## **Comparative Protein Structure Prediction**



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Monday, April 20, 15



# TO LEARN HOW-TO MODEL A 3D-STRUCTURE FROM A SEQUENCE AND A KNOWN STRUCTURE

# **DISCLAIMER!**

### Structural Genomics @CNAG · CRG

home Prot. resources people RNA resources research software publications

presentations

### **Bioinformatics Resources**

| Name         | Туре | World Wide Web address                                 |
|--------------|------|--|
| DATABASES    |      |  |
| CATH         | s    | http://www.biochem.ucl.ac.uk/bsm/cath/                 |
| DBAli        | s    | http://www.salilab.org/DBAli/                          |
| GenBank      | s    | http://www.ncbi.nlm.nih.gov/Genbank/GenbankSearch.html |
| GeneCensus   | s    | http://bioinfo.mbb.yale.edu/genome                     |
| MODBASE      | s    | http://salilab.org/modbase/                            |
| MSD          | s    | http://www.ebi.ac.uk/msd/                              |
| NCBI         | s    | http://www.ncbi.nlm.nih.gov/                           |
| PDB          | s    | http://www.rcsb.org/pdb/                               |
| PSI          | s    | http://www.nigms.nih.gov/psi/                          |
| Sacch3D      | S    | http://genome-www.stanford.edu/Sacch3D/                |
| SCOP         | s    | http://scop.mrc-Imb.cam.ac.uk/scop/                    |
| TIGR         | s    | http://www.tigr.org/tdb/mdb/mdbcomplete.html           |
| TrEMBL       | S    | http://srs.ebi.ac.uk/                                  |
| FOLD ASSIGNM | ENT  |  |
| 123D         | s    | http://123d.ncifcrf.gov/                               |
| 3D-PSSM      | s    | http://www.sbg.bio.ic.ac.uk/~3dpssm/index2.html        |
| BIOINBGU     | s    | http://www.cs.bgu.ac.il/~bioinbgu/                     |
| BLAST        | s    | http://www.ncbi.nlm.nih.gov/BLAST/                     |
| DALI         | s    | http://www.ebi.ac.uk/dali/                             |
| FASS         | S    | http://ffas.ljcrf.edu                                  |
| FastA        | s    | http://www.ebi.ac.uk/fasta3/                           |
| FRSVR        | S    | http://fold.doe-mbi.ucla.edu/                          |

### http://sgt.cnag.cat/www/software/?prot\_resources

# Nomenclature

**Homology**: Sharing a common ancestor, may have similar or dissimilar functions

**Similarity**: Score that quantifies the degree of relationship between two sequences.

**Identity**: Fraction of identical aminoacids between two aligned sequences (case of similarity).

**Target**: Sequence corresponding to the protein to be modeled.

**Template**: 3D structure/s to be used during protein structure prediction.

**Model**: Predicted 3D structure of the target sequence.

**Restraint**: a measure or condition that keeps something under control.

# Nomenclature

**Fold**: Three dimensional conformation of a protein sequence (usually at domain level).

**Domain**: Structurally globular part of a protein, which may independently fold.

**Secondary Structure**: Regular subdomain structures composed by alphahelices, beta-sheets and coils (or loops).

**Backbone**: Protein structure skeleton composed by the carbon, nitrogen and oxygen atoms.

**Side-Chain**: Specific atoms identifying each of the 20 residues types.



# **Principles of protein structure**

### GFCHIKAYTRLIMVG...



### Folding (physics) *Ab initio* prediction



D. Baker & A. Sali. Science 294, 93, 2001.

# **Comparative Modeling**

## Intro to comparative protein structure prediction

### http://www.salilab.org/modeller/tutorial/



### Comparative modeling by satisfaction of spatial restraints MODELLER



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.

