling: Learning Goals

- Main Steps in Comparative Modeling for Structure Prediction
    - Sequence alignment and template(s) selection
    - Model building from template(s)
    - Dealing with loops and side chains to complete the structure
    - Final refinement of the completed structure
  - Hands-on modeling with SwissModel/DeepView
  - Other applications of comparative modeling
    - Domain prediction
    - Binding sites and interaction interface prediction
    - Structural motif prediction
-

# What is Comparative Modeling?

- Comparative modeling is modeling of the unknown based on comparison to what is known
- In the context of modeling or computing the structure  $s_x$  assumed by a sequence  $x$  of amino acids:
  - Structure is a function of sequence: So,  $s_x = f(x)$
  - The function  $f$  encodes how the sequence  $x$  determines the structure  $s_x$
  - Given another protein of sequence  $y$  and known structure  $s_y$ , we can infer: **IF**  $x \cong y$  **THEN**  $s_x \cong s_y$ 
    - It is important that  $x$  and  $y$  be *similar enough*
    - An important question: how similar?

---

## Comparative Modeling: Some Terminology

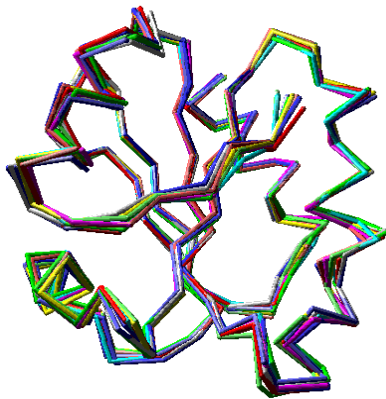
- The protein of unknown structure is the *query* or the *target*
  - The protein of known structure whose sequence is similar to that of the target is the *template*
  - The process of inferring the coordinates for the target is called *model building*
  - Comparative modeling builds the model, completes it, refines it, and then evaluates it
-

## Why Use Comparative Modeling?

- Structures of proteins in a given functional family are more conserved than their sequences
  - About a third of all sequences assume known structures
  - The number of unique protein folds is limited
    - If not applicable to yield a high-resolution structure, comparative modeling can at least yield the fold for a sequence
  - Currently, comparative modeling is both faster and more accurate (as long as the sequence identity is high) than ab initio or de novo methods for structure prediction
-

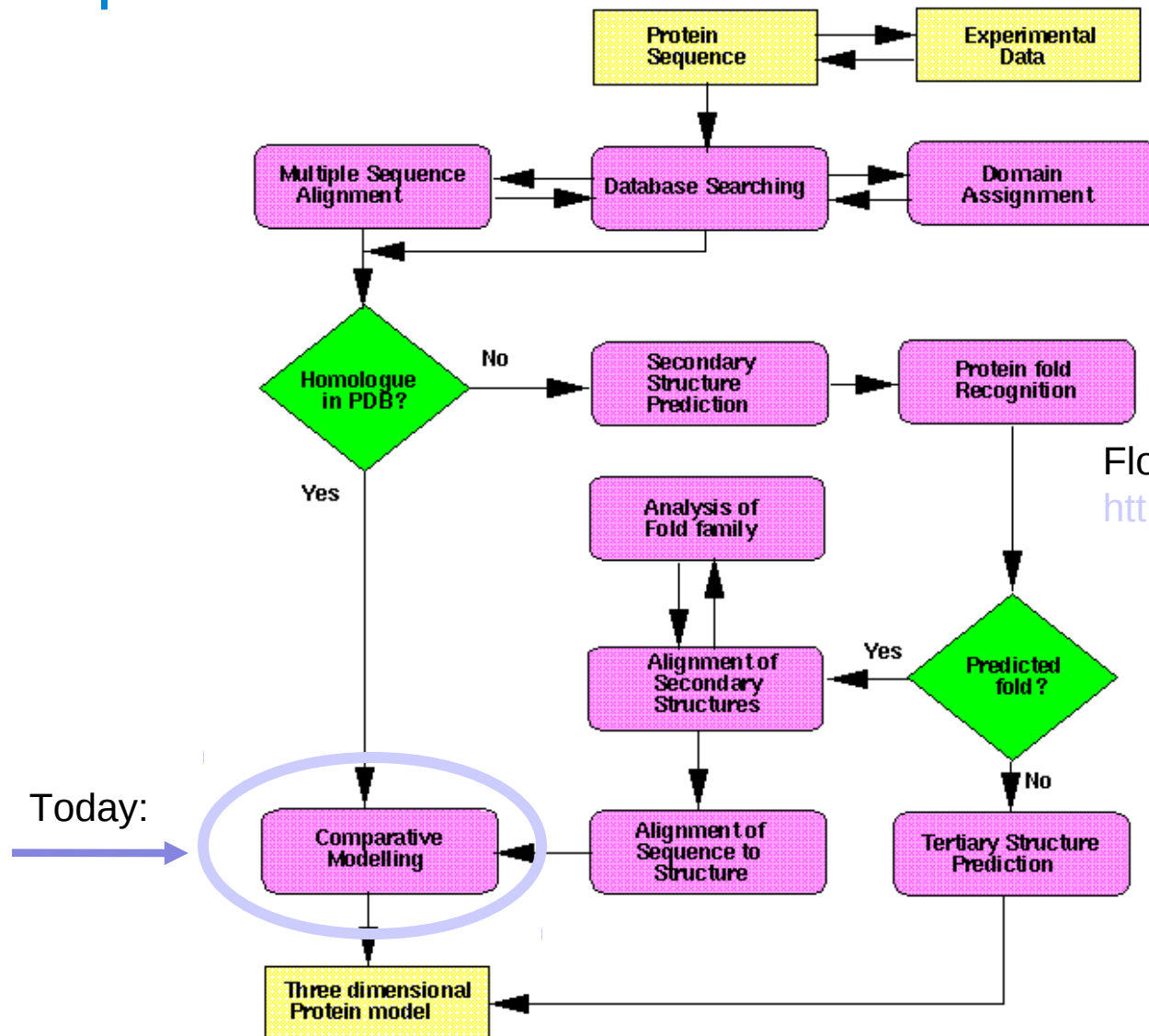
## When to Use Comparative Modeling?

- How similar do  $x$  and  $y$  have to be to infer that the structure assumed by the sequence  $x$  is similar to that assumed by the sequence  $y$ ?
- Statistical analysis of sequences with known structure reveals:
  - Sequences with no less than 50% sequence identity assume structures no more than 1 Å different in IRMSD
  - Minimum sequence identity for structural similarity: 25-30%



Higher than 30% sequence identity often results in very similar structures

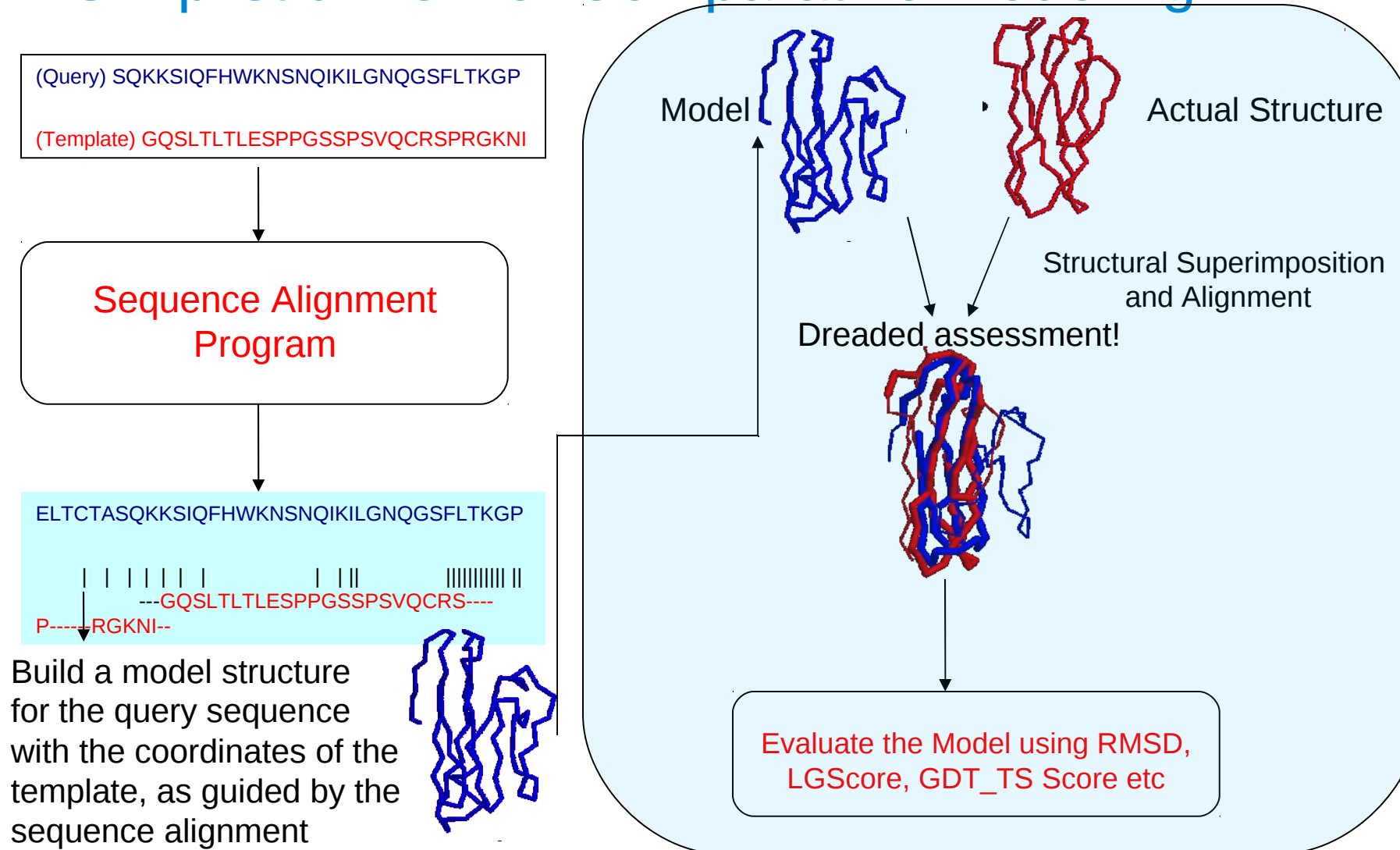
# Comparative Modeling in Structure Prediction



