

# Spécialité Bioinformatique M1: Lecture 2-A

P. Derreumaux

**Predicting structure from a bioinformatics  
or biochemists perspective**

# The CASP experiment

- *CASP= Critical Assessment of Structure Prediction*
- *Started in 1994, based on an idea from John Moult (Moult, Pederson, Judson, Fidelis, Proteins, 23:2-5 (1995))*
- *First run in 1994; now runs regularly every second year (CASP7 was held last december)*

# The CASP experiment: how it works

- 1) Sequences of target proteins are made available to CASP participants in June-July of a CASP year
  - the structure of the target protein is known, but not yet released in the PDB, or even accessible*
- 2) CASP participants have between 2 weeks and 2 months over the summer of a CASP year to generate up to 5 models for each of the target they are interested in.*
- 3) Model structures are assessed against experimental structure*
- 4) CASP participants meet in December to discuss results*

# CASP

## *Three categories at CASP*

- Homology (or comparative) modeling
- Fold recognition
- Ab initio or de Novo prediction

## *CASP dynamics:*

- Real deadlines; pressure: positive, or negative?
- Competition?
- Influence on science ?

# EVOLVING IDEAS

- **Used to be:**

Secondary structure

Molecular Dynamics

Folding pathways

Fold recognition

- **Now is:**

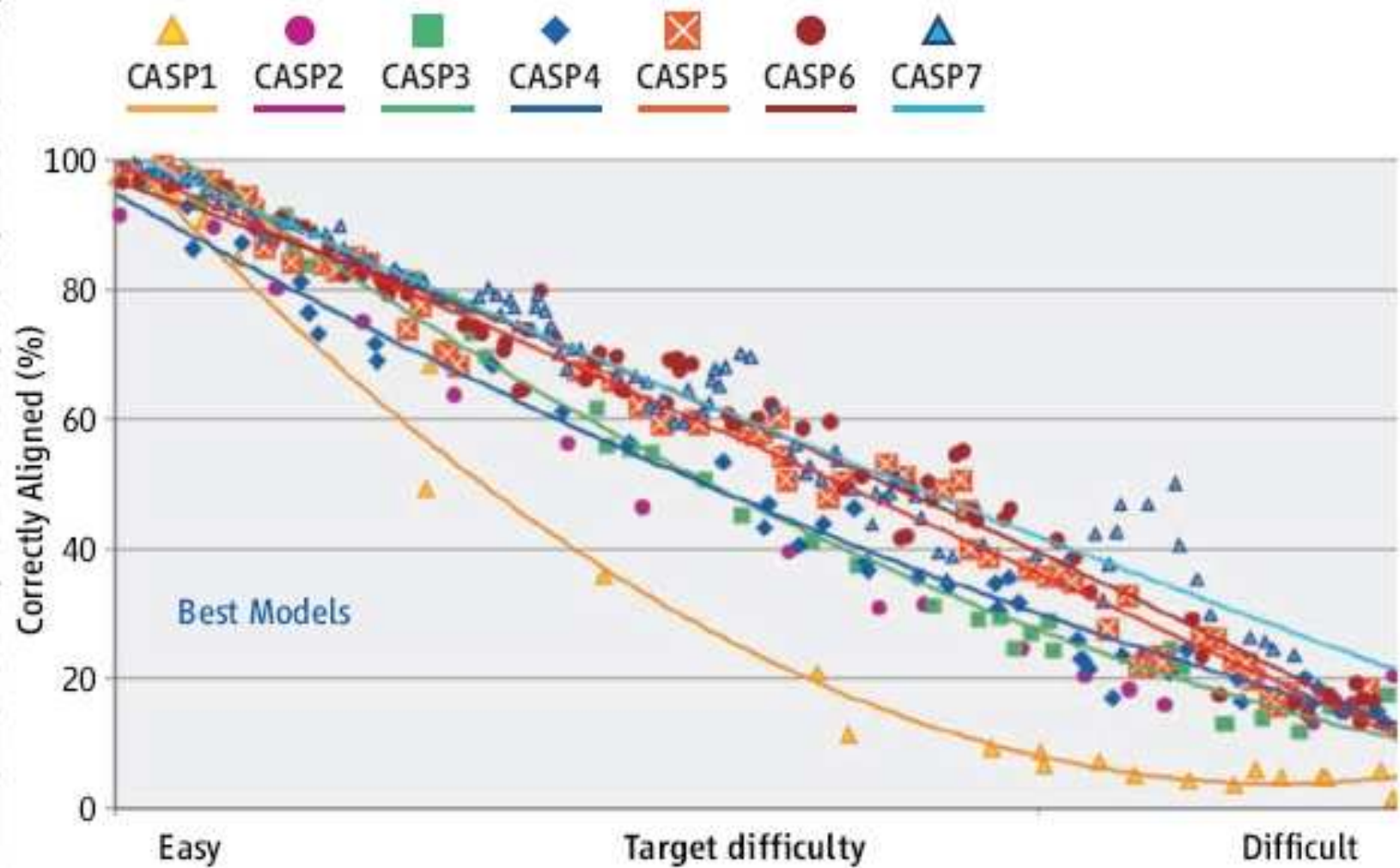
Profiles

Multiple templates

Meta-servers

Fragments

Refinement

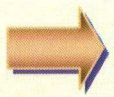


Steady rise. Computer modelers have slowly but steadily improved the accuracy of the protein-folding models.

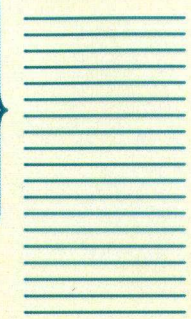
# Prediction of protein 3D structure

**sequence**

KELVLVLYDY QEKSPRELT  
KKGDILTLLN STNKDWWKVE  
VNDRQGFIPA AYLKKLD



Sequence databanks  
SWISS\_All/PFAM/Interpro



300,000  
sequences



No similar sequence  
is identified

Similar sequence with  
Known 3D structure is  
identified

Similar sequence(s)  
found, but no info  
on 3D structure

Secondary structure  
prediction

Homology modelling

Secondary structure  
prediction

Fold recognition

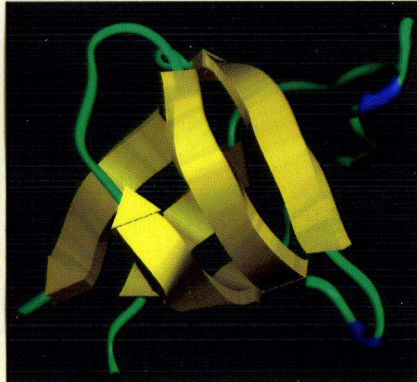
no

yes

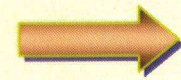
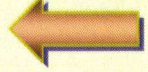
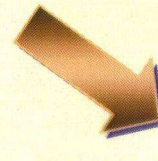
yes

Ab-initio prediction/  
Fold recognition

Ab-initio prediction

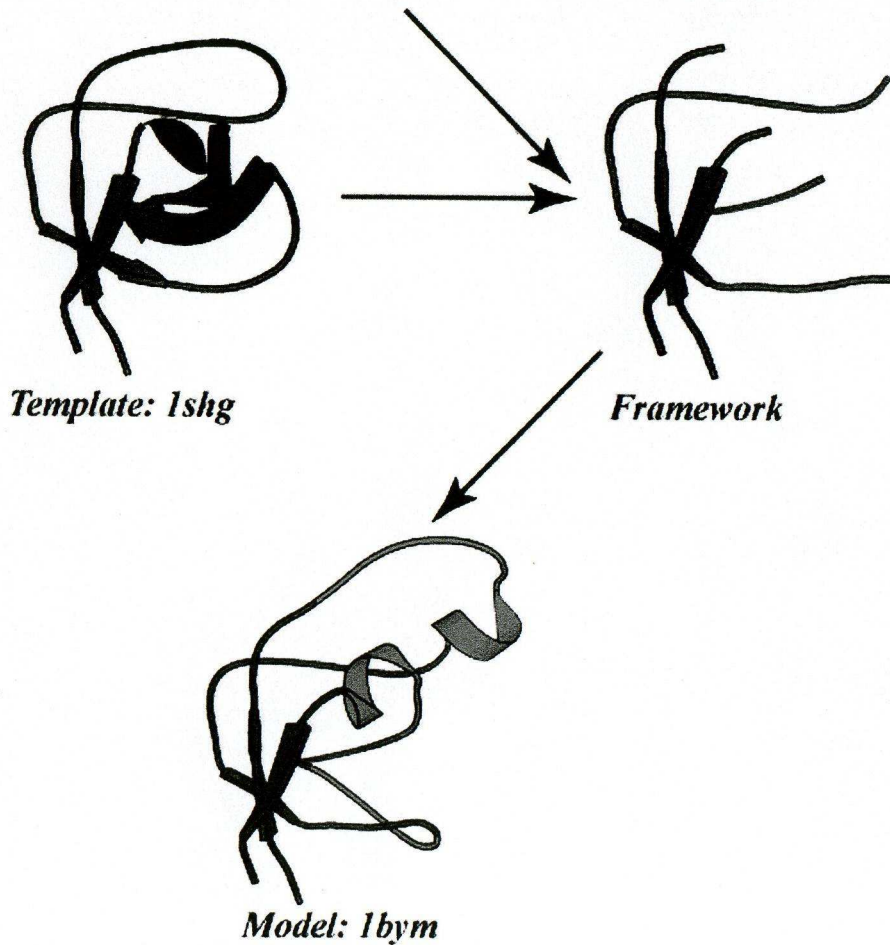


**3D structure**



# Homology Modeling: How it works

*lshg* KELVLALYD<sup>YQE</sup>-----KSPREVTMKKGDIL<sup>TLLNSTMKD</sup>W<sup>W</sup>KVEVNDRO<sup>GFV</sup>---PAAK<sup>V</sup>KKLD  
*lbym* RKVRIVQIN<sup>E</sup>IFQVETDQ<sup>F</sup>TQLLDADIRVGSEVEIVDRD<sup>GHI</sup>--T<sup>L</sup>SHNGK<sup>I</sup>VELLDDLA<sup>H</sup>TIRIEE