# **Types of homology modeling**



## Moulding: iterative alignment, model building, model assessment



John, Sali (2003). NAR pp31 3982

# **Genetic algorithm operators**



## **Composite model assessment score**

• Weighted linear combination of several structural properties:

### MINIMIZE!!

 $Z = 0.17 \ Z(P_P) + 0.02 \ Z(P_s) + 0.10 \ Z(S_c) + 0.26 \ Z(H_a) + 0.45 \ (A_s)$ 



John, Sali (2003). NAR pp31 3982

### Application to a difficult modeling case 1BOV-1LTS



Sequence identity 4.4%

Initial model C $\alpha$  RMSD 10.1Å

Final model C $\alpha$  RMSD 3.6Å



## Benchmark with the "very difficult" test set

D. Fischer threading test set of 68 structural pairs (a subset of 19)

|                  | Soquonco |          | Initial predic          | tion       | Final predi                       | ction      | Best predic                       | tion       |
|------------------|----------|----------|-------------------------|------------|-----------------------------------|------------|-----------------------------------|------------|
| Target -template | identity | Coverage | $\mathbf{C}\alpha$ RMSD | CE overlap | $\mathbf{C} \alpha \mathbf{RMSD}$ | CE overlap | $\mathbf{C} \alpha \mathbf{RMSD}$ | CE overlap |
|                  | [%]      | [% aa]   | [Å]                     | [%]        | [Å]                               | [%]        | [Å]                               | [%]        |
| 1ATR-1ATN        | 13.8     | 94.3     | 19.2                    | 20.2       | 18.8                              | 20.2       | 17.1                              | 24.6       |
| 1BOV-1LTS        | 4.4      | 83.5     | 10.1                    | 29.4       | 3.6                               | 79.4       | 3.1                               | 92.6       |
| 1CAU-1CAU        | 18.8     | 96.7     | 11.7                    | 15.6       | 10.0                              | 27.4       | 7.6                               | 47.4       |
| 1COL-1CPC        | 11.2     | 81.4     | 8.6                     | 44.0       | 5.6                               | 58.6       | 4.8                               | 59.3       |
| 1LFB-1HOM        | 17.6     | 75.0     | 1.2                     | 100.0      | 1.2                               | 100.0      | 1.1                               | 100.0      |
| 1NSB-2SIM        | 10.1     | 89.2     | 13.2                    | 20.2       | 13.2                              | 20.1       | 12.3                              | 26.8       |
| 1RNH-1HRH        | 26.6     | 91.2     | 13.0                    | 21.2       | 4.8                               | 35.4       | 3.5                               | 57.5       |
| 1YCC-2MTA        | 14.5     | 55.1     | 3.4                     | 72.4       | 5.3                               | 58.4       | 3.1                               | 75.0       |
| 2AYH-1SAC        | 8.8      | 78.4     | 5.8                     | 33.8       | 5.5                               | 48.0       | 4.8                               | 64.9       |
| 2CCY-1BBH        | 21.3     | 97.0     | 4.1                     | 52.4       | 3.1                               | 73.0       | 2.6                               | 77.0       |
| 2PLV-1BBT        | 20.2     | 91.4     | 7.3                     | 58.9       | 7.3                               | 58.9       | 6.2                               | 60.7       |
| 2POR-2OMF        | 13.2     | 97.3     | 18.3                    | 11.3       | 11.4                              | 14.7       | 10.5                              | 25.9       |
| 2RHE-1CID        | 21.2     | 61.6     | 9.2                     | 33.7       | 7.5                               | 51.1       | 4.4                               | 71.1       |
| 2RHE-3HLA        | 2.4      | 96.0     | 8.1                     | 16.5       | 7.6                               | 9.4        | 6.7                               | 43.5       |
| 3ADK-1GKY        | 19.5     | 100.0    | 13.8                    | 26.6       | 11.5                              | 37.7       | 7.7                               | 48.1       |
| 3HHR-1TEN        | 18.4     | 98.9     | 7.3                     | 60.9       | 6.0                               | 66.7       | 4.9                               | 79.3       |
| 4FGF-81IB        | 14.1     | 98.6     | 11.3                    | 24.0       | 9.3                               | 30.6       | 5.4                               | 41.2       |
| 6XIA-3RUB        | 8.7      | 44.1     | 10.5                    | 14.5       | 10.1                              | 11.0       | 9.0                               | 34.3       |
| 9RNT-2SAR        | 13.1     | 88.5     | 5.8                     | 41.7       | 5.1                               | 51.2       | 4.8                               | 69.0       |
| AVERAGE          | 14.2     | 85.2     | 9.6                     | 36.7       | 7.7                               | 44.8       | 6.3                               | 57.8       |