Flowchart by Rob Russell

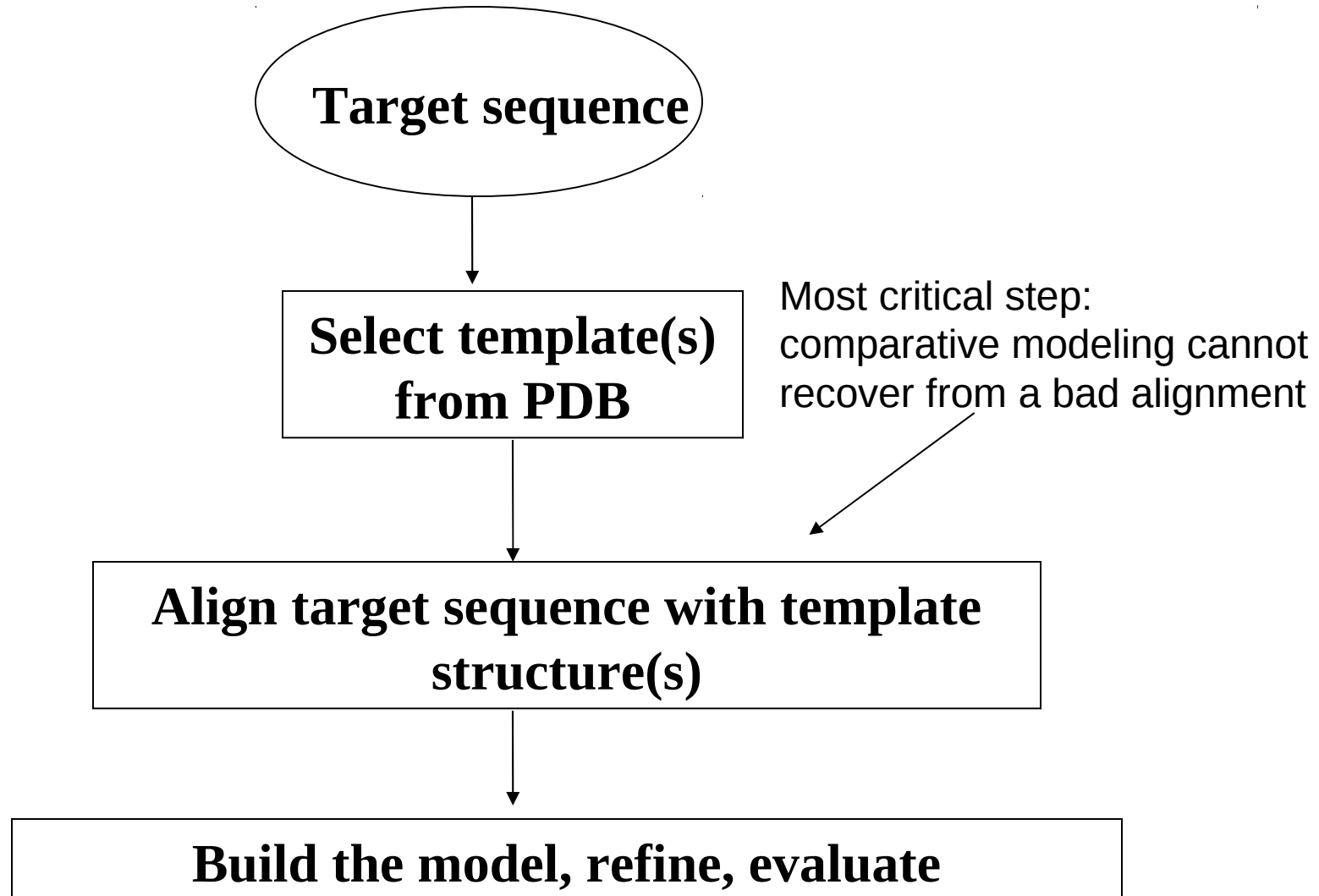
<http://speedy.embl-heidelberg.de>

# A Simplistic View of Comparative Modeling





# A Simplistic View of Comparative Modeling



# A More Detailed View of Comparative Modeling

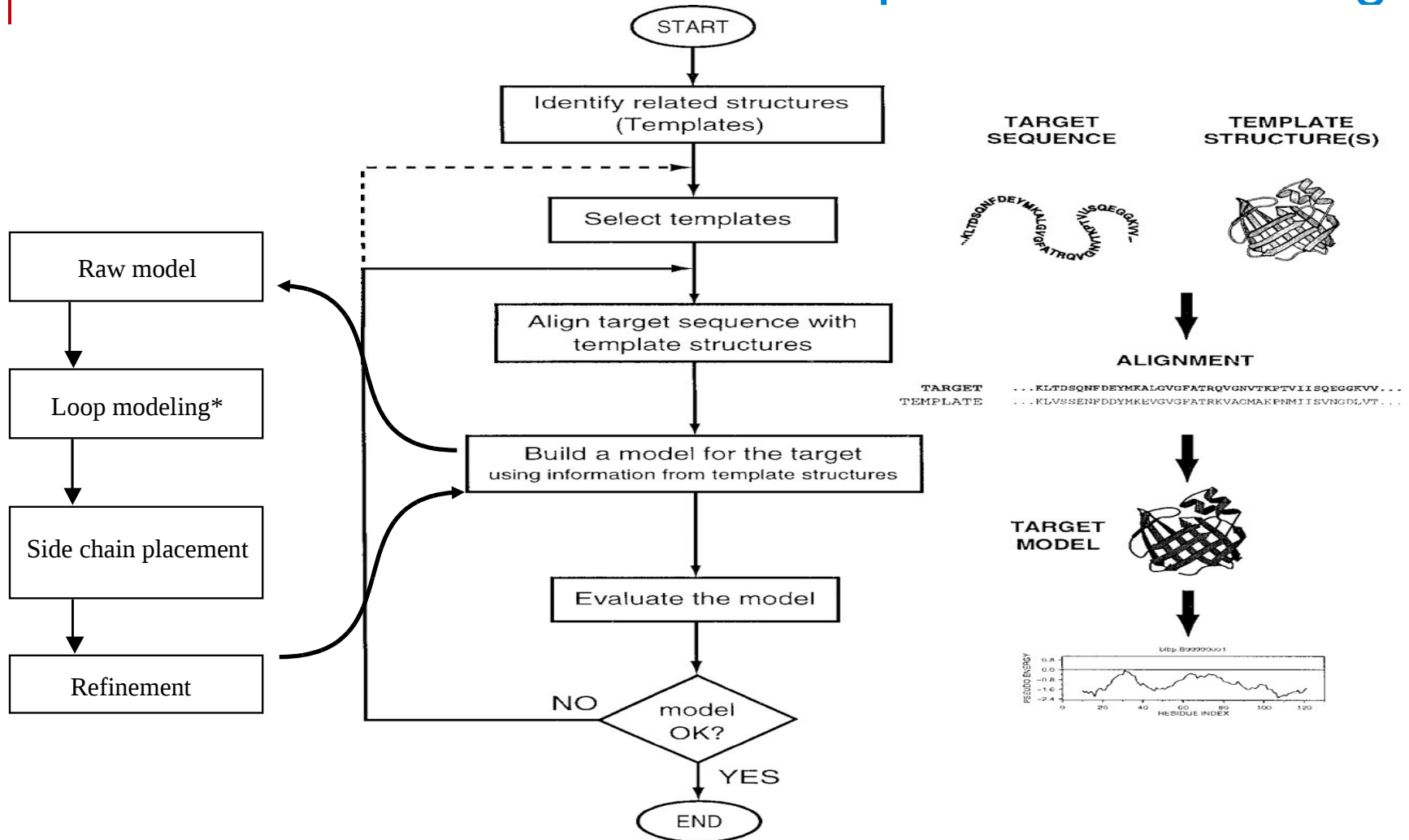


Figure 5.1.1 from M. A. Marti-Renom and A. Sali "Modeling Protein Structure from Its Sequence" *Current Protocols in Bioinformatics* (2003). 5.1.1-5.1.32

---

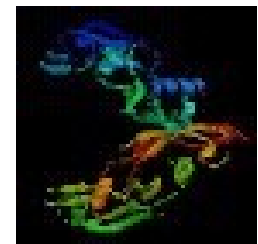
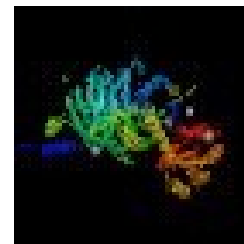
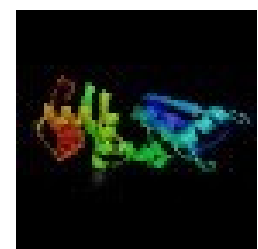
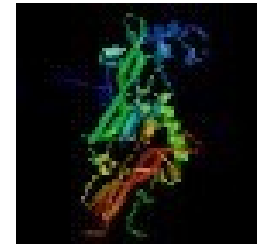
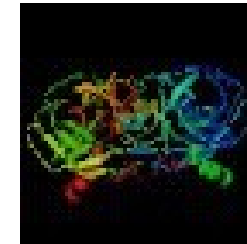
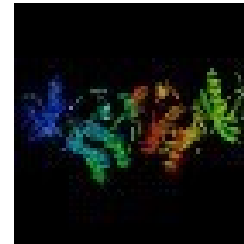
# An Algorithmic View of Comparative Modeling

- **Step 1:** Query a database of protein sequences with known structures with the target sequence, focusing on those with  $\geq 30\%$  seq. identity to the target sequence
  - **Step 2:** Align obtained sequences to target to choose templates
  - **Step 3:** Identify structurally conserved (SC) and variable (SV) regions
  - **Step 4:** Generate coordinates for the core region of the target
  - **Step 5:** Complete the structure of the target
    - a) generate coordinates for loop regions
    - b) generate coordinates for side-chains
  - **Step 6:** Refine the completed structure using energy minimization
  - **Step 7:** Validate/evaluate completed structure
-

# Comparative Modeling: Step 1 – Query PDB

PRTEINSEQENCEPRTEINSEQUENC  
EPRTEINSEQNCEQWERYTRASDFHG  
TREWQIYPASDFGHKLMCNASQERWW  
PRETWQLKHGFDSADAMNCVCNQWER  
GFDHSDASFWERQWK

Query Sequence



PDB

# Comparative Modeling: Step 1 – Query PDB

**PRTEINSEQENCEPRTEINSEQUENC**  
**EPRTINSEQNCEQWERYTRASDFHG**  
**TREWQIYPASDFGHKLMCNASQERWW**  
**PRETWQLKHGFDSDAMNCVCNQWER**  
**GFDHSDASFWERQWK**

**Query Sequence**

PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 TREWQIYPASDFGHKLMCNASQERW  
 W  
 PRETWQLKHGFDSDAMNCVCNQWE  
 R  
 GFDHSDASFWERQWK  
 PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 EWQRYEYEWQWNCQWERYTRASDF  
 HG  
 TREWQIYPASDWERWEREWRFDSEFG

**Hit #1**

PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 TREWQIYPASDFGHKLMCNASQERW  
 W

R  
 GFDHSDASFWERQWK  
 PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 EWQRYEYEWQWNCQWERYTRASDF  
 HG  
 TR

PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G

**Hit #2**

PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 TREWQIYPASDFGPRTEINSEQENC  
 EPRTINSEQUENCEPRTEINSEQN  
 CEQWERYTRASDFHGTREWQIYPAS  
 DFG

TREWQIYPASDFGPRTEINSEQENC  
 EPRTINSEQUENCEPRTEINSEQN  
 CEQWERYTRASDFHGTREWQ  
 PRTEINSEQUENCEPRTEINSEQUEN  
 C

EPRTINSEQNCEQWERYTRASDFH  
 G  
 TREWQIYPASDFG

PRTEINSEQENCEPRTEINSEQUEN  
 C  
 EPRTINSEQNCEQWERYTRASDFH  
 G  
 TREWQIYPASDFGPRTEINSEQENC

**PDB**

# Comparative Modeling: Step 2 – Alignment

	G	E	N	E	T	I	C	S
G	10	0	0	0	0	0	0	0
E	0	10	0	10	0	0	0	0
N	0	0	10	0	0	0	0	0
E	0	0	0	10	0	0	0	0
S	0	0	0	0	0	0	0	10
I	0	0	0	0	0	10	0	0
S	0	0	0	0	0	0	0	10

	G	E	N	E	T	I	C	S
G	60	40	30	20	20	0	10	0
E	40	50	30	30	20	0	10	0
N	30	30	40	20	20	0	10	0
E	20	20	20	30	20	10	10	0
S	20	20	20	20	20	0	10	10
I	10	10	10	10	10	20	10	0
S	0	0	0	0	0	0	0	10

## Dynamic Programming

## Comparative Modeling: Step 2 – Alignment

### **Goal: Find a template or templates**

pairwise sequence alignment - finds high homology sequences  
BLAST

<http://www.ncbi.nlm.nih.gov/BLAST/>



Improved Multiple sequence alignment methods  
improves sensitivity - remote homologs  
PSIBLAST, CLUSTAL

---

## Comparative Modeling: Step 2 – Alignment

- Pairwise sequence alignment: BLAST, FASTA, WU-BLAST, SSEARCH, and more
  - Available as web servers and standalone software
  - Basic functionality needed: compare target sequence with sequences in the PDB (or any other comprehensive structural database)
  - BLAST scans the sequence for 3-letter words (wmers, where  $w = 3$ ) and expands alignments from 3-mers
  - Statistically significant alignments are hits
  - Templates are hits with no lower than 30% sequence identity
-



# Comparative Modeling: Step 2 – Alignment

Query **A**C**D**E**F**G**H**I**K**L**M**N**P**Q**R**S**T** - - **F**G**H**Q**W**E**R**T - - - - - **T**Y**R**E**W**Y**E**G  
Hit #1 **A**S**D**E**Y**A**H**L**R**I**L**D**P**Q**R**S**T**V**A**Y**A**Y**E** - - **K**S**F**A**P**P**G**S**F**K**W**E**Y**E**A**  
Hit #2 **M**C**D**E**Y**A**H**I**R**L**M**N**P**E**R**S**T**V**A**G**G**H**Q**W**E**R**T** - - - - - **G**S**F**K**E**W**Y**A**A**



Hit #1



Hit #2

---

## Comparative Modeling: Step 2 – Alignment

- Global (Needleman-Wunsch) alignment can be used
  - Alignment is the most crucial step, as comparative modeling can never recover from a bad alignment
  - A small error in the alignment can translate to a significant error in the reconstructed model
  - Multiple sequence alignments (that also align the templates to one another) is often better than pairwise alignment
-

---

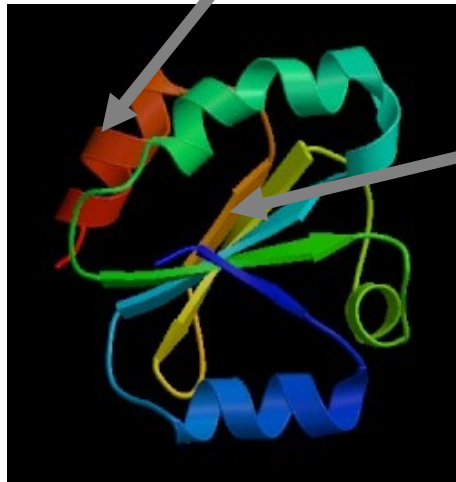
## Comparative Modeling: Step 2 – Get Templates

- A good template is closest to the target in terms of subfamilies
  - This means that high overall sequence similarity is needed
  - The template environment like pH, ligands, etc., should be the same as that of the target
  - The quality of the experimentally-available template structure - the resolution, R-factor, etc. - should be high
  - When choosing a template for a protein-ligand model, it is preferred that the template have the same ligand
  - When modeling an active site – a high resolution template structure with ligand is important
-