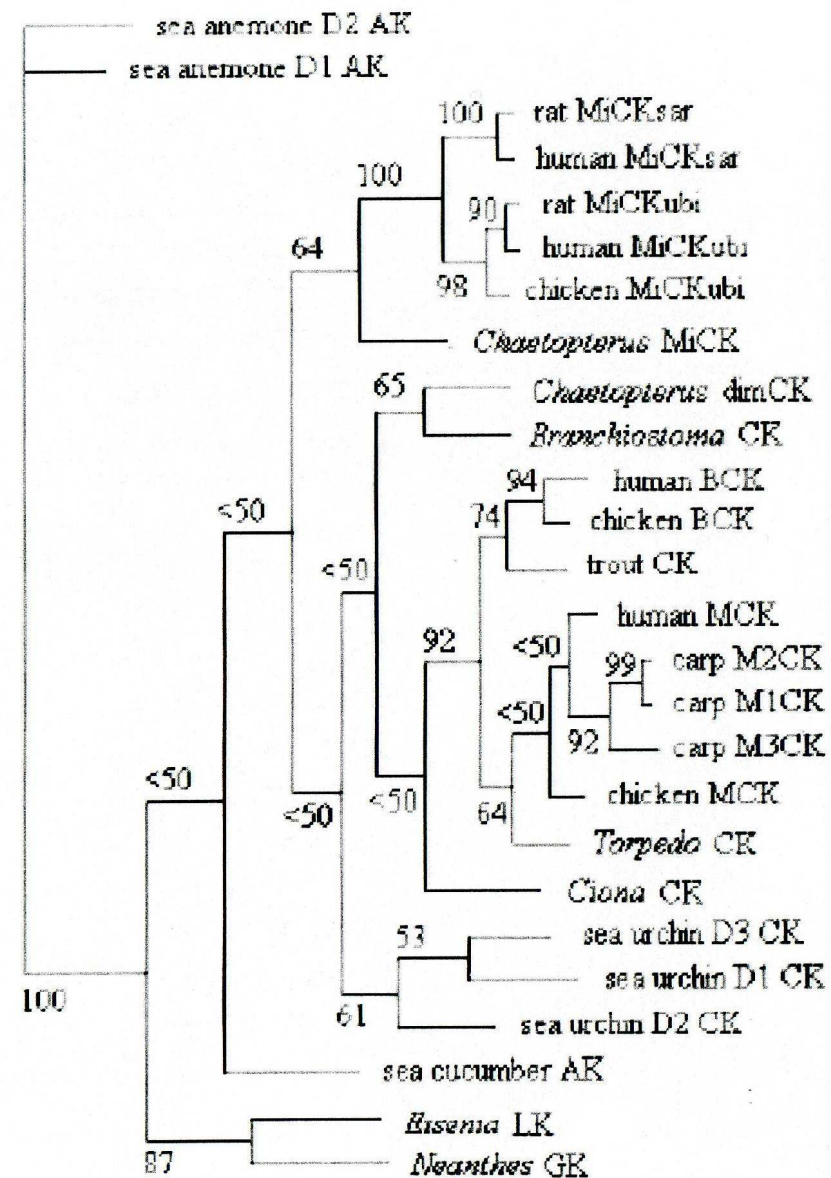


- o Find template
- o Align target sequence with template
- o Generate model:
  - add loops
  - add sidechains
- o Refine model



# Template choice

1. Higher the sequence identity, the more likely the template will be suitable
2. Most closely related from a phylogenetic point of view
3. Template “environment” (solvent, pH, temperature, quaternary structure)
4. Quality of the template structure (resolution and R factor)



# Homology modelling

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## Building the model

### MODELLING THE WHOLE FOLD

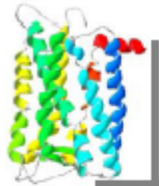
1. Rigid-body assembly (COMPOSER)
2. Spare-parts approach
3. Satisfaction of spatial restraints (MODELLER)

### MODELLING LOOPS

1. Database search of segments fitting fixed end-points
2. Molecular mechanics, molecular dynamics
3. Combination of 1+2

### MODELLING SIDE CHAIN CONFORMATIONS

1. Use of rotamer libraries (backbone dependent)
2. Molecular mechanics optimization
3. Mean-field methods



## Typical types of errors

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- Sequence alignment errors.
- Loops which cannot be rebuilt.
- Inappropriate template selection.
- Subunit displacement.

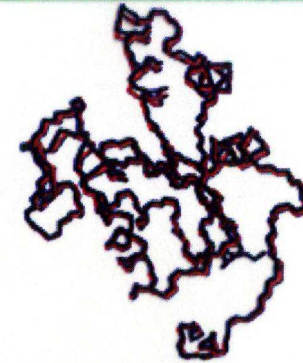
# Structure Modeling by Homology: Limitations

Homology modelling is the method that can be applied to generate reasonable models of protein structure.

% Sequence Identity (target-template)

100

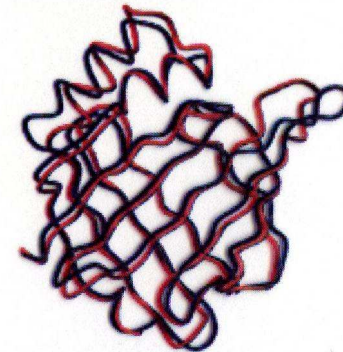
- Comparable to medium resolution NMR, low resolution crystallography
- Docking of small ligands, proteins.



human nucleoside diphosphate kinase

60

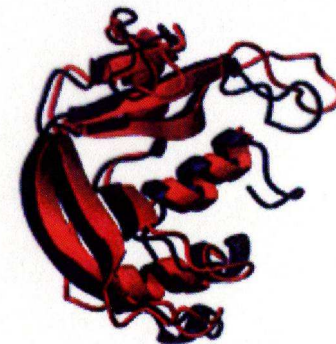
- Molecular replacement in crystallography.
- Supporting site-directed mutagenesis.



mouse cellular retinoic acid binding protein I

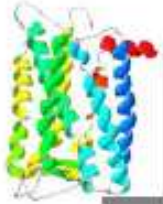
30

- Refining NMR structures.
- Finding binding/active sites by 3D motif searching.
- Annotating function by fold assignment.



human eosinophil neurotoxin

0

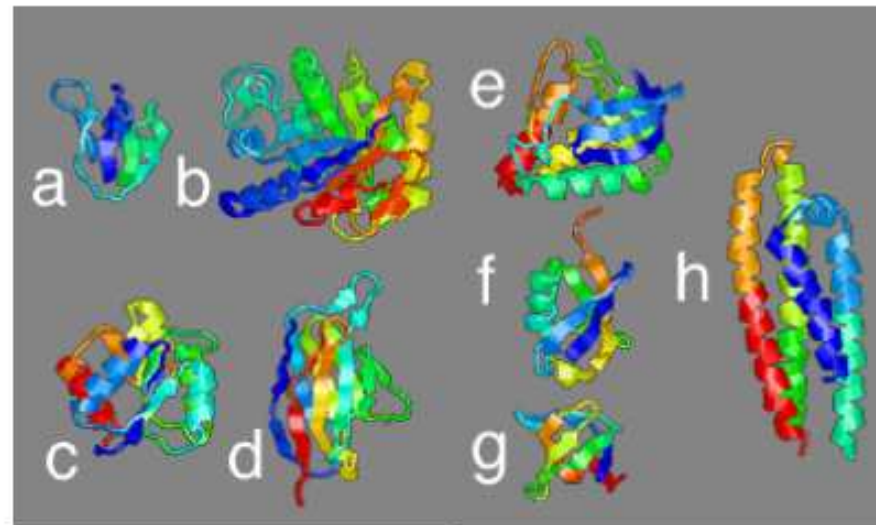


# Fold recognition / Threading

Find a compatible fold for a given sequence ....

```
>Protein XY
MSTLYEKLGGTTAVDLAV
DKFYERVLQDDRIKHFFA
DVDMAKQRAHQKAFITYA
FGGTDKYDGRYMREAHKE
LVENHGLNGEHFDAVAED
LLATLKEMGVPEDLIAEV
AAVAGAPAHKRDVLNQ
```

≈?



Number of protein folds that occurs in nature is limited. Fold Recognition can be used to:

- Identify templates for comparative modeling
- Assign Protein Function

## 5.2. Remote homology modeling = Fold Recognition

- Concept

- 3 families of methods.

(1) Sequence Profiles PSI-BLAST

Ref Dunbrack, Proteins (1999)

Suppl 3 : 81-87.