# Threading / Fold recognition

It is estimated there are only around 1000 to 10.000 stable folds in nature

Fold recognition is essentially finding the best fit of a sequence to a set of candidate folds

Find the best way to "mount" the residue sequence of one protein on a known structure taken from another protein

for each fold estimate the probability that the sequence can have that fold

# Finding the best "fold"

- H bond donor
- H bond acceptor
- Glycin
- Hydrophobic





# Threading software

**TOPITS**: Heuristic Threader, part of larger structure prediction system.

3DPSSM: Integrated system, does its own MSA and secondary structure predictions and then threading. (<u>http://ww.sbg.bio.ic.ac.uk/~3dpssm/index2.html</u>)

GenThreader: Similar to 3DPSSM (<u>http://bioinf.cs.ucl.ac.uk/psipred/</u>)

# Model Assessment (Potentials of Mean Force)



"The native structure generally has the lowest free energy of all states under the native conditions"

## Scoring Statistical Potential (inspiration)

$$K = \frac{\begin{bmatrix} AB \end{bmatrix}}{\begin{bmatrix} A \end{bmatrix} \cdot \begin{bmatrix} B \end{bmatrix}}$$
$$\Delta G = -RT \ln(K) = -RT \ln \frac{\begin{bmatrix} AB \end{bmatrix}}{\begin{bmatrix} A \end{bmatrix} \cdot \begin{bmatrix} B \end{bmatrix}}$$

From statistical physics, we know that energy difference between two states ( $\Delta E$ ) and the ratio of their occupancies (N<sub>1</sub>:N<sub>2</sub>) are related [9]:

$$\Delta E = -kT \ln \left(\frac{N_1}{N_2}\right) \tag{1}$$

in which T is the absolute temperature and k is the Boltzmann's constant. As we are interested in an interaction energy between two amino acid side chains, it would seem natural to define  $N_1$  as the number of interactions between these two residues types in a group of real protein structures, a number which is readily available from simple database analysis. But this number must be compared with the number of interactions in some other system,  $N_2$ , to obtain the energy difference between them.



Tanaka and Sheraga (1975) PNAS, **72** pp3802 **Sippl, (1990) J.Mo.Biol. 213 pp859** Godzik, (1996) Structure **15** pp363

# Scoring Significance of an alignment (score)

"Energy" Z-score the model with respect the energy of random models (or rest of decoys).



$$Zscore = \frac{\left( \langle E \rangle - E_{m} \right)}{\sigma_{E}}$$

ProSa

http://www.came.sbg.ac.at/prosa.php



Scoring  $\Delta G = -RT \ln(K) = -RT \ln \frac{[AB]}{[A] \cdot [B]}$  $\sigma_{F}$ <E>  $Zscore = \frac{\left(\langle E \rangle - E_{m}\right)}{\sigma_{E}}$ 

# Understanding ProSa evaluation score



## **DOPE (MODELLER)**

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

## Deriving

### Structural space



## Scoring

Pseudo-Energy with respect a ideal spherical protein as a reference state



Figure 1. Schematic representation of the reference state. (A) An illustration showing why only a fraction of a spherical shell generally contributes to the normalization function (Equation 3). (B) A pair of noninteracting atoms in a protein is modeled by two points positioned randomly inside a sphere with radius a; the points are at distance r from each other. The normalization function n(r) in Equation 7 corresponds to repeating this random assignment for an infinite number of times. (C) The definition of terms used to write Equations 8–11. The large and small spheres are the reference and probe spheres, respectively.

Shen, Min–yi, and Andrej Sali. "Statistical potential for assessment and prediction of protein structures." *Protein science* 15.11 (2006): 2507-2524.