# Comparative Modeling: Step 3 – SCRs

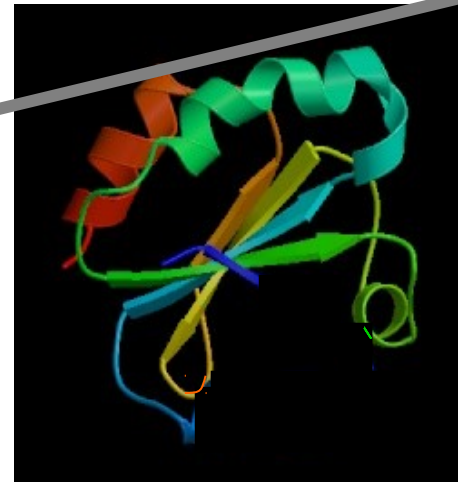
Query	ACDEFGHIKLMNPQRST--FGHQWERT-----TYREWYEG
Hit #1	ASDEYAHLRILDPRQRTVAYAYE--KSFAPPGSFKWEYEA
Hit #2	MCDEYAHIRLMNPERSTVAGGHQWERT-----GSFKEWYAA
	HHHHHHHHHHHHHHHHCCCCCCCCCCCCCCCCCCCCBBBBBBBBBB

**SCR #1**



**Hit #1**

**SCR #2**



**Hit #2**

---

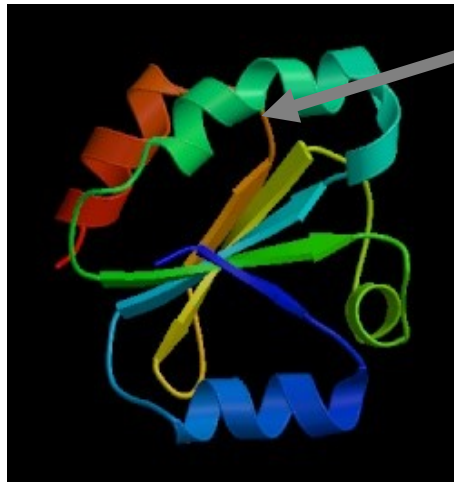
## Comparative Modeling: Step 3 – SCRs

- SCRs correspond to the most stable structures or regions (usually in the interior/core) of the protein
  - SCRs also often correspond to sequence regions with the lowest level of gapping and highest level of sequence conservation
  - SCRs are often the secondary structures
-

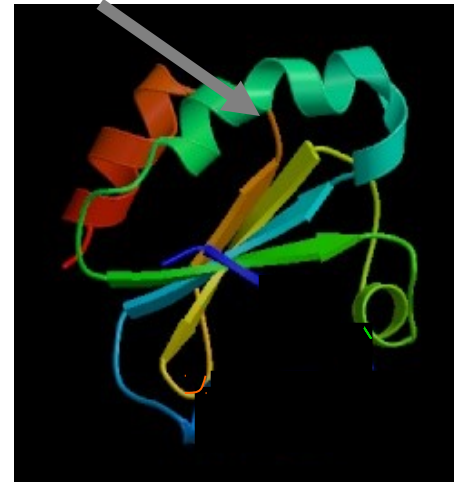
# Comparative Modeling: Step 3 – SVRs

Query	ACDEFGHIKLMNPQRST--FGHQWERT---TYREWYEG
Hit #1	ASDEYAHRLILDPRQSTVAYAYE--KSFAPKGSFKWEYEA
Hit #2	MCDEYAHIRLMNPERSTVAGGHQWERT---GSFKEWYAA
	HHHHHHHHHHHHHHCCCCCCCCCCCCCCCCCCCCBBBBBBBBBB

*SVR (loop)*



Hit #1



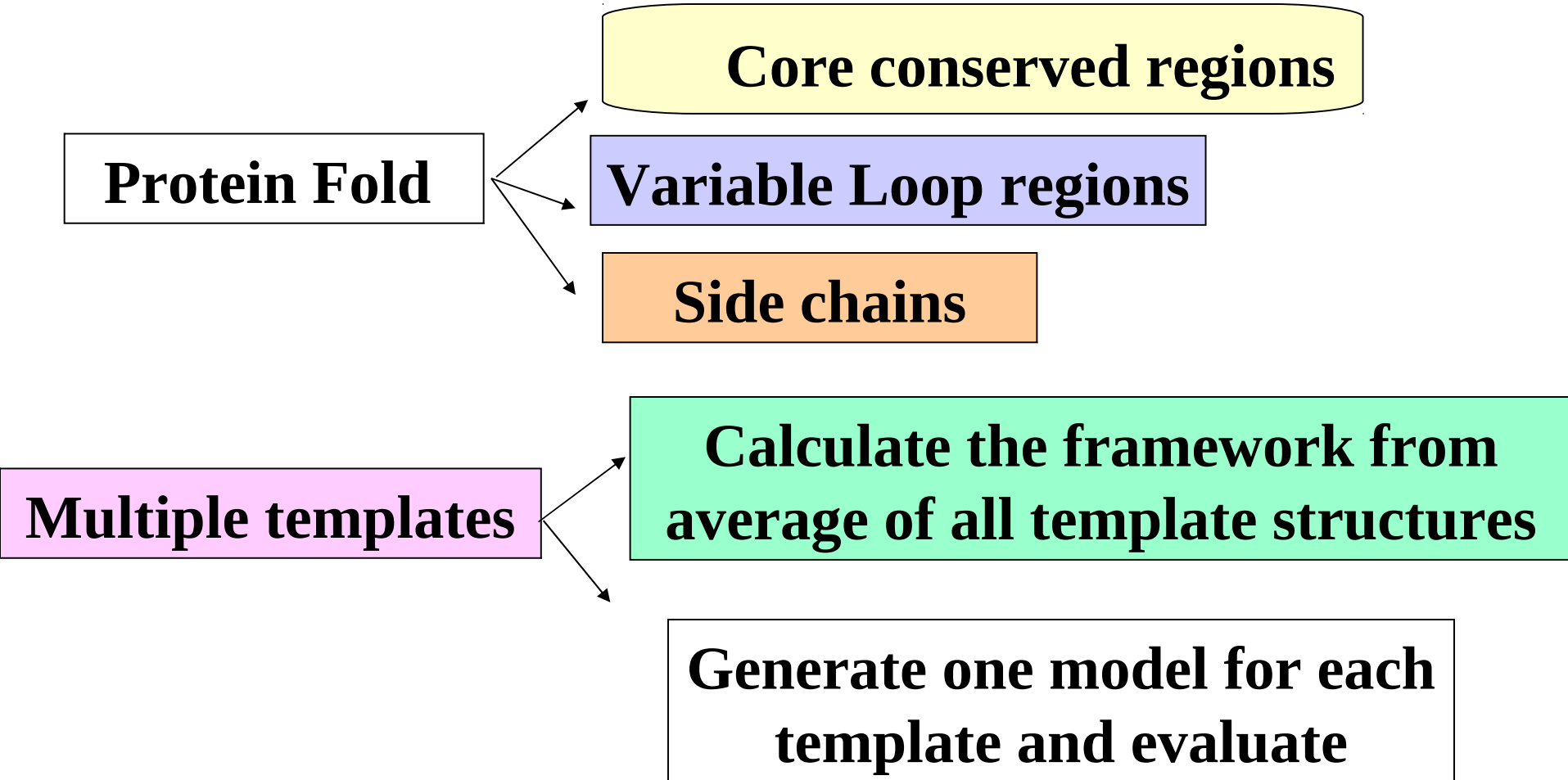
Hit #2

---

## Comparative Modeling: Step 3 – SVRs

- SVRs correspond to the least stable or the most flexible regions (usually in the exterior/surface) of the protein
  - SVRs correspond to sequence regions with the highest level of gapping and lowest level of sequence conservation
  - SVRs are usually loops and turns
-

## Comparative Modeling: Step 4 – Threading

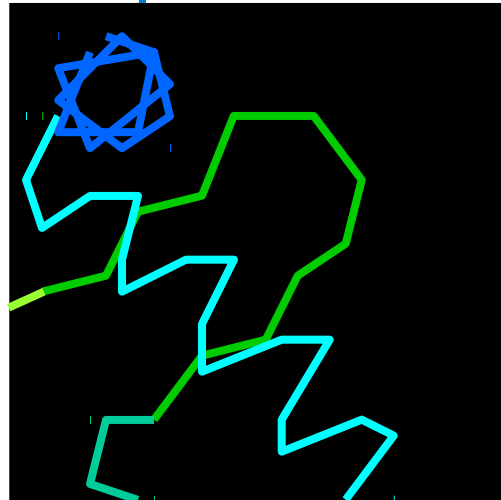




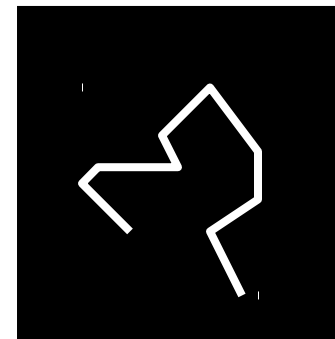
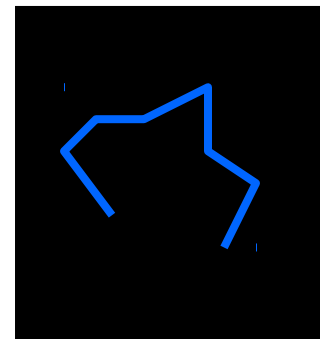
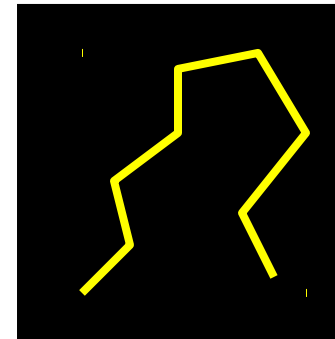
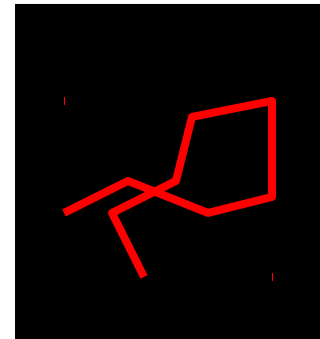
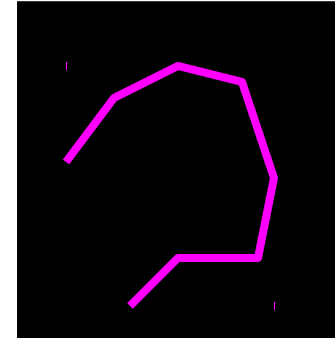
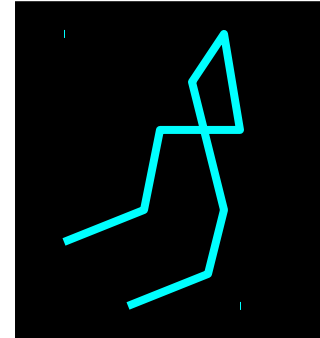
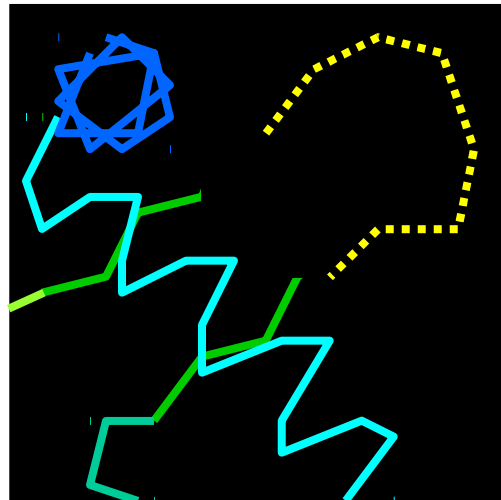
## Comparative Modeling: Step 4 – Core Coords

- For *identical* amino acids, just transfer all atom coordinates (x, y, z) to the query protein (both backbone and side-chain atoms are identical)
- For *similar* amino acids, transfer the backbone coordinates and replace side-chain atoms while respecting  $\chi$  angles
- For *different* amino acids, one can only transfer the backbone coordinates (x, y, z) to query sequence
- The side chains of different amino acids have to be built at a later stage, when completing the model

# Comparative Modeling: Step 5 – SVRs



Query FGHQWERT  
Hit #1 YAYE - - KS



## Comparative Modeling: Step 5 – Loop Modeling

Loops result from substitutions and indels in same family

Mini protein folding problem-  
loops can be very long in  
membrane proteins

*Ab-initio* methods  
- generate various  
*random* loop  
conformations and  
evaluate/score

Compare the loop  
sequence string to  
PDB, get hits, and  
evaluate/score

Some comparative  
modeling methods  
have fewer loops to  
be added because of  
extensive multiple  
sequence alignment  
of profiles