(very close to comparative modelling)

(2) Profile Searches  
or  
Fold Recognition with  
sequence-derived properties

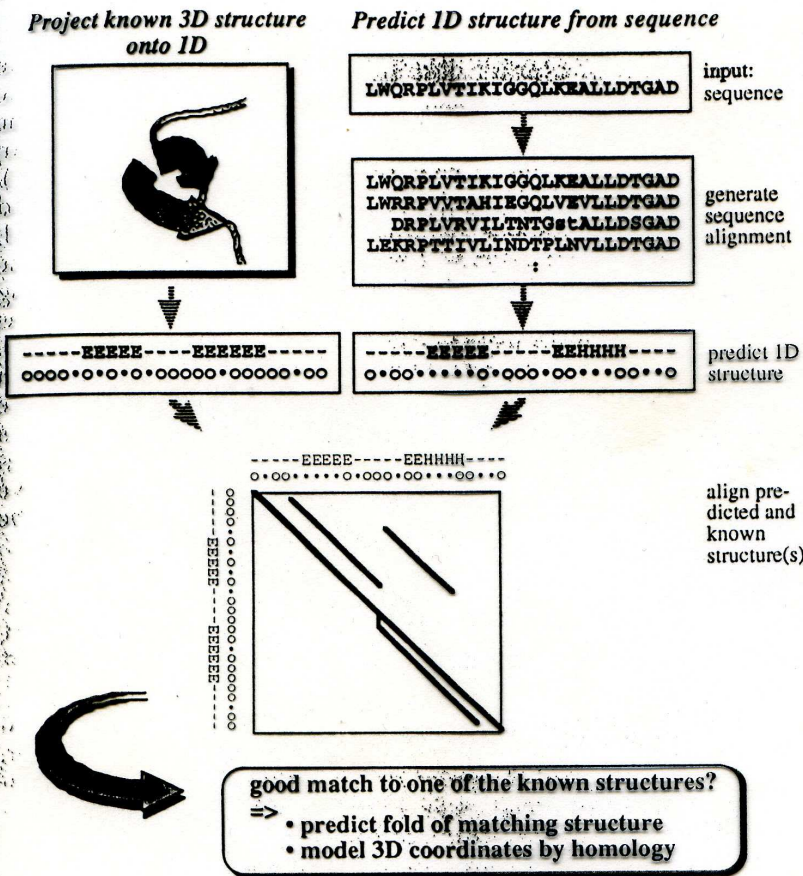
3D  $\xrightarrow{\text{projection}}$  1D

- align in seq space (NW)  
- Complex Substitution Matrices

(3) Threading = Fold Recognition

3D, - align in coord space  
- pairwise potentials of mean space.

Protein Fold Recognition by Prediction-based Threading



main factor limiting performance:  
- Sec. str. pattern degeneracy pb

**Figure 1.** Threading predicted 1D structure profiles into known 3D structures. (1) A multiple sequence alignment is generated for a given sequence of unknown structure (U). (2) The alignment profile of U is used as the input to a neural network system (PHD) that predicts secondary structure and relative solvent accessibility. (3) The resulting predicted 1D structure profile for U is aligned by dynamic programming (program MaxHom; Sander & Schneider, 1991) to 1D structure strings assigned from known structures by the program DSSP (Kabsch & Sander, 1983). Abbreviations: H, helix; E, strand; L, rest; ●, buried (<15% solvent accessible); ○, exposed (≥15% solvent accessible).

Free parameters for dynamic programming

The predicted strings were aligned based on a Smith-Waterman type dynamic programming algorithm (Smith & Waterman, 1981). This algorithm was implemented in the program MaxHom (Sander & Schneider, 1991; Schneider, 1994). The following free parameters had to be adjusted:

or a Blosum62 (Henikoff & Henikoff, 1992) exchange matrix:

$$M_{ij} = \alpha \times M_{ij}^{1D \text{ structure}} + (100 - \mu) \times M_{ij}^{\text{sequence}} \quad (1)$$

where  $M_{ij}$  determined the score for a match at a given position between state  $i$  in the first string and state  $j$  in the second string, and  $\mu = 0$  to 100 is the percentage of 1D structure contribution

Structure Prediction Meta Server Input Page  
0 jobs from .237.77.7.adsl.oebn.worldonline.dk in the last week

Your E-mail:

Target Name:

Amino Acid Sequence only (in one letter code):

Reset Clear Format Submit

Please submit domains separately  
Please remove coiled coil regions  
Check [LiveBench](#) for evaluation of the reliability of the servers  
Results are stored only for 2 months  
Jobs queued for more than 7 days for servers with queue>30 are skipped  
Use is limited to 10 jobs per week per domain  
Please contact us in case of problems with interpretation of results  
Please contact us if You plan larger analysis projects

Skip: Queue:

- PDB-Blast
- 3D-Jigsaw 1
- ESyPred3D
- ORFeus 1
- FFAS
- FFAS03
- Sam-T99 4
- Sam-T02
- SUPERFAMILY
- INBGU
- FUGUE2
- 3D-PSSM
- mGenTHREADER
- GenTHREADER
- RPFOLD
- jpred2 1
- psipred
- profsec
- Pcons2 2
- 3D-ShotGun
- 3D-Jury



But Threading most often does not ~~produce~~ assign the right fold.

Reasons : → The correct fold is not the first of the list but in the 10 top scoring folds  
(The correct fold appears to be detected in less than 40% of all benchmark cases)

→ Limited Number of known folds.  
(Ref. D. Fischer, D. Eisenberg)  
PNAS 1997 94: 11929.

→ Needs a very similar template structure

Concl : Looking into the function of the proteins that have been found can help.

(Ref. Murzin Proteins, Suppl 1 : 105-112, (1997))

→ **Errors in the scoring functions**

V. Arluison et al., J. Mol. Biol. (2002) 320, 705-712.

## La protéine HFq

HFq est une protéine conservée chez les bactéries

- Protéobacteries: subdivisions  $\alpha$ ,  $\beta$ , et  $\gamma$
- Firmicutes: groupes Bacillus et Clostridium
- Thermotogales
- Aquificales

### Alignement ProDom

	1					65		
HFQ_AQUAE-6-61	.....	QES	FLNTARKKRV	KUSVYLUNGV	RLQGRIRSF	LFTILLEDGK	QQTLYYKHA	TTI...
HFQ_THEMA-10-65	.....	QDR	FLMHLRUMKI	EUKVYLUNGF	QTKGFIRSF	SYTOLLESGM	QQSLIYKHA	STI...
HFQ_AZOCA-10-65	.....	QDT	FLMNVKRSKI	PLTIFLUNGV	KLQGVUTWFD	NFCULLRRDG	HSQLUYKHA	STI...
HFQ_CAUCR-10-65	.....	QDT	FLNSVVRKSKI	PLTIFLUNGV	KLQGVUSWFD	NFCULLRRDG	QSQLUYKHA	STI...
HFQ_BRUAB-9-64	.....	QDL	FLNSVVRKQKI	SLTIFLINGV	KLTGUTSFD	NFCULLRRDG	HSQLUYKHA	STI...
HFQ_RHILO-9-64	.....	QDL	FLNSVVRKSKM	PLTIFLINGV	KLTGUTSFD	NFCULLRRDG	HSQLUYKHA	STI...
HFQ_BACHD-5-62	.....	VMIQDH	FLNQLRKENI	PVTVELLNGF	QLRGLVKGFD	NFTVILETEG	KQQLUYKHA	ST...
HFQ_BACSV-4-61	.....	INIQQD	FLNQIRKENT	YUTVELLNGF	QLRGQVKGFD	NFTVILESEG	KQQLIYKHA	ST...
HFQ_CLOAB-10-66	.....	QDI	FLNSARKKKI	PVAIHLTNGF	QMRGSVKGFD	SFTVILESDG	KQMMIYKHA	STIT...
HFQ_ECOLI-7-61	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	USQMVYKHA	STV...
HFQ_ERWCA-8-62	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	USQMVYKHA	STV...
HFQ_YEREN-7-61	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGGVESFD	QFVILLKMT	USQMVYKHA	STV...
HFQ_HAEIN-7-61	.....	QDP	YLNALRRERI	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	UNQMVYKHA	STV...
HFQ_PASMU-7-61	.....	QDP	YLNALRRERI	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	UNQMVYKHA	STV...
HFQ_VIBCH-8-62	.....	QDP	FLNALRRERI	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	UNQMVYKHA	STV...
HFQ_PSEAE-8-62	.....	QDP	YLNALRRERI	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	UNQMVYKHA	STV...
HFQ_XYLF-8-62	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	USQMVYKHA	STV...
HFQ_SALTY-7-61	.....	QDP	FLKPLRRERV	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	USQMVYKHA	STV...
HFQ_MEIMA-9-64	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGGVESFD	QYVILLRMTS	UTQMVYKHA	STI...
HFQ_ECOLI-7-61	.....	QDP	FLNALRRERV	PVS IYLUNG I	KLQGG IESFD	QFVILLKMT	USQMVYKHA	STV...
<b>CONSENSUS</b>	.....	QD-	%QD--R-e--	PV-!%LVNG!	k-qG-!-sFD	q8-!!!L----	--qm!YKHA	ST!

- Blast PDB

- PSI-Blast SwissProt

  - Hfq

  - Sm proteins

Sm<sub>1</sub> motif

Sm<sub>2</sub> motif

query Sm proteins

5<sup>th</sup> iteration hfg E-value of 0.1  
(only Sm<sub>1</sub> domain)

query hfg

Sm not detected. **E-value > 1**

Sm - hfg relationship?

- Hfq is hexameric, Sm are heptameric
- Proteins involved in N-terminal acetylation have Sm<sub>1</sub> and Sm<sub>2</sub> motifs, yet no functional relationship.