## **DFIRE/DFIRE2**

http://sparks.informatics.iupui.edu/yueyang/DFIRE/dDFIRE-

<u>service</u>

## Deriving

### Structural space



## Scoring

Pseudo-Energy with respect a ideal gas-phase reference state

## Verify3D

http://nihserver.mbi.ucla.edu/Verify\_3D/



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# Accuracy and applicability of comparative models

### Comparative modeling by satisfaction of spatial restraints Types of errors and their impact

![](_page_26_Figure_1.jpeg)

Template - Model - Real Structure

Marti-Renom etal. Ann Rev Biophys Biomol Struct (2000) 29, 291

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![](_page_27_Figure_0.jpeg)

## **Model Accuracy**

![](_page_27_Figure_2.jpeg)

### HIGH ACCURACY

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

![](_page_27_Picture_5.jpeg)

Sidechains Core backbone Loops

### **MEDIUM ACCURACY**

CRABP Seq id 41%

Cα equiv 122/137 RMSD 1.34Å

![](_page_27_Picture_10.jpeg)

Sidechains Core backbone Loops Alignment

X-RAY / MODEL

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

### LOW ACCURACY

EDN Seq id 33%

Cα equiv 90/134 RMSD 1.17Å

![](_page_27_Picture_17.jpeg)

## Utility of protein structure models, despite errors

![](_page_28_Figure_1.jpeg)

D. Baker & A. Sali. Science 294, 93, 2001.

### Comparative Protein Structure Prediction MODELLER tutorial

# \$>mod9v14 model.py

The current release of Modeller is 9.14, which was released on July 29th, 2014

# Obtaining MODELLER and related information

### MODELLER (9v14) web page

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

- Download Software (Linux/Windows/Mac)
- ♦ HTML Manual
- Online tutorial.
- ♦ The password is...

![](_page_30_Picture_7.jpeg)

![](_page_30_Picture_8.jpeg)

![](_page_30_Picture_9.jpeg)

# **Using MODELLER**

# No GUI! Controlled by command file Script is written in PYTHON language You may know Python language is simple

# "MINIMAL" MODELLER

## ♦INPUT:

- Target Sequence (FASTA/PIR format)
- Template Structure (PDB format)
- Python script file
- OUTPUT:
  - Target-Template Alignment
  - Model in PDB format
  - Additional data (in .log)

# Modeling of BLBP Input

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

blbp.seq

>P1;blbp

sequence:blbp::::::::

VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSIDDRNCKSVVRLDGD KLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA\*

align.py

```
# Example for: alignment.align()
# This will read two sequences, align them, and write the alignment
# to a file:
log.verbose()
env = environ()
aln = alignment(env)
mdl = model(env, file='lhms')
aln.append_model(mdl, align_codes='lhms')
aln.append(file='blbp.seq', align_codes=('blbp'))
# The asl.sim.mat similarity matrix is used by default:
aln.align(gap_penalties_ld=(-600, -400))
aln.write(file='blbp-lhms.ali', alignment_format='PIR')
aln.write(file='blbp-lhms.pap', alignment_format='PAP')
```

```
Example for: alignment.align()
 This will read two sequences, align them, and write the alignment
 to a file:
log.verbose()
env = environ()
aln = alignment(env)
mdl = model(env, file='1hms')
aln.append model(mdl, align codes='1hms')
aln.append(file='blbp.seg', align codes=('blbp'))
# The asl.sim.mat similarity matrix is used by default:
aln.align(gap_penalties_1d=(-600, -400))
        e(file='blbp-1hms.ali', alignment format='PIR')
aln.wr
aln.write(file='blbp-1hms.pap', alignment format='PAP')
```

```
Example for: alignment.align()
 This will read two sequences, align them, and write the alignment
 to a file:
log.verbose()
env = environ()
aln = alignment(env)
mdl = model(env, file='1hms')
aln.append model(mdl, align codes='1hms')
aln.append(file='blbp.seq', align_codes=('blbp'))
# The as1.sim.mat similarity matrix is used by default:
aln.align(gap_penalties_1d=(-600, -400))
aln.write(file='blbp-1hms.ali', alignment_format='PIR')
aln.write(file='blbp-1hms.pap', alignment_format='PAP')
```

```
Example for: alignment.align()
 This will read two sequences, align them, and write the alignment
 to a file:
log.verbose()
env = environ()
aln = alignment(env)
mdl = model(env, file='1hms'
aln.append model(mdl, align codes='1hms')
aln.append(file='blbp.seg', align codes=('blbp'))
# The as1.sim.mat similarity matrix is used by default:
aln.align(gap penalties 1d=(-600, -400))
aln.write(file='blbp-1hms.ali', alignment format='PIR')
aln.write(file='blbp-1hms.pap', alignment format='PAP')
```