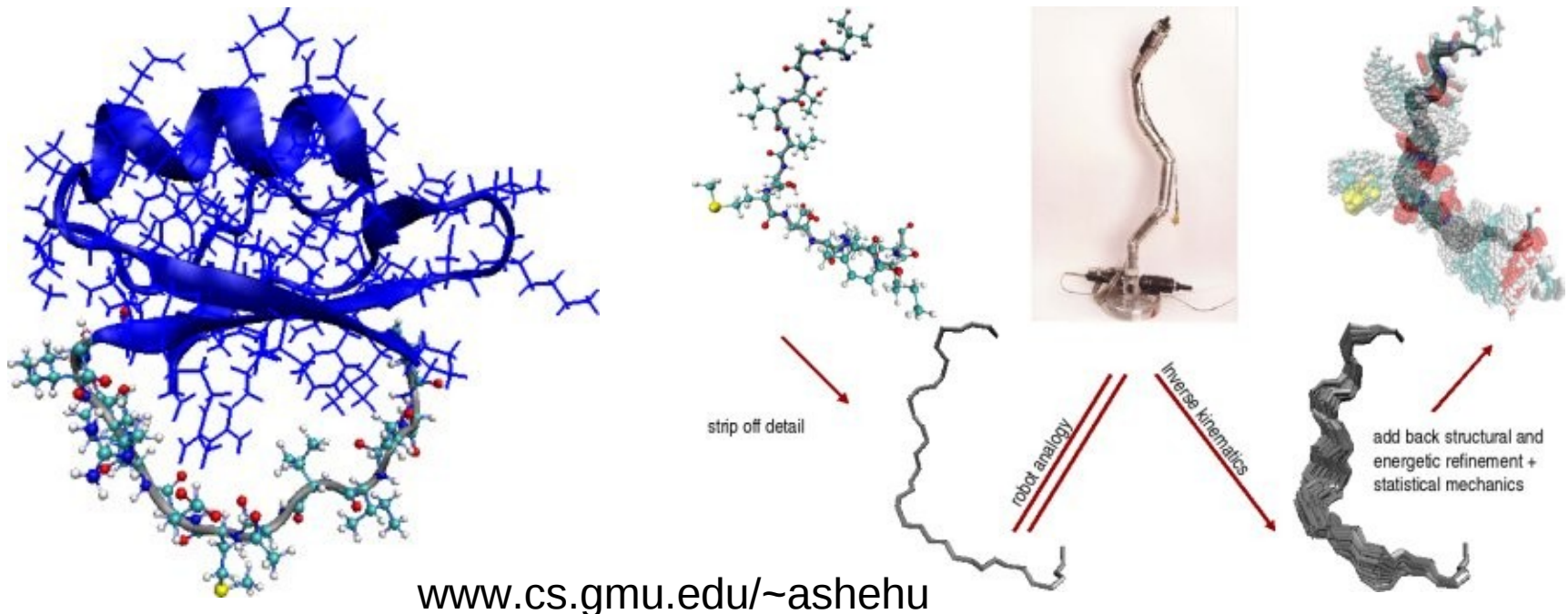
---

## Comparative Modeling: Step 5 – Loop Modeling

- *Ab-initio* loop modeling - Monte Carlo, Monte Carlo with simulated annealing, MD, main chain dihedral angle search biased with the data from PDB, inverse kinematics-based, etc.
  - Energy functions used: physics-based (CHARMM, AMBER, etc.) or knowledge-based (built with statistics obtained from PDB)
  - *Ab-initio* methods - allow simultaneous addition of several loops, which yields a conformational ensemble view for the loop
-

# Comparative Modeling: Step 5 – Loop Modeling

- **Step 5:** Loop modeling to complete the model
  - Ab-initio loop modeling is an active research area
  - One can start at a robotics-inspired approach (Shehu et al. Proteins 2006)



---

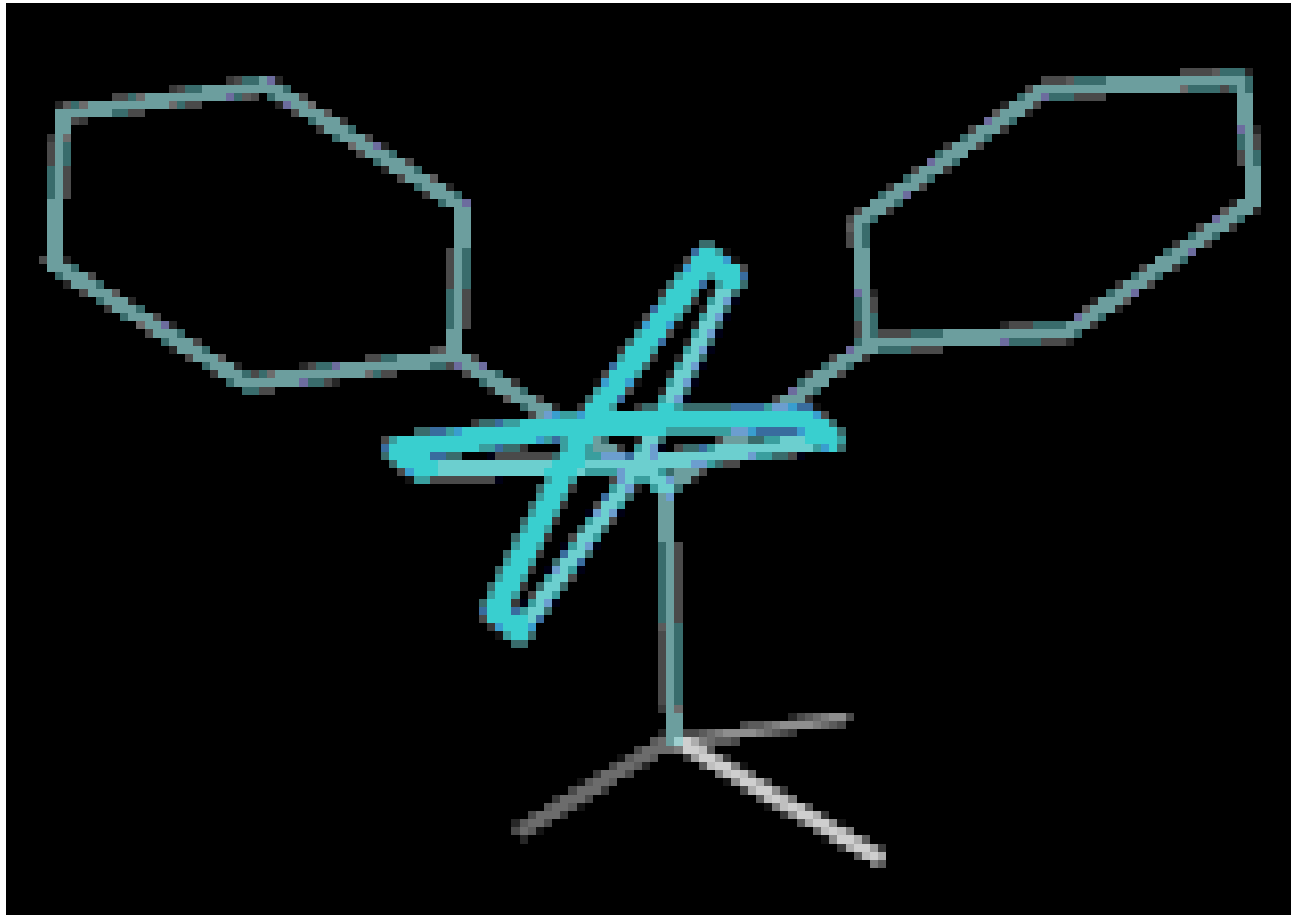
## Comparative Modeling: Step 5 – Loop Modeling

- Loops can be modeled with comparative modeling as well
  - Comparison of loop sequence to PDB - pick sequence hits
  - Sort hits through geometric restraints (often, termini constraints) or a more detailed energy function
  - Works well for special loops like  $\beta$ -hairpins
  - Normally only the main chain is modeled
  - Limited by the lengths of the loops it can complete
-

## Comparative Modeling: Step 5 – Loop Modeling

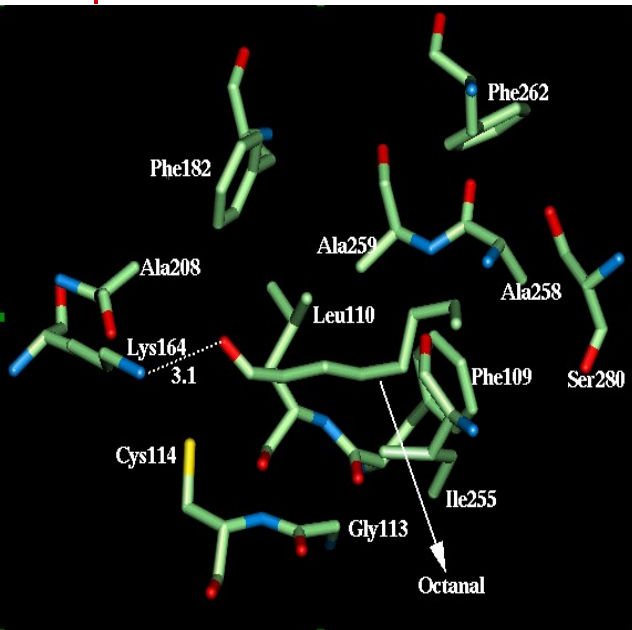
- Must match the desired number of residues in the loop
- Must match the Ca-Ca distance ( $<0.5 \text{ \AA}$ )
- Must not collide into other parts of protein (no Ca-Ca distance  $<3.0 \text{ \AA}$ )
- Preceding and following Ca's (3 residues) from loop should match well with corresponding Ca coordinates in template structure
- Loop placement and positioning is done using superposition algorithms: loop fits are evaluated using RMSD calculations and standard collision checking.
- If no “good” loop is found, resort to ab-initio: compute loops using randomly generated backbone dihedral angles (with termini constraints)

## Comparative Modeling: Step 5 – Side chains





# Comparative Modeling: Step 5 – Side chains



Side chain packing is critical to studying ligand binding to proteins

## Side Chain Builder

Predicted from similar structures

Built from steric and energetic considerations with robust conformational search algorithms

Combination of rotamer library and energy evaluations

## Comparative Modeling: Step 5 – Side chains

- Rotamer libraries have been created (statistical analysis of torsion angles of side chains of amino acids) from structures in the PDB
  - Two main effects in predicting side chains
    - how it sits on top of the main chain(very critical)
    - continuous variation of side chain torsions - only 6% varies +/- 40° from the rotamer libraries
  - Current techniques predict side chains up to 1.5 Å accuracy for a fixed backbone for the core residues
  - Solvation and H-bond terms are very important in modeling exposed side chains
-

## Comparative Modeling: Step 5 – Side chains

- Methods available - SCWRL, SCAP, MODELLER, Insight II, WhatIf, SCREAM, and recent ones like Heath et al. Proteins 2007
- Evaluation of all three methods for backbone  $< 4 \text{ \AA}$  IRMSD to native all work equally - 50% of  $\chi_1$  and 35% of  $\chi_2$  and  $\chi_3$
- SCREAM – works well – accurate energy analysis – computationally intensive
- Heath et al. 2007 reconstructs thousands of all-atom conformations from backbone conformations

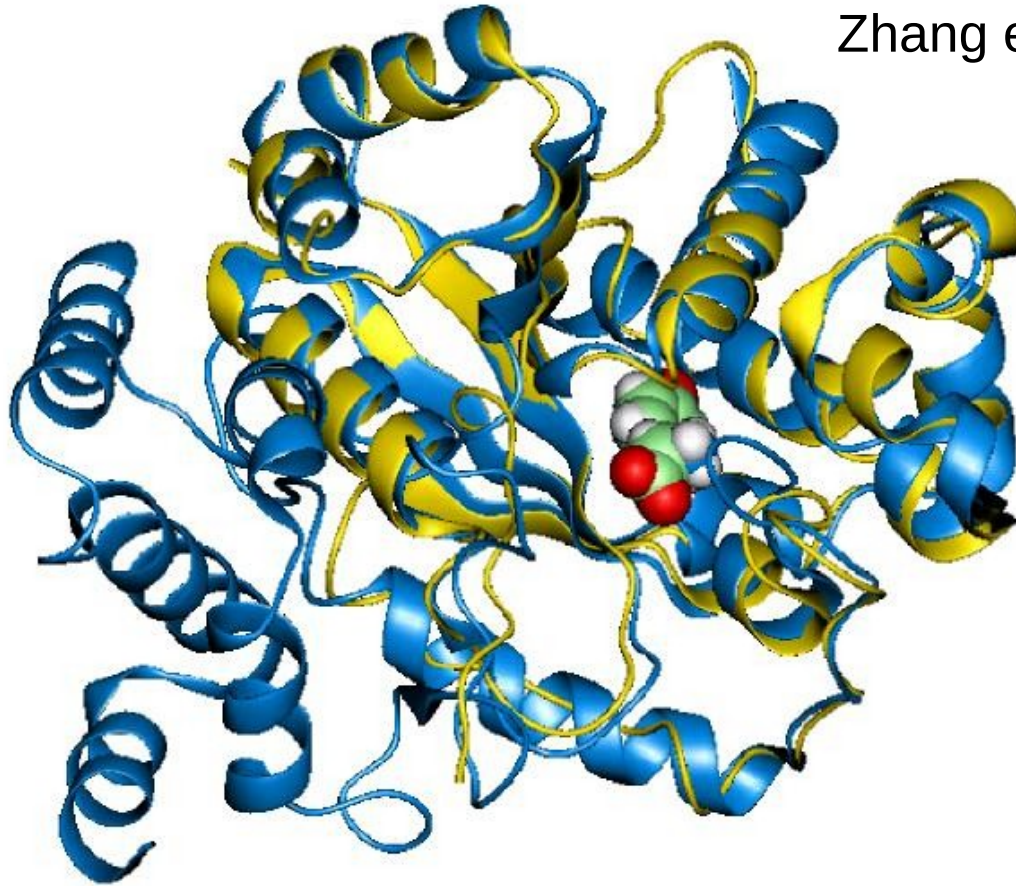
---

## Comparative Modeling: Step 6 – Refinement

- Completed model may undergo a short energy minimization
  - Physics-based or knowledge-based functions may be used
  - The minimization may help remove steric clashes and improve favorable interactions in the completed model prior to the final evaluation of the built model for the target
-