- Blast Prodom, Pfam, Prosite

# Identification de la topologie de HFq

Topologies prédites par des méthodes de reconnaissance de “fold”  
(Topits, 3D-PSSM, GenThreader, 123D, Méthode de Fischer)

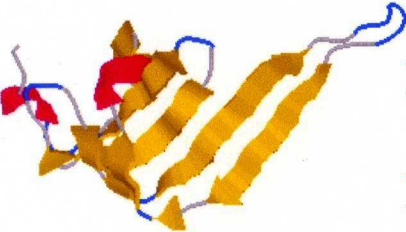
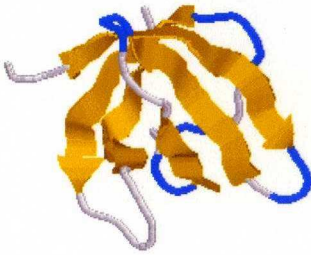

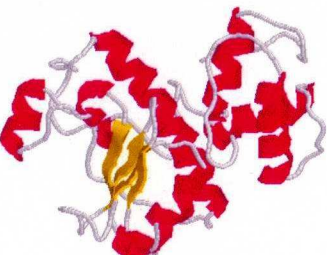
	Code PDB (type de protéine)	% identité avec HFq	
 <p>Topologie Sm</p>	1B34b (Sm)	19	<p>Topologie CspA</p> 
	1B34a (Sm)	10	
	1D3b (Sm)	8	
	1MJC (CspA)	22	
 <p>Topologie Arc</p>	1AOY (Arc)	22	 <p>Topologie 1LBU</p>
	1LBU (peptidase)	11	

Table 1. The predicted topologies of the three Hfq proteins using fold-recognition methods

PDB entry	<i>E. coli</i> Hfq	<i>A. aeolicus</i> Hfq	<i>A. caulinodans</i> Hfq
1B34b (Sm)	3 (0.1, 19)	2 (1.6, 19)	2 (0.5, 16)
1B34a (Sm)	2 (1.4, 10)	1 (0.7, 20)	1 (0.6, 18)
1D3b (Sm)	1 (0.8, 8)	2 (1.3, 13)	3 (0.8, 10)
1MJC (CspA)	2 (1.1, 22)	3 (3.0, 17)	3 (4.0, 20)
1AOY (Arc)	1 (4.7, 22)	0	1 (4.5, 24)
1DIV (L9)	0	1 (1.5, 15)	1 (0.6, 18)
1LBU (peptidase)	1 (1.3, 11)	0	0

Each suggested fold, defined by its PDB entry number, is characterised by three values. The first value is the number of times the fold is suggested in the top positions. The *E*-value and the percentage of identity between each Hfq protein and the fold identified are then given in parentheses.

## HFq semble être une protéine Sm-like

**1. HFq présente des similarités fonctionnelles avec les protéines Sm: elles sont impliquées dans le métabolisme de l'ARNm**

### Protéine Sm:

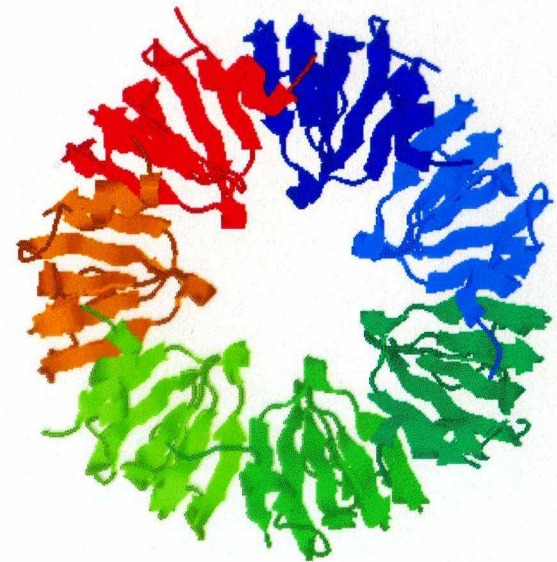
**Composant du spliceosome eucaryote impliqué dans l'épissage des ARNm**

**Protéines retrouvées également chez les archaebactéries**

Protéine heptamérique (homo- ou hétéroheptamère)

Forme un anneau avec un trou central (EM)

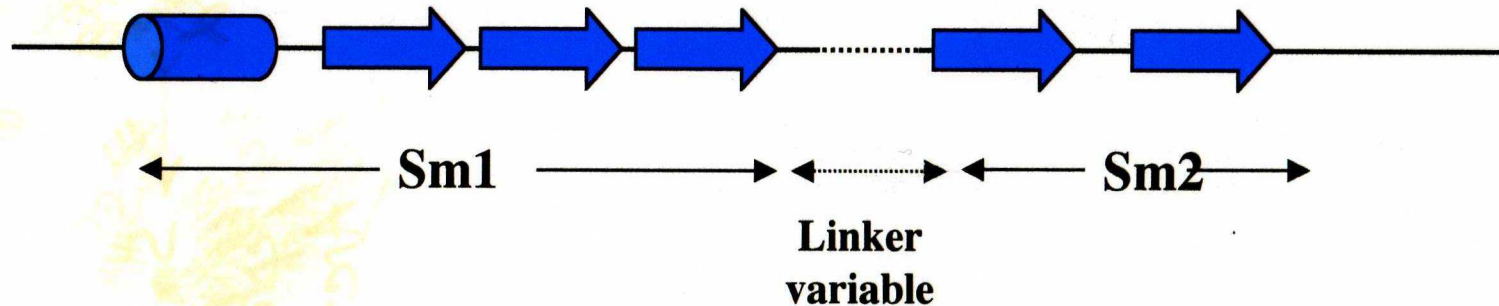
Essentiellement structurée en feuillet  $\beta$



## 2a La prédiction de structure secondaire est en accord avec une topologie Sm

PHD et PSIPRED

	10	20	30	40	50	60	70	80	90	100
AA:	AKGQSLQDPFLNALRRERVPVSIYLVNGIKLQGQIESFDQFVILLKNTVVSQMTYKHAISTVTPSRPTSHHSNNAGGGTSSNYHHGSSAQNTSAQQDSEETE									
PSI :	9888730788999876572589999738887679998601899997898279995201014788632331578777777653652677886546644579									
rel :	HHHHHHHHH EEEEEEE EEEEEEEEE EEEEE EEEEE HEE									
PHD :	HHHHHHHHH EEEEE EEEEEEEEE EEEEE EEEEEEEEEEE									
rel :	999987819988997448936999832634799997423379999739916998831389834874212699999999999999887787775667899									



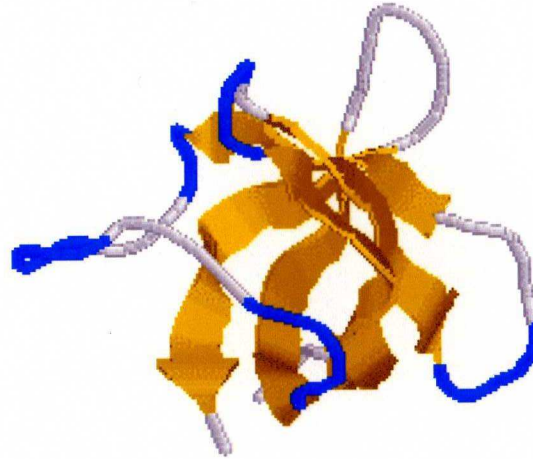
2b Infrared Spectroscopy (FTIR)  
UV-CD spectrum analysis.

37 ( $\pm 3$ )%  $\beta$   $\rightarrow$  Sm  
15 ( $\pm 3$ )%  $\alpha$   
~~Peptidase~~  
~~Arc~~

$\hookrightarrow$  CspA remains



**3. HFq ne présente pas la signature du domaine “cold shock” de CspA  
(code Prosite PS00352)**



Proteins has  
true positives and  
false positives

**Incertitudes:**

- ➡ Sm1 n'est pas détecté dans toutes les HFq
  - ➡ Sm2 n'est jamais détecté
  - ➡ Il existe des protéines qui présentent Sm1 et Sm2 qui ne sont pas des protéines Sm (Acetyltransferase NatC de levure)
- %  $\beta$  et  $\alpha$  compatible avec topologie CspA

## Modélisation de la structure de HFq

La modélisation moléculaire a été effectuée avec une protéine matrice Sm humaine

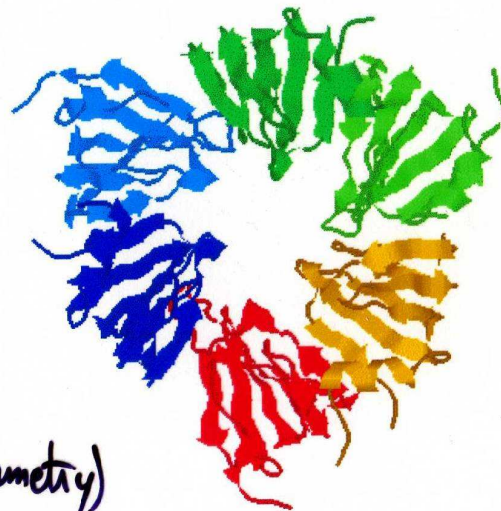
(~~1D3B~~, structure résolue sous forme hexamérique)  
1B34

*Swiss model + .....*

~~Sm 1D3B:~~

1B34

trimer of dimer  
(pseudo 6-fold symmetry)