### Modeling of BLBP STEP 1: Align blbp and 1hms sequences *Output*

blbp-1hms.ali

| >P1;1hms  |  |  |  |  |  |
|---|--|--|--|--|--|
| <pre>structureX:1hms: 1 :A: 131 :A:undefined:undefined:-1.00:-1.00</pre>    |  |  |  |  |  |
| VDAFLGTWKLVDSKNFDDYMKSLGVGFATRQVASMTKPTTIIEKNGDILTLKTHSTFKNTEISFKLGVEFDETTA |  |  |  |  |  |
| DDRKVKSIVTLDGGKLVHLQKWDGQETTLVRELIDGKLILTLTHGTAVCTRTYEKE*                   |  |  |  |  |  |
| >P1;blbp  |  |  |  |  |  |
| sequence:blbp: ::::::0.00:0.00  |  |  |  |  |  |
| VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSI |  |  |  |  |  |
| DDRNCKSVVRLDGDKLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA*                   |  |  |  |  |  |

### Modeling of BLBP STEP 1: Align blbp and 1hms sequences *Output*

| >P1;1hms  |
|---|
| <pre>structureX:1hms: 1 : : 131 : :undefined:undefined:-1.00:-1.00</pre>    |
| VDAFLGTWKLVDSKNFDDYMKSLGVGFATRQVASMTKPTTIIEKNGDILTLKTHSTFKNTEISFKLGVEFDETTA |
| DDRKVKSIVTLDGGKLVHLQKWDGQETTLVRELIDGKLILTLTHGTAVCTRTYEKE*                   |
| >P1;blbp  |
| sequence:blbp: ::::::0.00:0.00  |
| VDAFCATWKLTDSQNFDEYMKALGVGFATRQVGNVTKPTVIISQEGGKVVIRTQCTFKNTEINFQLGEEFEETSI |
| DDRNCKSVVRLDGDKLIHVQKWDGKETNCTREIKDGKMVVTLTFGDIVAVRCYEKA*                   |

### Modeling of BLBP STEP 1: Align blbp and 1hms sequences *Output*

blbp-1hms.pap

| _aln.pos | 10         | 0 2        | 20         | 30          | 40         | 50               | 60                 |
|----------|------------|------------|------------|-------------|------------|------------------|--------------------|
| 1hms     | VDAFLGTWK  | LVDSKNFDDY | MKSLGVGF   | ATRQVASMTKP | TTIIEKNGD  | LTLKTHSTF        | <b>KNTEISFKLGV</b> |
| blbp     | VDAFCATWK  | LTDSQNFDEY | MKALGVGF   | ATRQVGNVTKP | TVIISQEGGE | <b>VVIRTQCTF</b> | <b>KNTEINFQLGE</b> |
| _consrvd | **** ***   | * ** *** * | ** *****   | **** ***    | * ** *     | * ***            | **** * **          |
|          |            |            |            |             |            |                  |                    |
| _aln.p   | 70         | 80         | 90         | 100         | 110        | 120              | 130                |
| 1hms     | EFDETTADDI | RKVKSIVTLD | GGKLVHLQF  | WDGQETTLVR  | ELIDGKLILT | TLTHGTAVCT       | RTYEKE             |
| blbp     | EFEETSIDD  | RNCKSVVRLE | GDKLIHVQF  | WDGKETNCTR  | EIKDGKMVV  | LTFGDIVAVE       | RCYEKA             |
| _consrvd | ** ** **   | * ** * **  | ** ** * ** | **** * *    | * *** *    | *** * * *        | * ***              |

```
Homology modelling by the automodel class
log.verbose()
                                 # request verbose output
env = environ()
                                  # create a new MODELLER environment
# directories for input atom files
env.io.atom_files_directory = './:../atom_files'
a = automodel(env,
            alnfile = 'blbp-1hms.ali', # alignment filename
                   = '1hms', # codes of the templates
            knowns
            sequence = 'blbp')
                                       # code of the target
a.starting model= 1
                               # index of the first model
a.ending model = 1
                              # index of the last model
                               # (determines how many models to calculate)
                               # do the actual homology modelling
a.make()
```

```
Homology modelling by the automodel class
log.verbose()
                                 # request verbose output
env = environ()
                                  # create a new MODELLER environment
# directories for input atom files
env.io.atom_files_directory = './:../atom_files'
a = automodel(env)
            alnfile = 'blbp-1hms.ali', # alignment filename
                   = '1hms', # codes of the templates
            knowns
            sequence = 'blbp')
                                       # code of the target
a.starting model= 1
                               # index of the first model
a.ending model = 1
                              # index of the last model
                               # (determines how many models to calculate)
                               # do the actual homology modelling
a.make()
```