## Comparative Modeling: Showcase

Predicted Structure of *M.Jann* TyrRS  
Zhang et al PNAS



Yellow - *M.*  
*Jann.* Predicted

Blue - *Bac.*  
*Thermophilus*  
4ts1

---

## Comparative Modeling: Step 7 – Evaluation

- Given a predicted structure
    - Ramachandran plot - allowed regions for backbone torsions
    - Calculate the H-bond network - use Quanta or WhatIf or InsightII - normally calculated for heteroatoms with distance cutoff
    - Identify hydrophobic residues on the surface
    - Identify hydrophilic residues in the core - satisfied with salt bridges?
    - Voids in the core are typically small two water cluster?
-

---

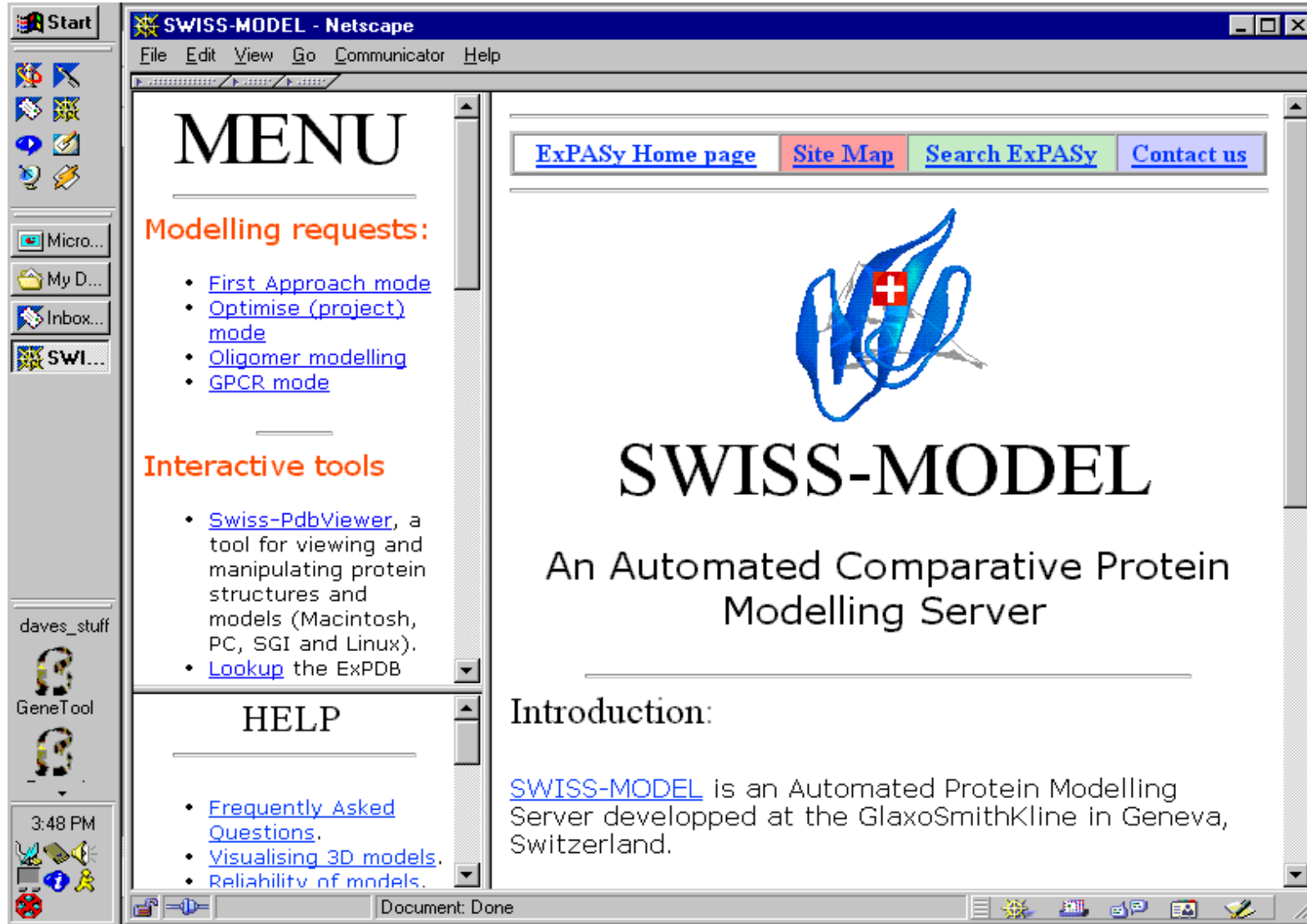
## Comparative Modeling on the WWW

- Prior to 1998, comparative modeling could only be done with commercial software or command-line freeware
  - The process was time-consuming and labor-intensive
  - The past few years has seen an explosion in automated web-based comparative modeling servers
  - Now anyone can!
-

# Comparative Modeling Hands-on

---





The image shows a screenshot of a Netscape browser window displaying the SWISS-MODEL website. The browser title bar reads "SWISS-MODEL - Netscape". The website content is organized into several sections:

- MENU**: A large heading at the top left.
- Modelling requests:** A section with a list of links: [First Approach mode](#), [Optimise \(project\) mode](#), [Oligomer modelling](#), and [GPCR mode](#).
- Interactive tools**: A section with a list of links: [Swiss-PdbViewer](#), a tool for viewing and manipulating protein structures and models (Macintosh, PC, SGI and Linux), and [Lookup](#) the EXPDB.
- HELP**: A section with a list of links: [Frequently Asked Questions](#), [Visualising 3D models](#), and [Reliability of models](#).
- Navigation links**: A horizontal bar at the top right with links: [ExPASy Home page](#), [Site Map](#), [Search ExPASy](#), and [Contact us](#).
- Logo**: A blue ribbon protein structure with a red Swiss cross in the center.
- SWISS-MODEL**: The main title in large, bold, black letters.
- An Automated Comparative Protein Modelling Server**: The subtitle below the main title.
- Introduction:** A section with a paragraph: [SWISS-MODEL](#) is an Automated Protein Modelling Server developed at the GlaxoSmithKline in Geneva, Switzerland.

The browser's status bar at the bottom shows "Document: Done". The system tray on the left includes icons for "Start", "Micro...", "My D...", "Inbox...", "SWI...", "daves\_stuff", "GeneTool", and a clock showing "3:48 PM".

<http://www.expasy.ch/swissmod/SWISS-MODEL.html>

# Comparative Modeling with SwissModel

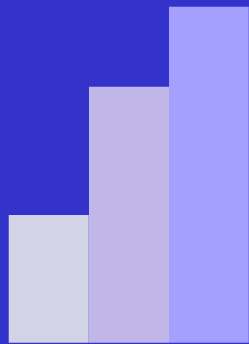
- **Swiss-Model - an automated homology modeling server developed at Glaxo Wellcome Experimental Research in Geneva.**

<http://www.expasy.ch/swissmod/>

- **Closely linked to Swiss-PdbViewer, a tool for viewing and manipulating protein structures and models.**
- **Will likely take 24 hours to get results returned!**



# Comparative Modeling with SwissModel



- 1) Search for suitable templates
- 2) Check sequence identity with target
- 3) Create ProModII jobs
- 4) Generate models with ProModII
- 5) Energy minimization with Gromos96

First approach mode (regular)

First approach mode (with user-defined template)

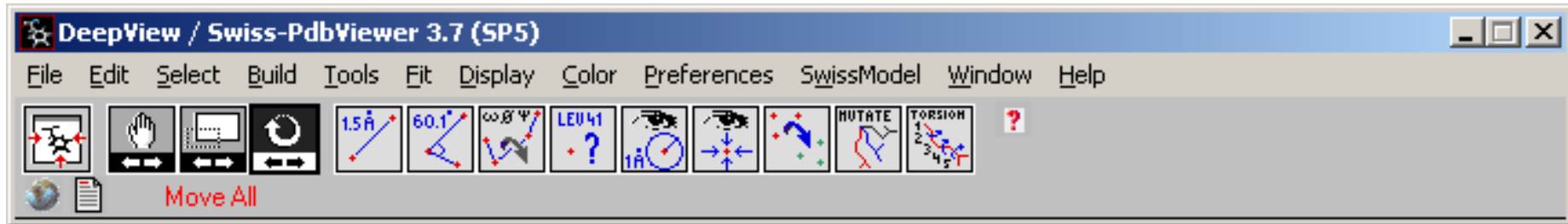
Optimize mode

# Comparative Modeling with SwissModel

<b>Program</b>	<b>Database</b>	<b>Action</b>
<b>BLASTP2</b>	<b>ExNRL-3D</b>	<b>Find homologous sequences of proteins with known structure</b>
<b>SIM</b>	<b>--</b>	<b>Will select all templates with sequence identities above 25%</b>
<b>--</b>	<b>--</b>	<b>Generate ProModII input files</b>
<b>ProModII</b>	<b>ExpDB</b>	<b>Generate all models</b>
<b>Gromos96</b>	<b>--</b>	<b>Energy minimization of all models</b>

# Comparative Modeling with SwissModel

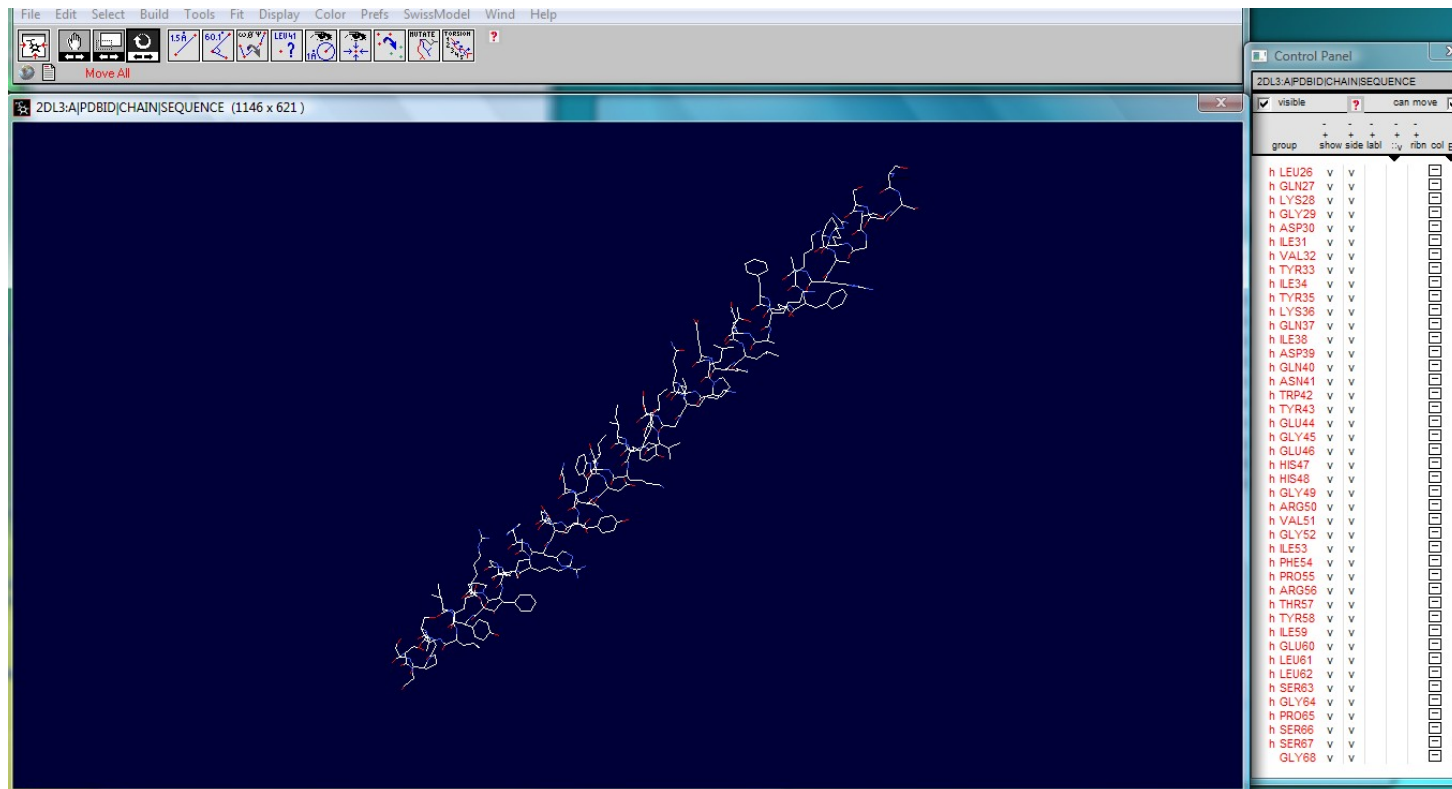
- Illustrate all these steps through a case-study:
  - Modeling the structure of the SH3 sequence
  - The Swiss-Model web server or *DeepView* program can be used
    - Web server: <http://swissmodel.expasy.org/workspace/>
    - Program: <http://spdbv.vital-it.ch/download.html>



- Target sequence: Save the sequence of PDB ID 2DL3 to a FastA file
- Housekeeping: under **Preferences/Swiss-Model** menu enter name and e-mail address. Make sure that **Preferences/Network Server** is [www.swissmodel.unibas.ch](http://www.swissmodel.unibas.ch) Port: 27000