8% seq identity  
with Hfq from E. coli

# Alignement entre HFq et les protéines Sm

❖ Crucial pour la génération du modèle

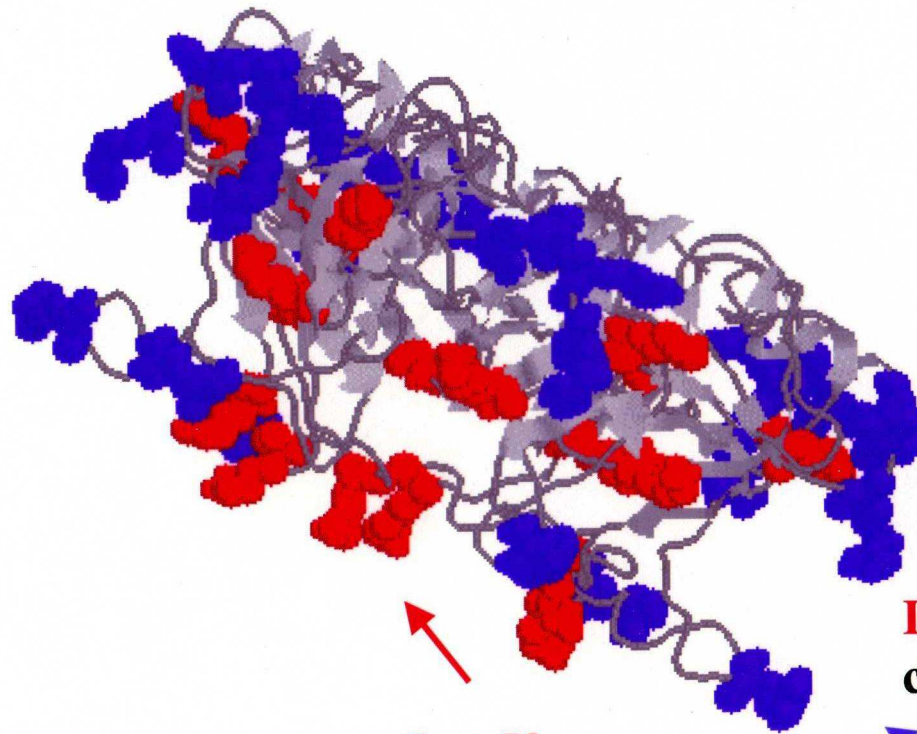
**Problème: Sm2 peu conservé et linker de taille variable**

**2 alignements possibles**

**1<sup>er</sup> alignement**

```
mAkgQSLQDPFLNALRRERVPVSIYLVV[ ]IKLQ[ ]QIESFID[ ]V- ILLKNTVSNVYKHAIS TWVPSRPVSHSNAGGGTSSNYHHGSSAQNTSAQ... E. coli HFq
<----- Sm 1 -----><----- LINKER -----><----- Sm 2 ----->
--HTVGKSSKHLQHDYRM--RC ILQD[R]IFI[ ]TFKAFD[ ]K[ ]L ILCDCDEFKIKPKNS --KQAEREKRVLGLVLL[ ]R[ ]ENLVSMTVEGPPP... 103B-human SmB
- h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
----MKLVRFLMKLSHETV--TIELK[ ]TQWH[ ]TIIGV[ ]VS[ ]H[ ]HLKAVKHTLKN-----REP VQLETLSI[ ]R[ ]NNIRYFILPDSL... 1B34-human SmD1
- h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
EFNTGPLSVLTQSVKNN[ ]QV--LINC[R]NKLL[ ]RVKAFD[ ]R[ ]C[ ]VLENVKENwtevp[ ]eksgk[ ]kkk[ ]kpvnkDRYISKMFL[ ]R[ ]DSVIWLRNPLIAGK 1B34-human SmD2
- h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
--MSIGVPIKVLHEAEGHIY--TCETNT[ ]EYR[ ]L IEA[ ]DN[ ]C[ ]MSNITVTYRD-----GRVAQLEQVYI[ ]R[ ]CKIRFLILPDK... 103B-human SmD3
- h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
```

## Structure résultant du premier alignement:



Lys 53

**Problème:**  
Lys 53 et Arg 63 non protégées  
contre la trypsine

Arg 63

*Linbaer*

# Alignement entre HFq et les protéines Sm

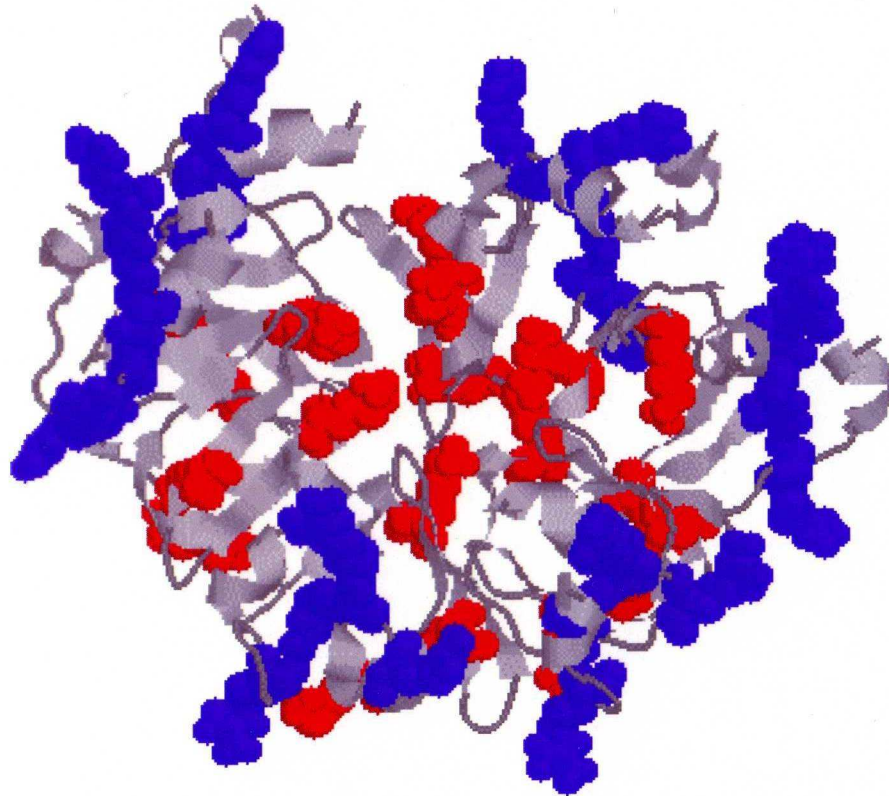
## Crucial pour la génération du modèle

### 2<sup>ème</sup> alignement

➔ tient compte aussi de la prédiction de structure secondaire de HFq

```
mAKGQSLQDPFLNALRRER--VPYSIYLVNGIKLQDIIESFDQIVILLKN-----TVSQHWYHAISTWPSRIVSH... E. coli HFq
<----- Sm 1 -----><----- LINKER -----><----- Sm 2 ----->
----NPPRPLDVLNRSLK--SPYIVRLKGRREFRITLDGYDINMLVLLDA----EEIQNGEVWRK-----VGSVVIIDTWVFSPAFGGE  archaeal AF-Sm1
  - h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
----NTYVKSSKNLQHID--YRMRCILQDRIFITFKAFDQINMLILCDC----DEFRIKPKNSKQAEEREKRVLGLVLLDENLVSNTVEGPPP... 103B-human Sm8
  - h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
-----MKLVRFLMKLSH--ETVTIELKNGTQVHITITGVQVSMNTHLKAVK---MTLKNREP VQ-----LETLSTANNIRYFILDSLP... 1B34-human SmD1
  - h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
----EFNTGPLSVLTQSVKNNTQVLINCRINKKLLRVKAFDRICNMVLENVKEHwtvpeksqgkklkkskpwk-DRYISKNFLSDSVIWLRLI... 1B34-human SmD2
  - h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
----MSIGVPIKVLHEAEG--HIYTCETNTGEVYRQLIEADNMNCOMSNIT---VTYRDGRVAQ-----LEQVYIISKIRFLILPDMLK... 103B-human SmD3
  - h1 - - b1 - - b2 - - b3 - - b4 - - b5 -
```

## Structure résultant du deuxième alignement:



**Lys** et **Arg** protégées contre la trypsine

**26 aa C-terminaux non modélisés:**

Pas d'identité de séquence avec d'autres protéines

Région de faible complexité

Région flexible (coil prédit par PHD et PSIPRED)