![](_page_43_Figure_1.jpeg)

### PDB file

Can be viewed with Chimera

http://www.cql.ucsf.edu/chimera/

PyMol\_

http://www.pymol.org

Rasmol

http://www.openrasmol.org

![](_page_44_Picture_8.jpeg)

color by SS focus

ender by att frequently used Configure... Close

X Viewing

Resolution: high Close Help

### •Model file $\rightarrow$ blbp.B99990001.pdb

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### **Get ready for 11th May!**

### http://www.salilab.org/modeller/tutorial/

![](_page_45_Picture_2.jpeg)

## FULLY AUTOMATIC MODWEB

http://salilab.org/modweb

| O O ModWeb Server   |  |  |                              |             |  |  |  |  |  |  |
|---|--|--|------------------------------|-------------|--|--|--|--|--|--|
|   | https://modbase.compbio.ucsf.edu/sc  | gi/modweb.cgi  |                              | C Q- Google |  |  |  |  |  |  |
|   | ModWeb Server  |  |                              |             |  |  |  |  |  |  |
|   | ・ <u>Sali Lab Home</u> ・ <u>ModWeb</u> ・ <u>ModLoop</u> ・ <u>ModBase</u> ・ <u>IMP</u> ・ <u>ModPipe</u> ・ <u>LS-SNP</u> ・ |  |                              |             |  |  |  |  |  |  |
| Help User Lo  | ogin ModBase Datasets for User:Anony   | rmous Contact News Curren                              | t ModWeb queue ModWeb Home   |             |  |  |  |  |  |  |
| News:   | ModWeb: A  | Server for Protein S<br>Welcome to the new ModWeb (old | tructure Modeling            |             |  |  |  |  |  |  |
| New <u>Chimera</u> - Modeller<br>Module for interactive<br>modeling!                        | General information  |  | Calculate Models (Reset)     |             |  |  |  |  |  |  |
| <ul> <li>In Chimera's daily build<br/>starting Sept 15, 2010</li> </ul>                     | Name<br>Email address  |  |                              |             |  |  |  |  |  |  |
| Additional functionality for<br>registered users:   | Modeller license key 👔<br>(Not necessary for ModBase updates)  |  |                              |             |  |  |  |  |  |  |
| Template based     modeling   | Dataset name (optional)  | Add to academic dataset                                |                              |             |  |  |  |  |  |  |
| <ul> <li>Access to all user's<br/>ModWeb datasets</li> </ul>                                | Input data 👔   |  |                              |             |  |  |  |  |  |  |
| <ul> <li>Email notification for<br/>User's ModBase<br/>updates</li> </ul>                   | Input protein sequences 👔  |  |                              |             |  |  |  |  |  |  |
| Developers:   |  |  |                              |             |  |  |  |  |  |  |
| Eswar Narayanan<br>Ursula Pieper<br>Ben Webb  | or upload sequences file 👔<br>(FASTA Format)   | Choose File no file selected Calculate Models Reset    |                              |             |  |  |  |  |  |  |
| Acknowledgements:   | Model selection criteria   | Sest scoring model                                     | 🗹 Longest well scoring model |             |  |  |  |  |  |  |
| David Eramian<br>Mallur S. Madhusudhan<br>Marc A. Marti-Renom<br>Min-Yi Shen<br>Andrej Sali | Other options  | Very Fast  | Upload models to ModBase     |             |  |  |  |  |  |  |