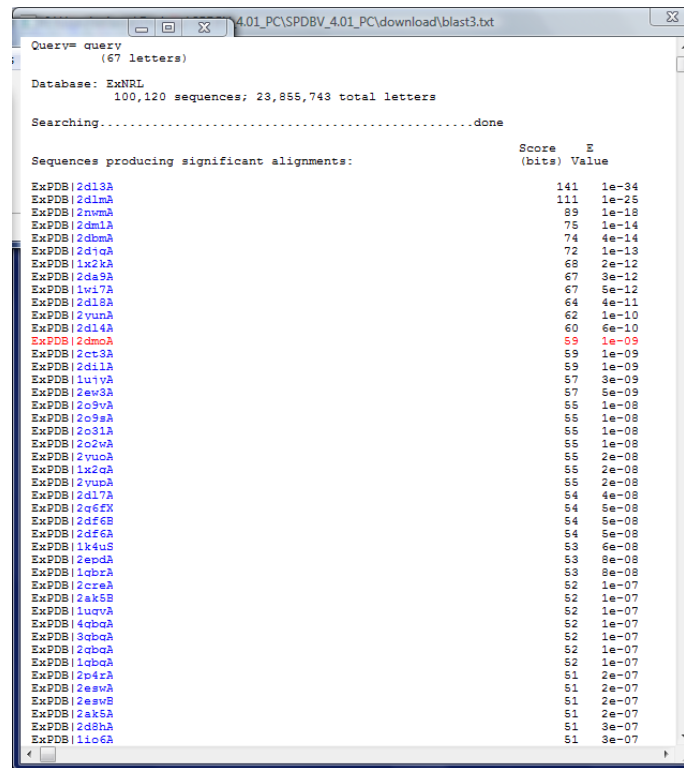
# Comparative Modeling with DeepView

- **SwisModel/Load Raw Sequence** to load the target FastA file
  - A default long alpha helix is associated with target



# Comparative Modeling with DeepView

- **Select/all** residues in your target sequence then use **Edit/Blast Selection vs. ExpDB** to generate a BLAST search
  - Sequences of potential templates are identified and ranked
  - One can load one or more templates to build the target structure



```
4.01_PC\SPDBV_4.01_PC\download\blast3.txt
Query= query
      (67 letters)
Database: ExNRL
      100,120 sequences; 23,855,743 total letters
Searching.....done

Sequences producing significant alignments:

                Score   E
                (bits)  Value
ExPDB|2d13A      141  1e-34
ExPDB|2d1mA      111  1e-25
ExPDB|2nmmA       89  1e-18
ExPDB|2dmlA       75  1e-14
ExPDB|2dbmA       74  4e-14
ExPDB|2d1qA       72  1e-13
ExPDB|1x2kA       68  2e-12
ExPDB|2ds9A       67  3e-12
ExPDB|1wi7A       67  5e-12
ExPDB|2d18A       64  4e-11
ExPDB|2vunA       62  1e-10
ExPDB|2d14A       60  6e-10
ExPDB|2dmcA       59  1e-09
ExPDB|2ct3A       59  1e-09
ExPDB|2d11A       59  1e-09
ExPDB|1u1yA       57  3e-09
ExPDB|2ew3A       57  5e-09
ExPDB|2o9vA       55  1e-08
ExPDB|2o9aA       55  1e-08
ExPDB|2o31A       55  1e-08
ExPDB|2o2wA       55  1e-08
ExPDB|2vu0A       55  2e-08
ExPDB|1k2qA       55  2e-08
ExPDB|2vu9A       55  2e-08
ExPDB|2d17A       54  4e-08
ExPDB|2q6fX       54  5e-08
ExPDB|2df6B       54  5e-08
ExPDB|2df6A       54  5e-08
ExPDB|1k4uS       53  6e-08
ExPDB|2epdA       53  8e-08
ExPDB|1lbrA       53  8e-08
ExPDB|2creA       52  1e-07
ExPDB|2ak5B       52  1e-07
ExPDB|1u0vA       52  1e-07
ExPDB|4qbaA       52  1e-07
ExPDB|3qbaA       52  1e-07
ExPDB|2qbaA       52  1e-07
ExPDB|1qbaA       52  1e-07
ExPDB|2p4zA       51  2e-07
ExPDB|2eswA       51  2e-07
ExPDB|2eswB       51  2e-07
ExPDB|2ak5A       51  2e-07
ExPDB|2d8hA       51  3e-07
ExPDB|11o6A       51  3e-07
```

# Comparative Modeling with DeepView

- **Select/all** residues in your target sequence then use **Edit/Blast Selection vs. ExpDB** to generate a BLAST search
- Loading one template does not need step 2: no comparison of templates

The image shows two windows from a computer screen. The left window is a BLAST search interface. The right window is a DeepView molecular structure viewer showing a protein structure with a red ribbon and a blue surface representation.

**BLAST Search Results:**

```

Query= query
(67 letters)

Database: ExNRL
100,120 sequences; 23,855,743 total letters

Searching.....done

Sequences producing significant alignments:

Score E
(bits) Value

ExpDB|2d19A 141 1e-34
ExpDB|2dm1A 111 1e-25
ExpDB|2nm0A 89 1e-18
ExpDB|2dm1A 75 1e-14
ExpDB|2dbm0A 74 4e-14
ExpDB|2d40A 72 1e-13
ExpDB|1a21A 68 2e-12
ExpDB|2da9A 67 3e-12
ExpDB|1wi7A 67 5e-12
ExpDB|2d18A 64 4e-11
ExpDB|2vun0A 62 1e-10
ExpDB|2d14A 60 6e-10
ExpDB|2dm0A 59 1e-09
ExpDB|2ct3A 59 1e-09
ExpDB|2d11A 59 1e-09
ExpDB|1u44A 57 3e-09
ExpDB|2sv9A 57 5e-09
ExpDB|2o9vA 55 1e-08
ExpDB|2o98A 55 1e-08
ExpDB|2o31A 55 1e-08
ExpDB|2o2wA 55 1e-08
ExpDB|2vu0A 55 2e-08
ExpDB|1u20A 55 2e-08
ExpDB|2vu0A 55 2e-08
ExpDB|2d17A 54 4e-08
ExpDB|2o6FX 54 5e-08
ExpDB|2df6B 54 5e-08
ExpDB|2df6B 54 5e-08
ExpDB|1k4uS 53 6e-08
ExpDB|2epdA 53 8e-08
ExpDB|1abr0A 53 8e-08
ExpDB|2cre0A 52 1e-07
ExpDB|2ks5B 52 1e-07
ExpDB|1uq0A 52 1e-07
ExpDB|4qba0A 52 1e-07
ExpDB|3qba0A 52 1e-07
ExpDB|2qba0A 52 1e-07
ExpDB|1qba0A 52 1e-07
ExpDB|2p4z0A 51 2e-07
ExpDB|2esv0A 51 2e-07
ExpDB|2esv0A 51 2e-07
ExpDB|2ak5A 51 2e-07
ExpDB|2q8A 51 3e-07
ExpDB|11c0A 51 3e-07
  
```

**DeepView Molecular Structure Viewer:**

The DeepView window displays a protein structure with a red ribbon and a blue surface representation. The structure is labeled "2DL3:APBDIDCHAINSEQUENCE (1146 x 621)".

**DeepView Log File:**

```

Loading layer 1
By default this log will appear each time a molecule
is loaded. This option can be disabled in
the General Preferences dialog.

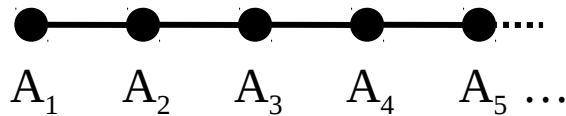
LOAD PDB loc file for C:\Users\ariama\Desktop\SPDBV_4.01_PC\SPDBV_4.01_PC\download\2dm0A
-----
Unrealistic B-factor: 0.00 for atom N of GLY 1 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of GLY 1 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of GLY 1 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of GLY 1 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom CB of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom OG of SER 2 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom CB of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom OG of SER 3 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLY 4 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLY 4 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of GLY 4 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of GLY 4 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of GLY 4 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom CB of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom OG of SER 5 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom CB of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom OG of SER 6 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLY 7 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLY 7 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of GLY 7 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of GLY 7 of chain 'A'
Unrealistic B-factor: 0.00 for atom O of GLY 7 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLU 8 of chain 'A'
Unrealistic B-factor: 0.00 for atom N of GLU 8 of chain 'A'
Unrealistic B-factor: 0.00 for atom CA of GLU 8 of chain 'A'
Unrealistic B-factor: 0.00 for atom C of GLU 8 of chain 'A'
  
```



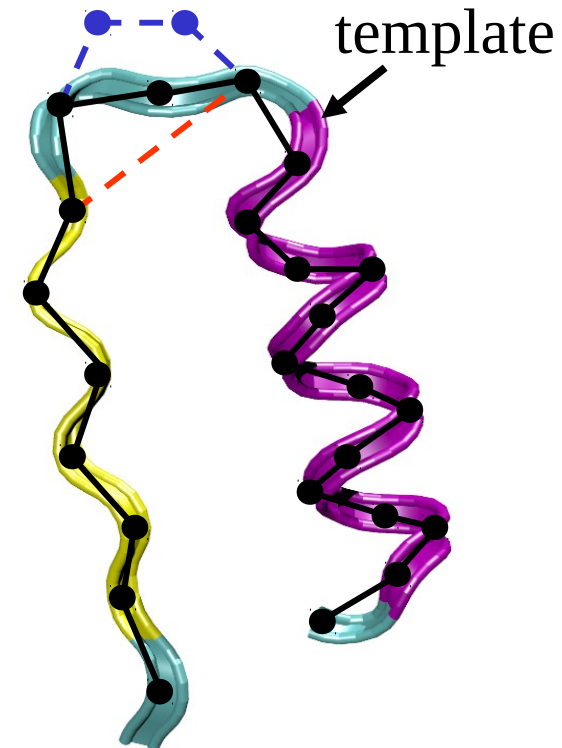
# Comparative Modeling with DeepView

- Loading more than one template
  - One can look at the energy and identify high-energy regions
  - One can look at the gaps or no alignments over entire sequence length

Target sequence



Alignment between  
target(s) and scaffold(s)



$$H = E_{contact} + E_{profile} + E_{H-bonds} + E_{gap}$$

$$E_{profile} = \sum_i^n \gamma^{(p)}(A_i, SS_i, SA_i)$$

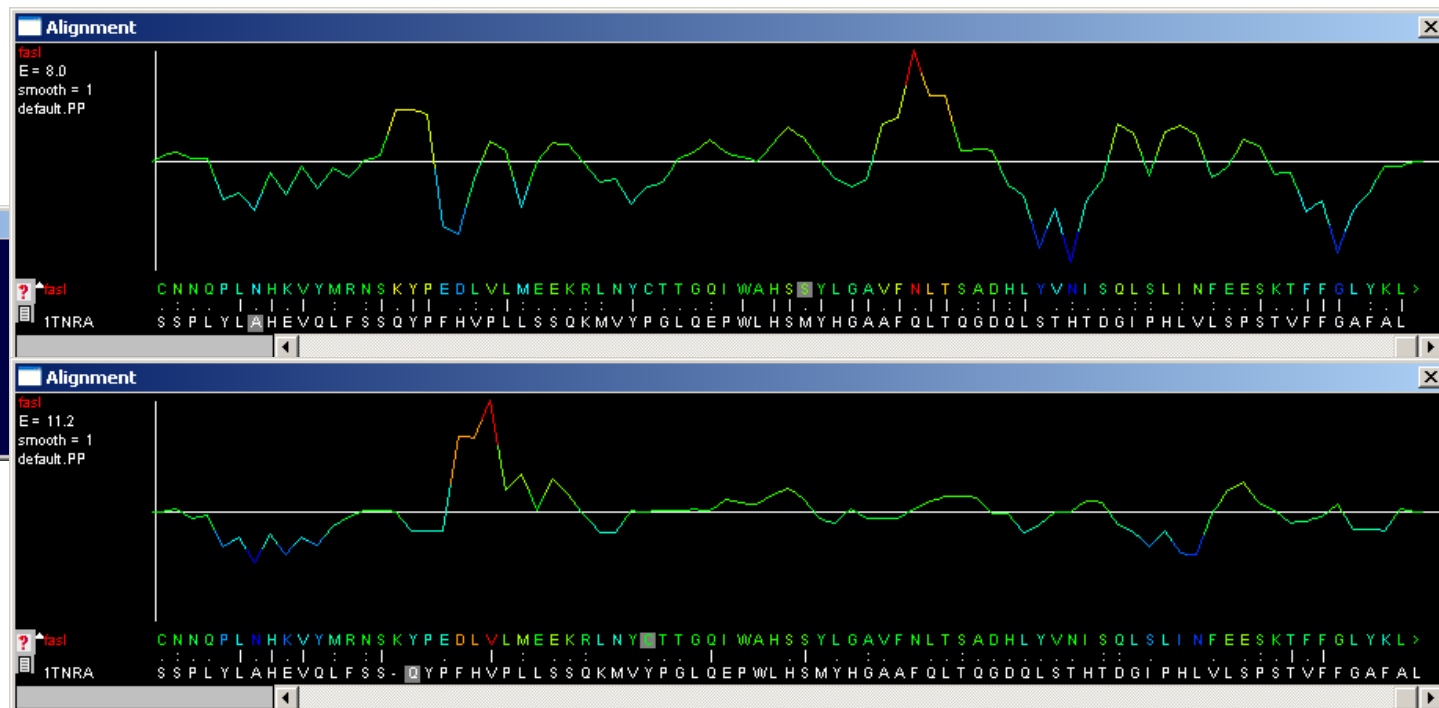
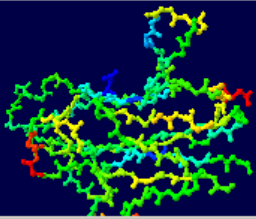
$$E_{contact} = \sum_{i,j} \sum_{k=1}^2 \gamma_k^{(ct)}(A_i, A_j) * U(r_k - r_{ij})$$