# **Refinement by energy minimization and short MD simulations in aqueous solution**

# Detection of Errors

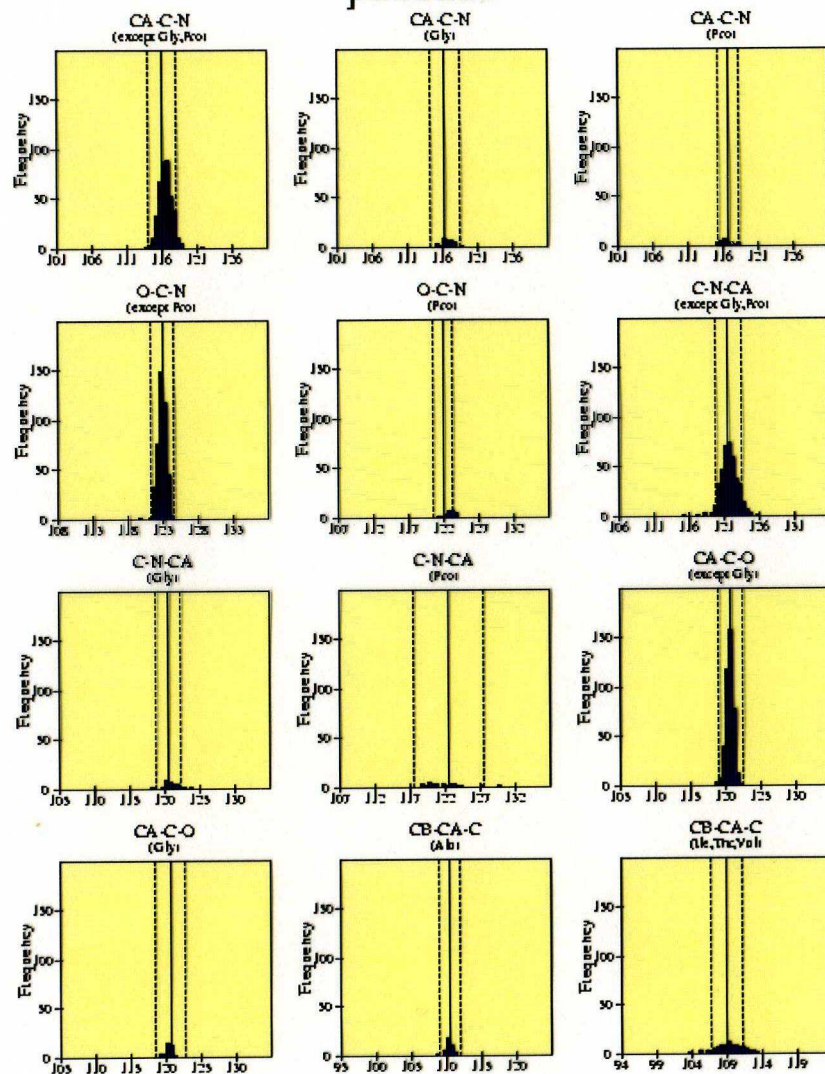
First check should include a stereochemical check on the modeled structure—PROCHECK, WHATCHECK, DISTAN— which will show deviations from normal bond lengths, dihedrals, etc.

Visualization— follow the backbone trace and then subsequently move out to  $C\alpha$ - $C\beta$  orientation.



## Main-chain bond angles

pdb1ad3



Black bars &gt; 2.0 st. devs. from mean.

Solid and dashed lines represent the mean and standard deviation values as per Engh &amp; Huber small-molecule data.

pdb1ad3\_02.ps

## PROCHECK

<http://www.biochem.ucl.ac.uk/~roman/procheck/procheck.html>

Verification of Ramachandran plot  
(allowed and forbidden regions)

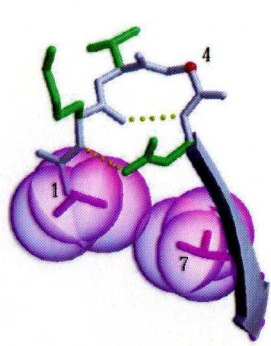
Comp with X-ray (2002), 1.5 Å RMSD

**Free modelling: De novo or ab initio**

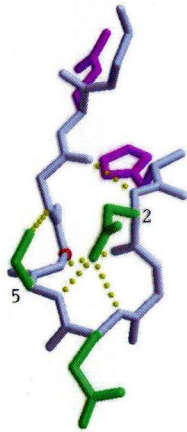
**We focus here on fragment assembly approach**

# Protein Structure Prediction: Rosetta

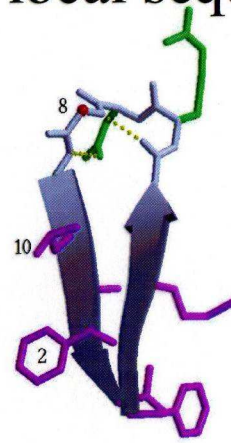
I-sites Library = a catalog of local sequence-structure correlations



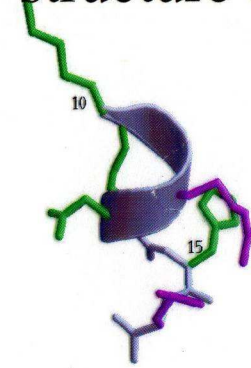
**diverging type-2 turn**



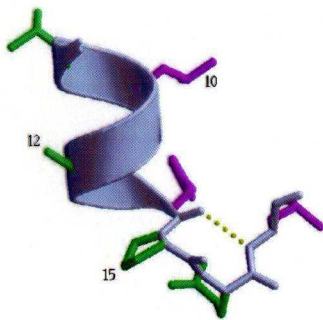
**Serine hairpin**



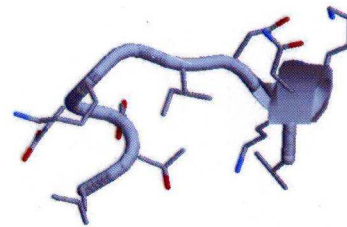
**Type-I hairpin**



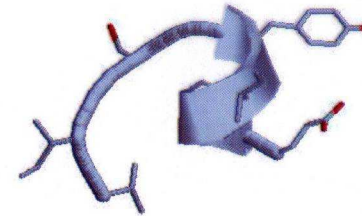
**Frayed helix**



**Proline helix C-cap**



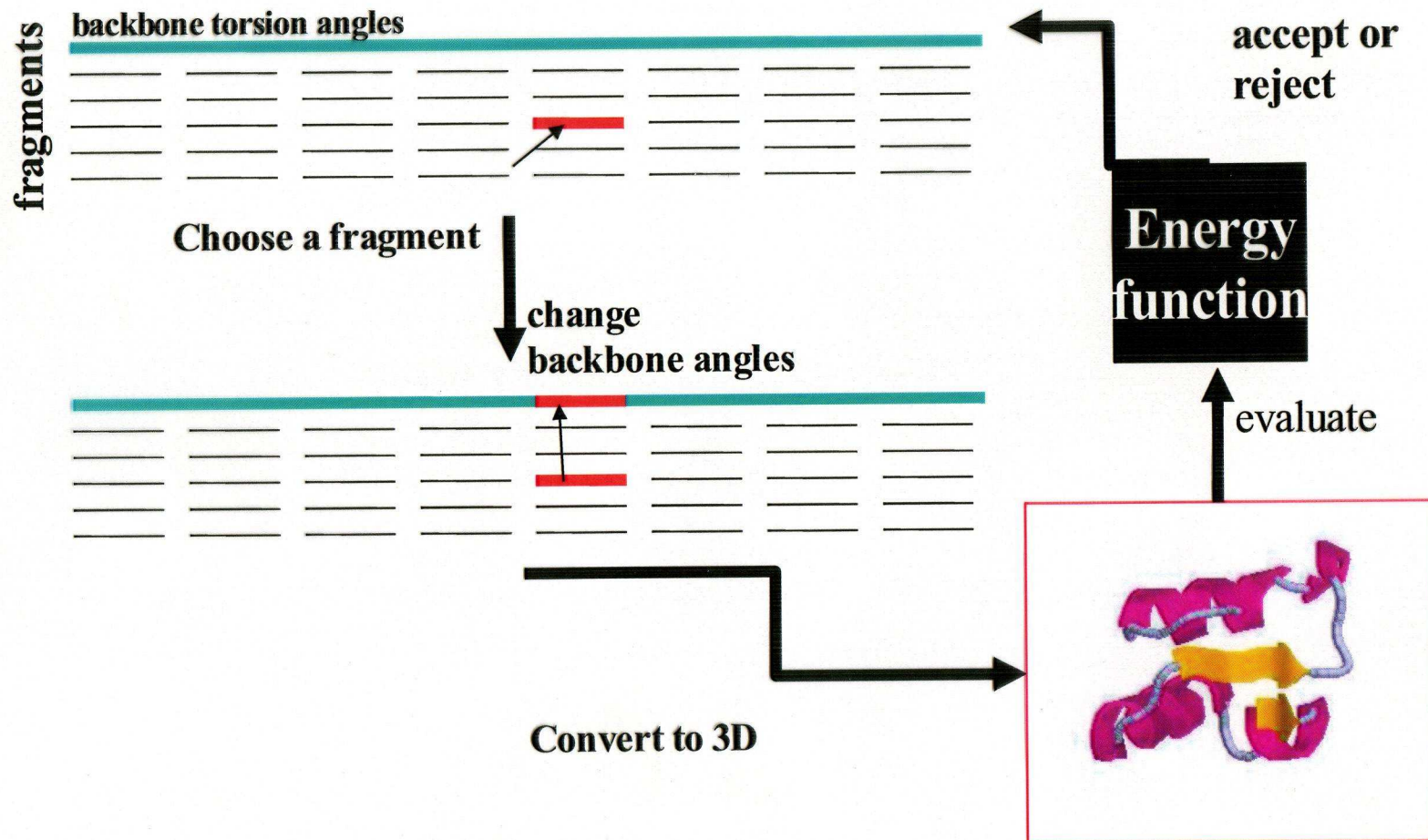
**alpha-alpha corner**



**glycine helix N-cap**

**Local  
structure  
e motifs**

# Rosetta: a folding simulation program



Fragment insertion Monte Carlo

# Monte Carlo: Metropolis criterion.

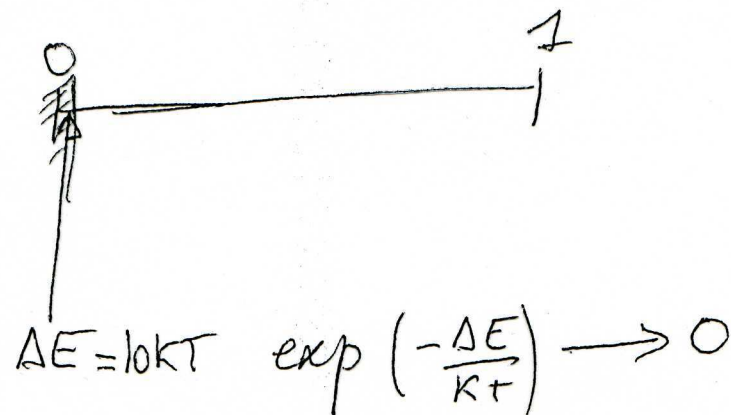
$$X \rightarrow E$$

$$X' \rightarrow E'$$

$$\exp \frac{-\Delta E}{k_B T} = \frac{\exp(-E')}{\exp(-E)}$$

•  $\Delta E < 0$  Always Accept

•  $\Delta E > 0$  Accept with  $p = \exp \frac{-\Delta E}{k_B T}$   
or  
 $r \in [0, 1]$  )  $r < \exp \left( \frac{-\Delta E}{k_B T} \right)$