## MODBASE

### http://salilab.org/modbase

| Search Page  |   |
|--|---|
|  |   |
| Home User Logi   | in ModBase Search Page ModWeb Modelling Server Help Current Logins  |
| Mod  | Database of Comparative Protein Structure Models<br>Welcome to ModBase, a database of three-dimensional protein models calculated by comparative modeling.<br>(Old ModBase Interface) |
| General Information  |   |
| Statistics   | ModBase search form Search  |
| Project Pages  | Search type 🕅 Model/Default) 🔨 🚺 Display type 🕅 Model Defail (graphical) 💌  |
| Documentation  |   |
| Authors and<br>Acknowledgements  | All available datasets are selected   |
| Publications   |   |
| Todo List  | Search by properties  |
| Related Resources  | Property 🖬 ALL  |
| Note:<br>MODBASE contains<br>theoretically calculated<br>models, not experimentally<br>determined structures. The<br>models may contain<br>significant errors. | Organism 🖬 ALL 🗹 or Advanced search   |

### Model Details

| Home     User Login     ModBase Search Page     ModBase Search Page       Sequence Information       Primary Database Link @     P43632 (KI2S4_HUMAN )       Organism @     Homo sapients       Annotation     Refression       Sequence Length     304       Model Information     Perform action on this model @ : Select option       Perform action on this model @ : Select option     Image: Sequence Information       Sequence Identity     89.00%       E-Value     2e433       Model Score 1.00     Target Region 27-221       Protein Length     304       Template PBD     1nkr       Code     PD       Code     Pol       Dataset     snp-human2  |  |            |
|--|--|------------|
| Sequence Information         Primary Database Link II       P43632 (KI254 HUMAN)         Organism II       Homo saviens         Annotation       killer cell immunoglobulin-like receptor 2ds4 precursor (mhc associated transcript 8) (nkat-8)de (p58 natural killer cell ressociated transcript 8) (nkat-8) (nkat   | IodWeb Modelling Server  | Help       |
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| Model Score     1.00       Target Region     27-221       Protein Length     304       Template PDB<br>Code     1nkr       Template Region     6-200       Dataset     snp-human2  |  |            |
| Protein Length 304<br>Template PDB 1nkr<br>Template Region 6-200<br>Dataset snp-human2   |  |            |
| Template PDB <u>1nkr</u><br>Code <u>Template Region</u> 6-200<br>Dataset snp-human2  |  |            |
| Template Region 6-200<br>Dataset snp-human2  |  |            |
| Dataset snp-human2   |  |            |
|  |  |            |
| Filtered models for current sequence ( <u>Show all models</u> )  |  |            |
| Cross-references   |  |            |

### Sequence Overview SegId Fold MScore hypothetical protein Pseudomonas aeruginosa 3738 Q8G8A6 Segid Fold MScore hypothetical protein Escherichia coli Q8G9W1 1140 Streptococcus pneumoniae, Streptococcus pneumoniae Segid Fold MScore hypothetical protein spr1965 1038 Q8CY62 R6

### Model Overview

| 19 C | •   | Q8G8C7        | hypothetical protein | <u>Pseudomonas</u><br><u>aeruginosa</u> | 4996 | 2089-2158 | 70  | 37.00 | 7e-14 | 1.00 | <u>1dnyA</u> | 8-78   |
|------|-----|---------------|----------------------|---|------|-----------|-----|-------|-------|------|--------------|--------|
| 教    | •   | <u>Q8G8C7</u> | hypothetical protein | <u>Pseudomonas</u><br><u>aeruginosa</u> | 4996 | 492-1017  | 526 | 36.00 | 1e-82 | 1.00 | <u>1amuA</u> | 19-529 |
|      | ● □ | <u>Q8G9W1</u> | hypothetical protein | <u>Escherichia coli</u>                 | 1140 | 349-1135  | 787 | 35.00 | 0     | 1.00 | <u>1r9dA</u> | 6-783  |

• Pieper et al. (2004) Nucleic Acids Research 32, D217-D222

# **Modeling RNA**

## MC-FOLD / MC-SYM

http://www.major.iric.ca/MajorLabEn/MC-Tools.html http://www.major.iric.ca/MC-Sym/