\*R. Goldstein, Z. Luthey-Schulten, P. Wolynes (1992, PNAS), K. Koretke et.al. (1996, Proteins)

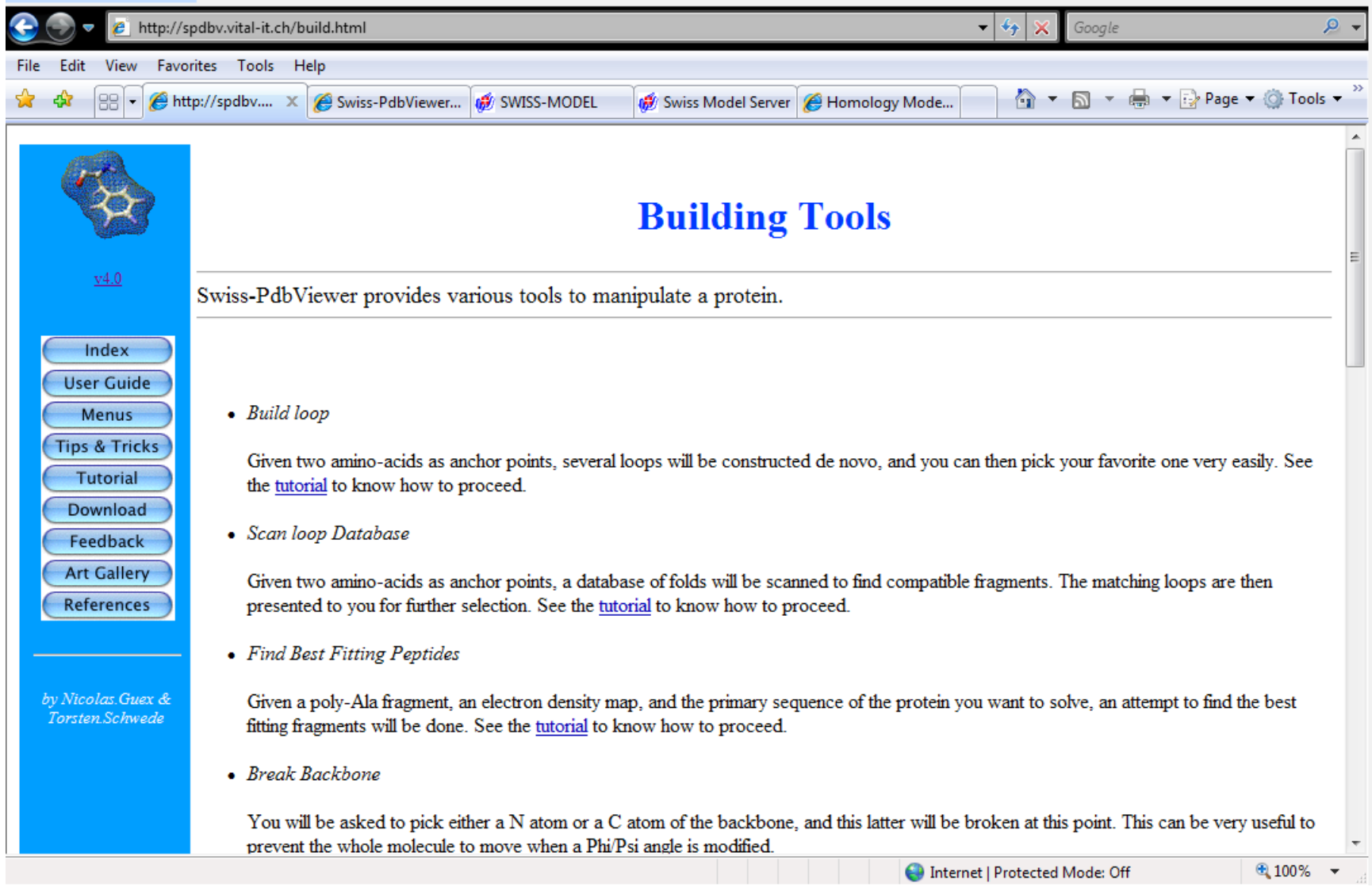
# Comparative Modeling with DeepView

- Loading more than one template
  - One can look at the threading energy and identify high-energy regions
  - One can look at the gaps or no alignments over entire sequence length

fastl (390 x 144)



# Completing Model with DeepView



http://spdbv.vital-it.ch/build.html

File Edit View Favorites Tools Help

http://spdbv... x Swiss-PdbViewer... SWISS-MODEL Swiss Model Server Homology Mode...

## Building Tools

Swiss-PdbViewer provides various tools to manipulate a protein.

- *Build loop*

Given two amino-acids as anchor points, several loops will be constructed de novo, and you can then pick your favorite one very easily. See the [tutorial](#) to know how to proceed.
- *Scan loop Database*

Given two amino-acids as anchor points, a database of folds will be scanned to find compatible fragments. The matching loops are then presented to you for further selection. See the [tutorial](#) to know how to proceed.
- *Find Best Fitting Peptides*

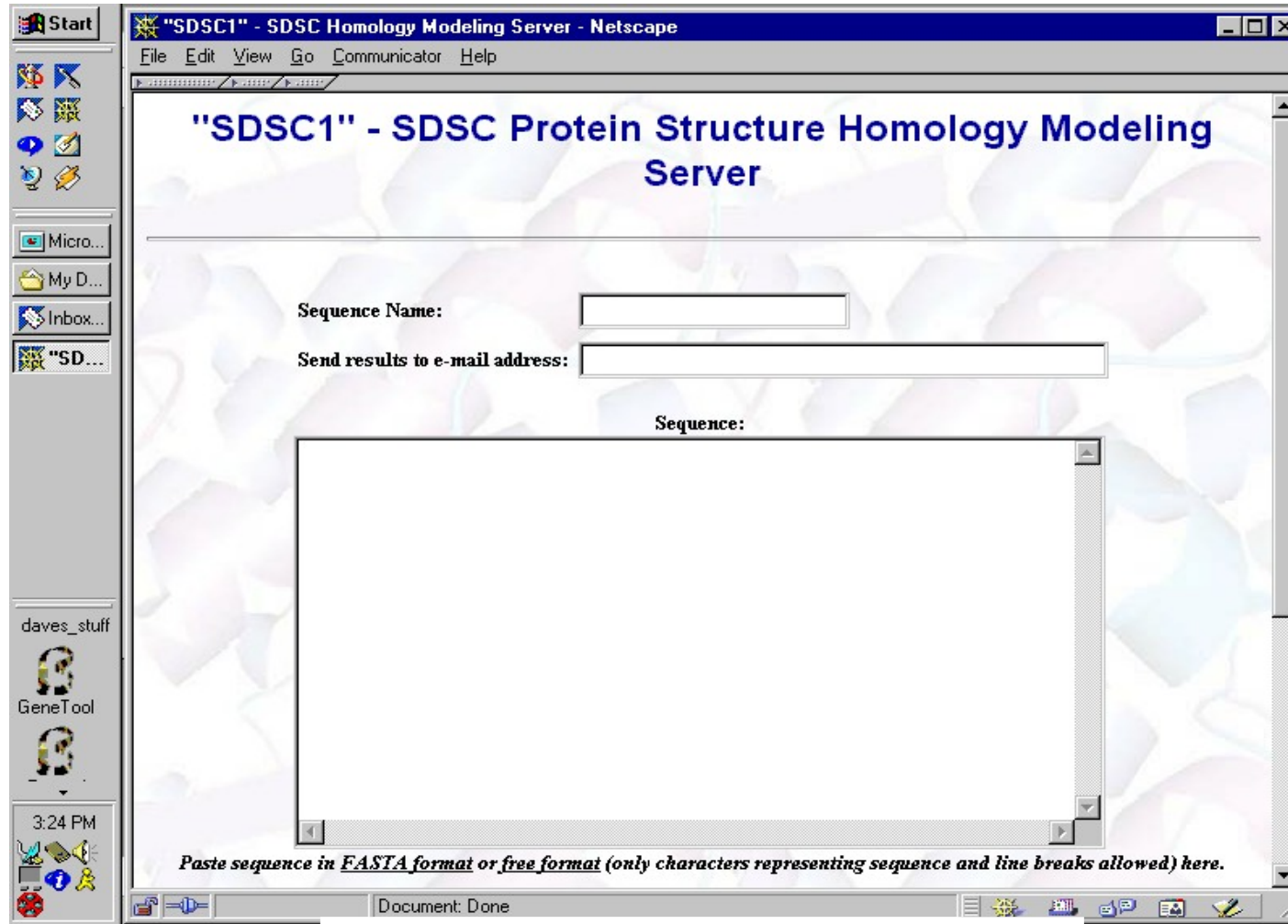
Given a poly-Ala fragment, an electron density map, and the primary sequence of the protein you want to solve, an attempt to find the best fitting fragments will be done. See the [tutorial](#) to know how to proceed.
- *Break Backbone*

You will be asked to pick either a N atom or a C atom of the backbone, and this latter will be broken at this point. This can be very useful to prevent the whole molecule to move when a Phi/Psi angle is modified.