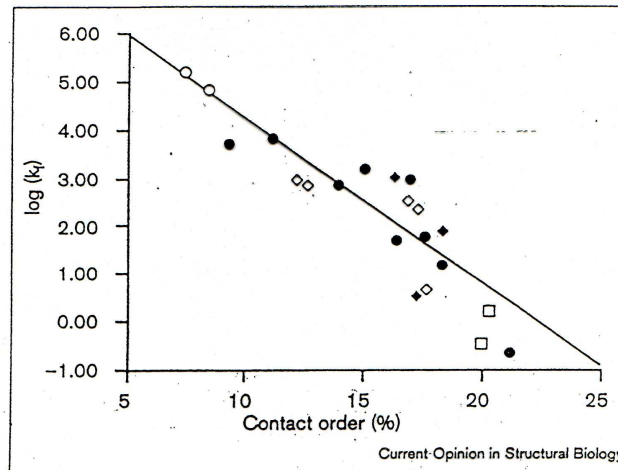


## Rosetta (Baker) in CASP4

Improvements of the method.

- Combine alternative 2D prediction methods (PSIPRED, SAMT99, PHD) to bias the fragment picking method.
- Filters to eliminate non protein-like structures
  - a. poorly formed  $\beta$ -sheets
  - b. poorly packed interiors  
using LJ, Hb and solvation terms
  - c. low contact orders.

Plaxco et al. J. Mol. Biol. 277, 985-994 (1998)



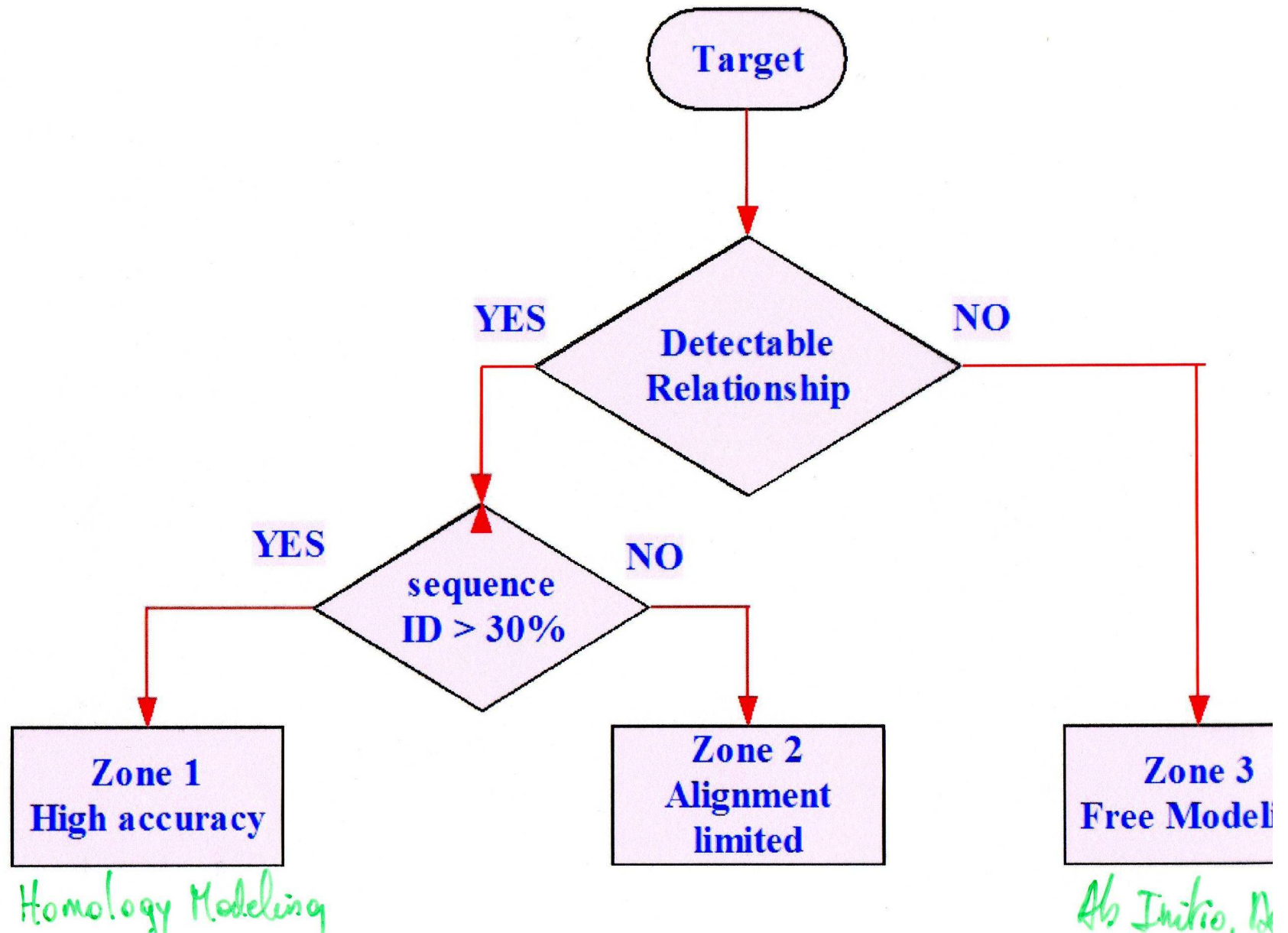
Updated correlation between contact order and the logarithm of the folding rate ( $\log(k_f)$ ). Contact order is defined as the average sequence separation between residues that make contact in the native structure divided by the sequence length [13\*\*]. Thus, a contact order of 10% indicates that residue pairs that make contact in the three-dimensional structure are separated by 10% of the length of the protein on average. Circles represent all-helical proteins, squares represent sheet proteins and diamonds represent proteins comprised of both helix and sheet structures. Open points represent proteins characterized after the publication of [13\*\*]. The best-fit line for the original 12-protein data set (filled points) is shown.

$$\% C_o = \frac{100}{LN} \sum \Delta S_{ij} \quad \begin{array}{l} L = \text{length AA, normalization factor} \\ N = \text{number of native contacts} \end{array}$$

- Clustering of conformations generated independently for several homologs.

→ In most cases, the largest 5 unique clusters were submitted.