INSTITUTE FOR RESEARCH IN IMMUNOLOGY AND CANCER Université de Montréal

### Messages:

| - Please note that Working directories are erased  | 7 days after the last change made.   |
|--|--|
| SV Pipeline page   | MC-Sym's [user's guide][FAQ][wiki  |
| MC-SYM   |  |
| - 1. Input File  |  |
| <ul> <li>Make sure that your input file contains or</li> <li>Do not use Microsoft Word to edit the so</li> </ul> | nly printable <b>ASCII</b> characters<br>rript; use <b>WordPad</b> instead |
|  | Browse   |
| Submit Reset   | Help   |
| 2. Local File (Option)   |  |
|  | Browse   |
| 3. Directory Key (Option)  |  |
|  | ✓ remove previous models   |
| 4. Email Address (Option)  |  |
| Provide your email address to receive notified   | cations about:   |
| <ul><li>Job completion</li><li>Directory removal (48h notice)</li></ul>  |  |
|  |  |

- Coarse-grained model
- Fragment-based approach
- Fully automated
- Slow
- Sampling bottleneck
- Relative poor accuracy

Monday, April 20, 15

![](_page_50_Picture_0.jpeg)

| Welcome to ROSIE<br>Rosetta Online Server that Includes Everyone  |  |   |  |  |  |  |  |  |  |
|---|--|---|--|--|--|--|--|--|--|
| Welcome Queue Documentation Support   | _  | Login Create an account   |  |  |  |  |  |  |  |
|   | Rosetta RNA_Denovo Protoc  | col   |  |  |  |  |  |  |  |
| [Submit RNA Denovo task]  |  | [RNA Denovo Documentation]  |  |  |  |  |  |  |  |
| Please cite the following article when refe<br>• Das, R., Karanicolas, J., Baker., D. "Atomic ac<br><u>Online   PDF</u> | erring to results from our RNA_Denovo                                | <b>9 server:</b><br>al RNA structure". <i>Nature Methods</i> 7:291–294. (2010). |  |  |  |  |  |  |  |
| rosie is web front-end for <u>Rosetta software su</u>   | <u>ite</u> . Developed by Sergey Lyskov, <u>GrayLab at JHU</u> . Cop | pyright © 2012 Rosetta Commons Member Institutions.                             |  |  |  |  |  |  |  |

## **MODERNA**

### http://iimcb.genesilico.pl/modernaserver/

![](_page_51_Picture_2.jpeg)

![](_page_51_Picture_3.jpeg)

Laboratory of Bioinformatics and Protein Engineering

Home Submit All results

### **ModeRNA** server

ModeRNA Help Tutorial Contact

Genesilico Homepage

### Moderita Selvel

### A server for RNA structure modeling and analysis

by Magdalena Rother, Kaja Milanowska, Tomasz Puton, Kristian Rother, and Janusz M. Bujnicki.

http://iimcb.genesilico.pl/modernaserver/

### What is the ModeRNA server?

![](_page_51_Picture_14.jpeg)

This service is based on the ModeRNA software for RNA 3D structure prediction, analysis, and manipulation.

Currently, the server allows you to:

- build a model (requires a pairwise sequence alignment and a structural template).
- find template (looks for potential templates using ParAlign and Rfam).
- align sequences (prepares an alignment between two RNA sequences using R-coffee).
- convert PDB naming (changes nomenclature in a PDB file).
- clean up a structure (remove water, ions, and ligands, adds missing P atoms and changes '\*' into ''' in ribose).

- Comparative RNA modeling
- Able to handle 115 nucleotide modifications

# **Modeling Chromatin**

## Integrative Modeling with RNA and chromatin

http://www.integrativemodeling.org

![](_page_53_Figure_2.jpeg)

![](_page_53_Picture_3.jpeg)

# The "Chromatin Globule" model

D. Baù et al. Nat Struct Mol Biol (2011) 18:107-14 A. Sanyal et al. Current Opinion in Cell Biology (2011) 23:325-33.

![](_page_54_Figure_2.jpeg)

![](_page_54_Figure_3.jpeg)

Monday, April 20, 15

# Caulobacter crescentus 3D genome

M.A. Umbarger, et al. Molecular Cell (2011) 44:252-264

![](_page_55_Picture_2.jpeg)

![](_page_55_Picture_3.jpeg)

# Take-home messages

- Homology != Identity
- Comparative modeling needs prior knowledge and a template.
- Our model relies on the alignment step...
- Evaluation is the key step, statistical potential.
- You should play with modeller, tutorial 11th may!

![](_page_56_Picture_6.jpeg)

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