by Nicolas.Guex & Torsten.Schwede

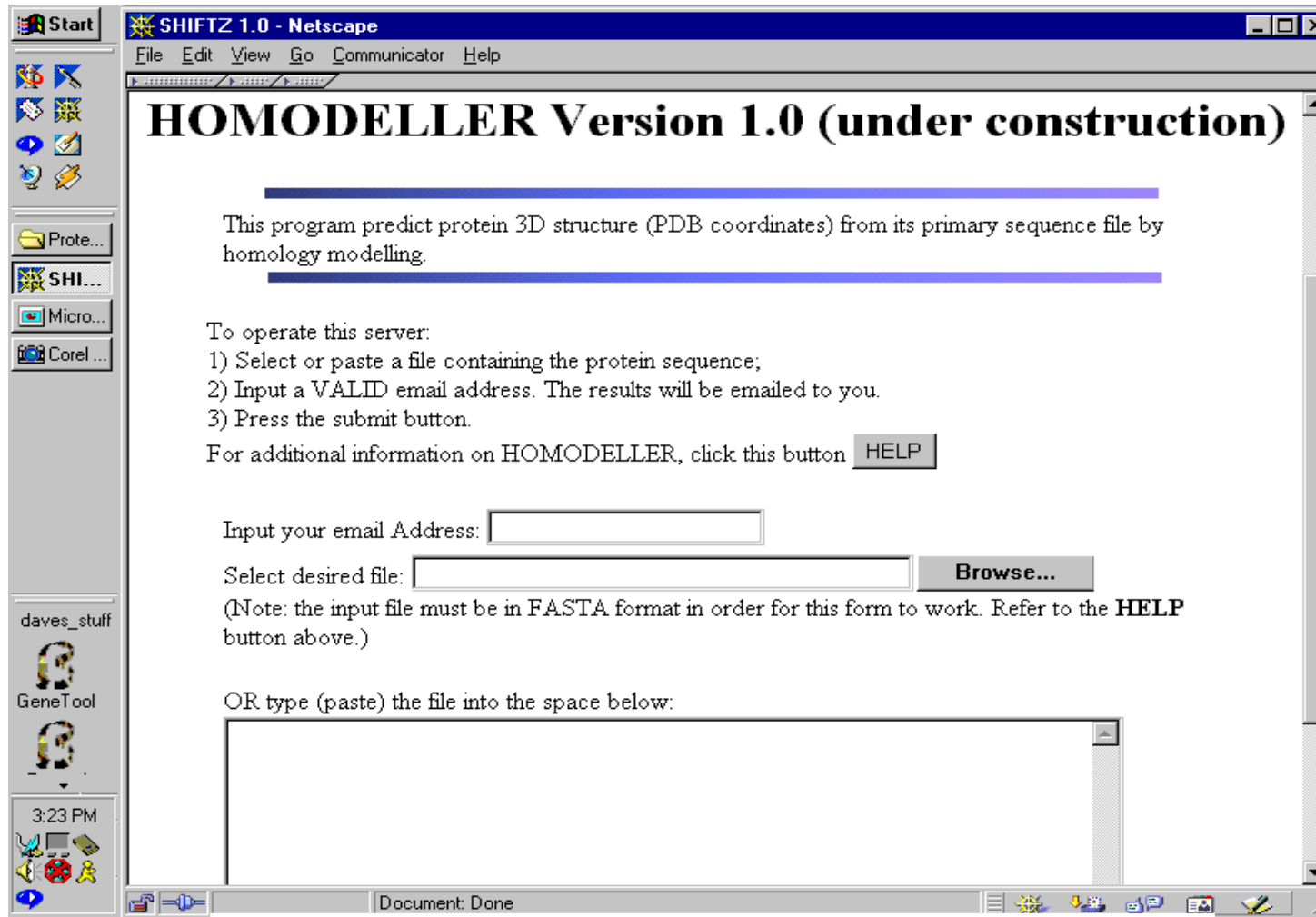
Internet | Protected Mode: Off 100%

# Comparative Modeling with SDSC



<http://cl.sdsc.edu/hm.html>

# Comparative Modeling with Homodeller



<http://redpoll.pharmacy.ualberta.ca>

# Comparative Modeling: Tools

BLAST

<http://www.ncbi.nlm.nih.gov/BLAST/>

FastA

<http://www.ebi.ac.uk/fasta33/>

SSM

<http://www.ebi.ac.uk/msd-srv/ssm/>

PredictProtein

<http://www.predictprotein.org/>

123D; SARF2; PDP

<http://123d.ncifcrf.gov/>

GenTHREADER

<http://bioinf.cs.ucl.ac.uk/psipred/>

UCLA-DOE

<http://fold.doe-mbi.ucla.edu/>

##	Scoring			Rmsd	N <sub>align</sub>	N <sub>g</sub>	% <sub>seq</sub>	Query		Target (PDB entry)			
	Q	P	Z					% <sub>sse</sub>	Match	% <sub>sse</sub>	N <sub>res</sub>	x	Title
1	1.00	48.7	21.0	0.00	343	0	100	100	1nj4:Å	100	343	<input type="checkbox"/>	CRYSTAL STRUCTURE OF A DEACYLATION-DEFECTIVE MUTANT OF PENICILLIN-BINDING PROTEIN 5 AT 1.9 Å RESOLUTION
2	0.92	40.1	19.0	0.54	337	4	99	96	1nzu:Å	89	347	<input type="checkbox"/>	WILD-TYPE PENICILLIN-BINDING PROTEIN 5 FROM E. COLI MODIFIED BY BETA-MERCAPTOETHANOL
3	0.92	40.1	19.0	0.61	333	3	100	96	1hd8:Å	96	337	<input type="checkbox"/>	CRYSTAL STRUCTURE OF A DEACYLATION-DEFECTIVE MUTANT OF PENICILLIN-BINDING PROTEIN 5 AT 2.3 Å RESOLUTION
4	0.89	35.1	17.7	0.82	338	3	100	92	1sdn:Å	92	347	<input type="checkbox"/>	CRYSTAL STRUCTURE OF A DEACYLATION-DEFECTIVE MUTANT OF PENICILLIN-BINDING PROTEIN 5 MODIFIED BY MERCURY
5	0.83	35.0	17.7	0.91	331	3	100	96	1z6f:Å	86	354	<input type="checkbox"/>	CRYSTAL STRUCTURE OF PENICILLIN-BINDING PROTEIN 5 FROM E. COLI IN COMPLEX WITH A BORONIC ACID INHIBITOR
6	0.79	29.5	16.2	1.16	331	3	100	96	1nzo:Å	86	352	<input type="checkbox"/>	THE CRYSTAL STRUCTURE OF WILD-TYPE PENICILLIN-BINDING PROTEIN 5 FROM E. COLI
Z	0.36	7.5	9.9	2.03	256	15	2.6	72	1xp4:Å	82	369	<input type="checkbox"/>	CRYSTAL STRUCTURE OF A PEPTIDOGLYCAN SYNTHESIS REGULATORY FACTOR (PRF3) FROM STREPTOCOCCUS PNEUMONIAE

## Welcome to Secondary Structure Matching a tool for protein structure comparison

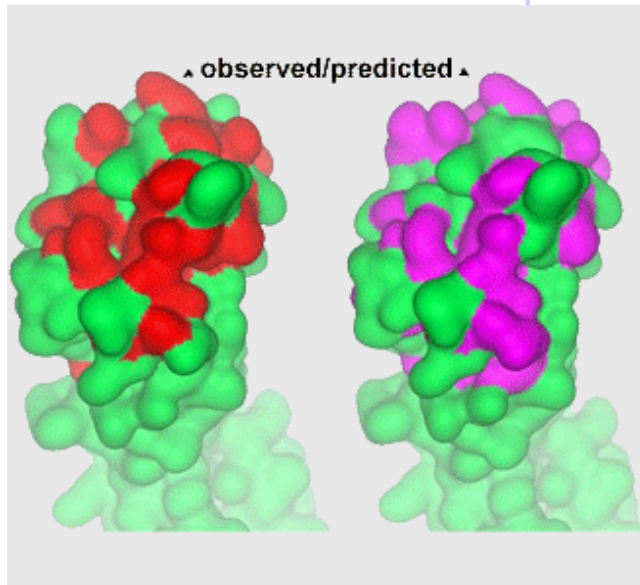
Now available for download and in-house installation, check [here](#).

Please [cite](#) SSM when you publish or otherwise present any results obtained from this service.

*Current version: 2.34 built 07/08/2007*

# Comparative Modeling: Tools

BLAST	<a href="http://www.ncbi.nlm.nih.gov/BLAST/">http://www.ncbi.nlm.nih.gov/BLAST/</a>
FastA	<a href="http://www.ebi.ac.uk/fasta33/">http://www.ebi.ac.uk/fasta33/</a>
SSM	<a href="http://www.ebi.ac.uk/msd-srv/ssm/">http://www.ebi.ac.uk/msd-srv/ssm/</a>
<b>PredictProtein</b>	<a href="http://www.predictprotein.org/">http://www.predictprotein.org/</a>
123D; SARF2; PDP	<a href="http://123d.ncifcrf.gov/">http://123d.ncifcrf.gov/</a>
GenTHREADER	<a href="http://bioinf.cs.ucl.ac.uk/psipred/">http://bioinf.cs.ucl.ac.uk/psipred/</a>
UCLA-DOE	<a href="http://fold.doe-mbi.ucla.edu/">http://fold.doe-mbi.ucla.edu/</a>



## About PredictProtein

PredictProtein is a service for sequence analysis, structure and function prediction. When you **submit** any protein sequence PredictProtein retrieves similar sequences in the database and predicts aspects of protein structure and function (**more**)

## News

10/04/2007

**PredictProtein upgrade** PredictProtein has been upgraded! We have integrated many new methods into the system; you can now get predictions of disordered/natively unstructured regions, of inter-residue contacts, of domain assignments, and protein-protein interaction and protein-DNA binding residues using our newer and **faster** server. The new system requires **registration**. Note that registration is free, and the use of PredictProtein remains free for academia.

## Comparative Modeling: Tools

BLAST	<a href="http://www.ncbi.nlm.nih.gov/BLAST/">http://www.ncbi.nlm.nih.gov/BLAST/</a>
FastA	<a href="http://www.ebi.ac.uk/fasta33/">http://www.ebi.ac.uk/fasta33/</a>
SSM	<a href="http://www.ebi.ac.uk/msd-srv/ssm/">http://www.ebi.ac.uk/msd-srv/ssm/</a>
PredictProtein	<a href="http://www.predictprotein.org/">http://www.predictprotein.org/</a>
<b>123D; SARF2; PDP</b>	<a href="http://123d.ncifcrf.gov/">http://123d.ncifcrf.gov/</a>
GenTHREADER	<a href="http://bioinf.cs.ucl.ac.uk/psipred/">http://bioinf.cs.ucl.ac.uk/psipred/</a>
UCLA-DOE	<a href="http://fold.doe-mpi.ucla.edu/">http://fold.doe-mpi.ucla.edu/</a>

Thread 1D to 3D with 123D+

**123D+** combines sequence profiles, secondary structure prediction, and contact capacity potentials to thread a protein sequence through the set of 3D structures



## Comparative Modeling: Tools

BLAST	<a href="http://www.ncbi.nlm.nih.gov/BLAST/">http://www.ncbi.nlm.nih.gov/BLAST/</a>
FastA	<a href="http://www.ebi.ac.uk/fasta33/">http://www.ebi.ac.uk/fasta33/</a>
SSM	<a href="http://www.ebi.ac.uk/msd-srv/ssm/">http://www.ebi.ac.uk/msd-srv/ssm/</a>
PredictProtein	<a href="http://www.predictprotein.org/">http://www.predictprotein.org/</a>
123D; SARF2; PDP	<a href="http://123d.ncifcrf.gov/">http://123d.ncifcrf.gov/</a>
<b>GenTHREADER</b>	<a href="http://bioinf.cs.ucl.ac.uk/psipred/">http://bioinf.cs.ucl.ac.uk/psipred/</a>
UCLA-DOE	<a href="http://fold.doe-mbi.ucla.edu/">http://fold.doe-mbi.ucla.edu/</a>

Bioinformatics Unit



PSIPRED – for secondary structure prediction

MEMSAT2 - for transmembrane topology prediction

GenTHREADER – fold recognition based on a sequence profile

# Comparative Modeling: Tools

BLAST	<a href="http://www.ncbi.nlm.nih.gov/BLAST/">http://www.ncbi.nlm.nih.gov/BLAST/</a>
FastA	<a href="http://www.ebi.ac.uk/fasta33/">http://www.ebi.ac.uk/fasta33/</a>
SSM	<a href="http://www.ebi.ac.uk/msd-srv/ssm/">http://www.ebi.ac.uk/msd-srv/ssm/</a>
PredictProtein	<a href="http://www.predictprotein.org/">http://www.predictprotein.org/</a>
123D; SARF2; PDP	<a href="http://123d.ncifcrf.gov/">http://123d.ncifcrf.gov/</a>
GenTHREADER	<a href="http://bioinf.cs.ucl.ac.uk/psipred/">http://bioinf.cs.ucl.ac.uk/psipred/</a>
<b>UCLA-DOE</b>	<a href="http://fold.doe-mbi.ucla.edu/">http://fold.doe-mbi.ucla.edu/</a>



Sequence → Structure

Fold Recognition

MOMENT Transmembrane Helix Prediction

Motif-based Fold Assignment

DPANN: Sequence to Structure Alignment

Profile Search Software: Bowie et al. 1991

---

# Comparative Modeling: Tools

Even more...

EMBOSS <http://www.ebi.ac.uk/emboss/align/>

Tcoffee <http://www.igs.cnrs-mrs.fr/Tcoffee>

ClustalW <http://www.ebi.ac.uk/clustalw/>

BCM <http://searchlauncher.bcm.tmc.edu/multi-align/>

POA <http://www.bioinformatics.ucla.edu/poa/>

STAMP <http://www.ks.uiuc.edu/Research/vmd/>

SwissModel <http://www.expasy.org/spdbv/>

---

---

## Comparative Modeling: Conclusions

- Comparative modeling is a key component to structural proteomics
  - Allows 3D coordinates of proteins to be generated where no prior experimental structure exists
  - Allows hypotheses to be tested and working models to be developed
  - Complex process requiring many components (alignment, superposition, energy minimization, structure evaluation)
  - Now mostly automated through several freely available web servers
  - Reasonably good structures can be generated using known structures with sequence identities  $\geq 25\%$
  - Models based on lower sequence identity are not always valid
  - *A good alignment is key to good models*
-

---

# Comparative Modeling: Additional Applications

## **Identification of homologous interacting pairs**

Search whether two sequences have homologues which form a complex in a database of known structures of complexes.

The alignments are analyzed to check whether contact residues in the known complex are conserved in the alignment.

## **Identification of structural patterns**

Build a library of known protein-protein interfaces from the PDB, defining interfaces as pairs of fragments that are no further than a threshold distance.

Residues that have a high frequency for a given position are considered hotspots.

This library is then used to identify potential interactions between pairs of targets, providing that they have a known structure.

---

---

## Further Reading on Comparative Modeling for Structure Prediction

Blundell, T.L., Sibanda, B.L., Sternberg, M.J.E., and Thornton, J.M. (1987) Knowledge-Based Prediction of Protein Structures and the Design of Novel Molecules. *Nature* 326: 347-352.

Fetrow, J.S. and Bryant, S.H. (1993) New Programs for Protein Tertiary Structure Prediction. *Bio/Technology* 11: 479-484.

Greer, J. (1991) Comparative Modeling of Homologous Proteins. *Meth. Enzymol.* 202: 239-252.

Johnson, M.S., Srinivasan, N., Sowdhamini, R., and Blundell, T.L. (1994) Knowledge-Based Protein Modeling. *Crit. Rev. Biochem. Mol. Biol.* 29: 1-68.

Sali, A., Overington, J.P., Johnson, M.S., and Blundell, T.L. (1990) From Comparisons of Protein Sequences and Structures to Protein Modelling and Design. *Trends Biochem. Sci.* 15: 235-240.

Kabsch, W. and Sander, C. (1983) Dictionary of Protein Secondary Structure: Pattern Recognition of Hydrogen-Bonded and Geometrical Features. *Biopolymers* 22: 2577.

Sali, A. and Blundell, T.L. (1993) Comparative Protein Modelling by Satisfaction of Spatial Restraints. *J. Mol. Biol.* 234: 779-815.

Luthy, R., Bowie, J.U., and Eisenberg, D. (1992) Assessment of Protein Models with Three-Dimensional Profiles. *Nature* 356: 83-85.

---

---

## Sources Cited

- A. Shehu, “Conformational Search for the Protein Native State,” *Protein Structure Prediction*, Wiley Series in Bioinformatics 2009.
  - A. Shehu, Ph.D. Defense Talk, 2008.
  - S. Sontum, Chem324, Spring 2008, Middlebury College
-