# CASP 7 Conclusions.

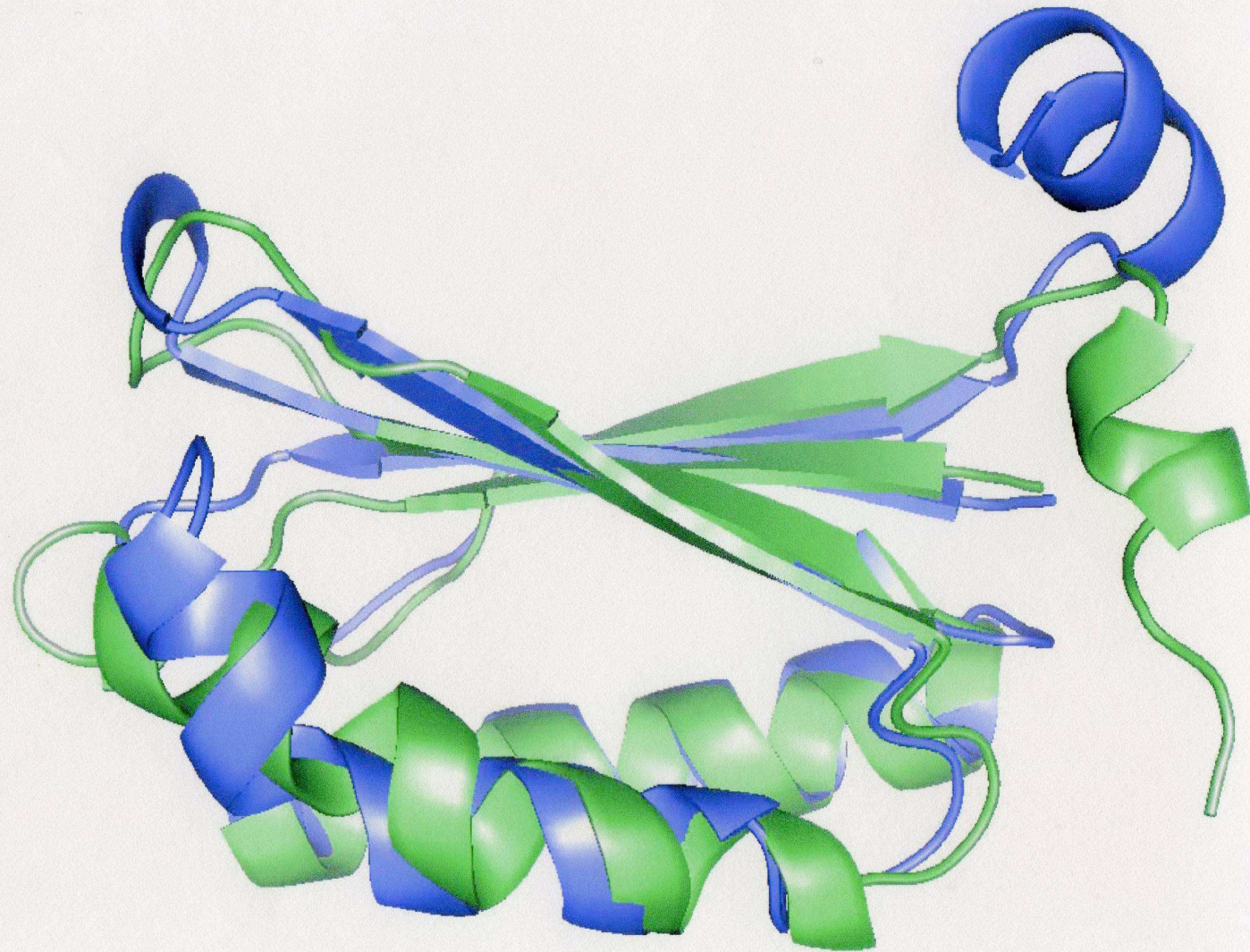




Zone 1: Good models, but not as good as high Resolution models.



Ex. Zone 2



prosub      AGKSNGEKKYIVGFKQTMSTMSAAKK-KDVISEKGGK---VQ-KQFKY---VDAASATLN  
                      //  //  //          //  //  //          //  //  //          //  //  //  
2fxb      .....PKYTIVDKETCIACGACGAAAPDIYDYDEDGIAYVTLDDNQGIVEVPDILIDDM  
                      EEE                  HHHH          EEEE          EEEE                  HHHH

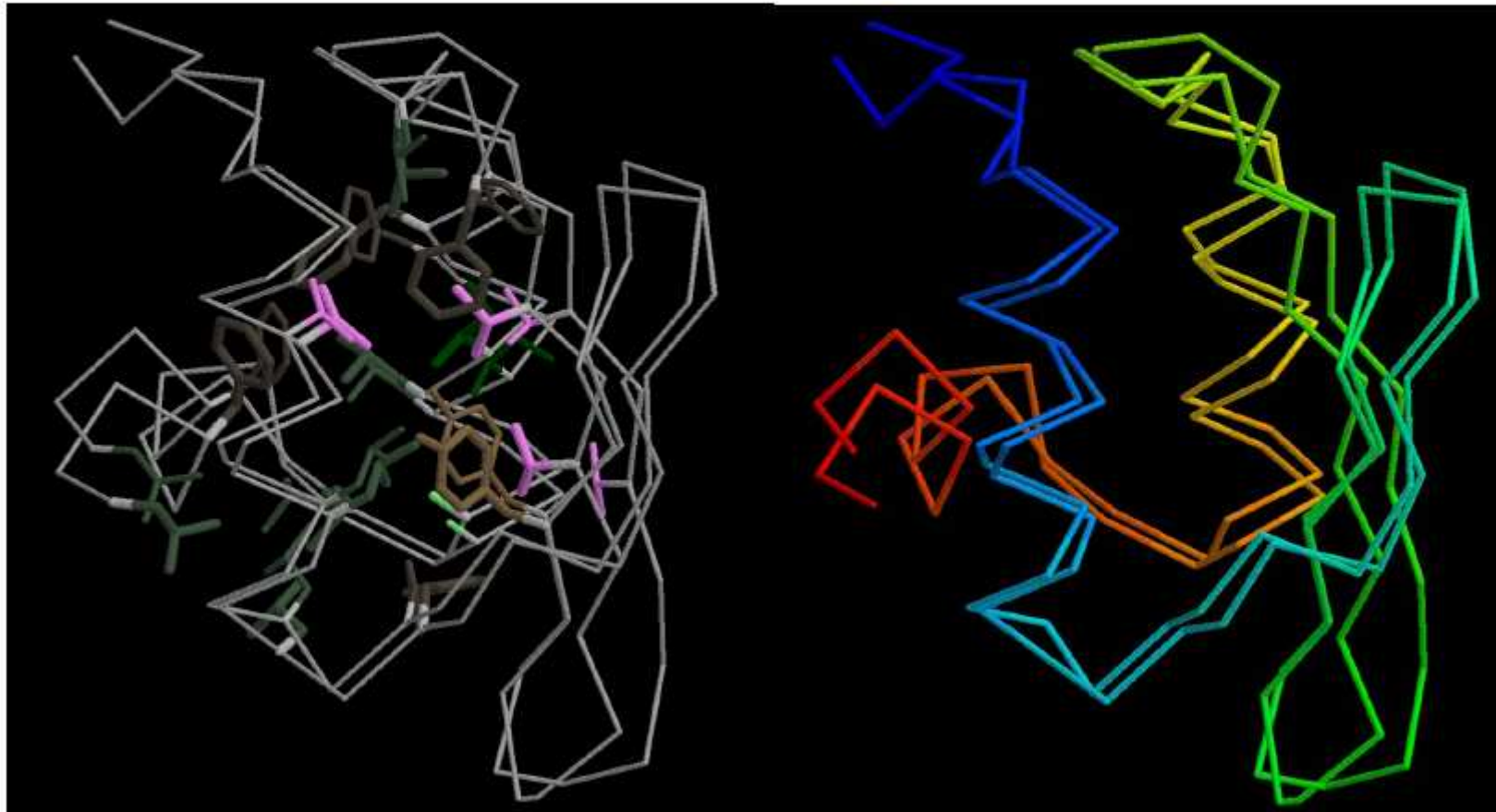
prosub      EKAVKFLKKDPSVAYVEEDHVAHAY....  
                  //  //  //  //  //  //  //          //  //  //  
2fxb      MØAFEGCPTD--SIKVADEPFDGDPNKFE  
                  HHHHHT                  EEE

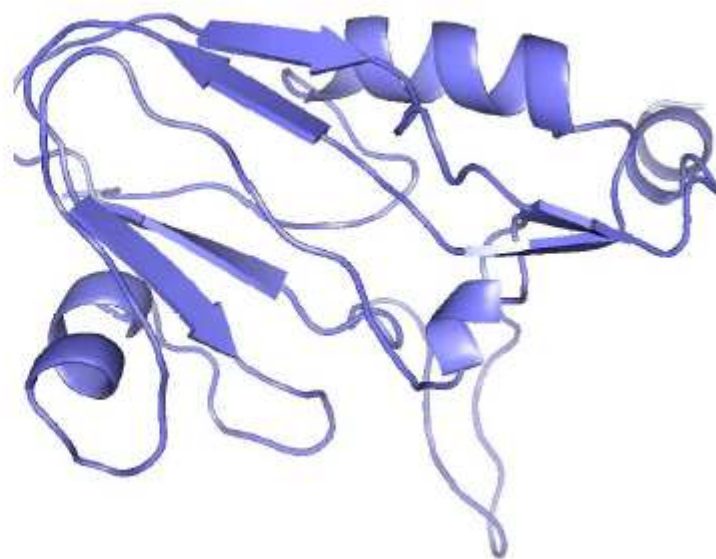
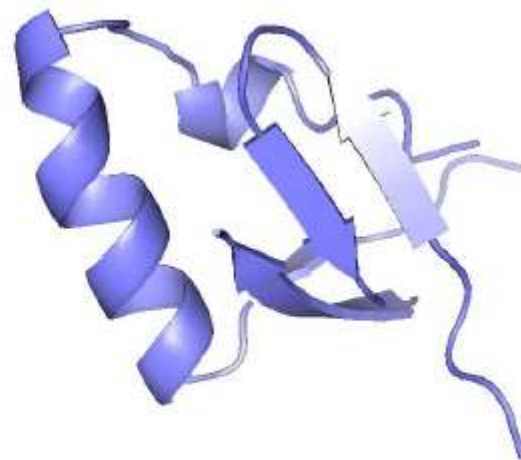
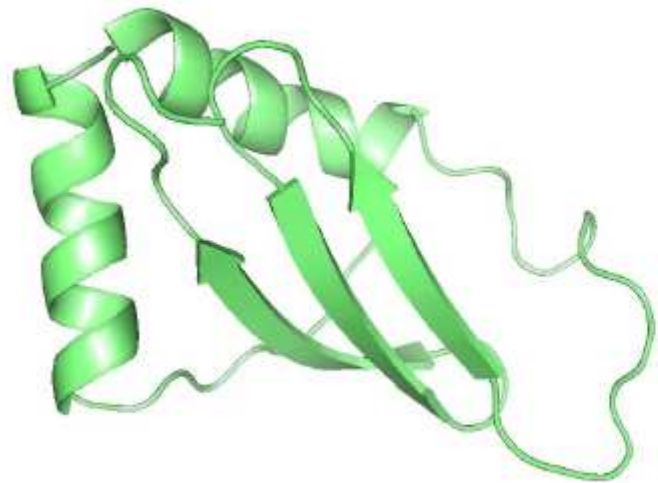
# Zone 2 Conclusions

- Approximate models, but never-the-less valuable.
- Alignment has improved, but still a way to go.
- Further improvement probably requires an all atom description and refinement.
- 'Free modeling' needed for non-template parts.

### ZONE 3

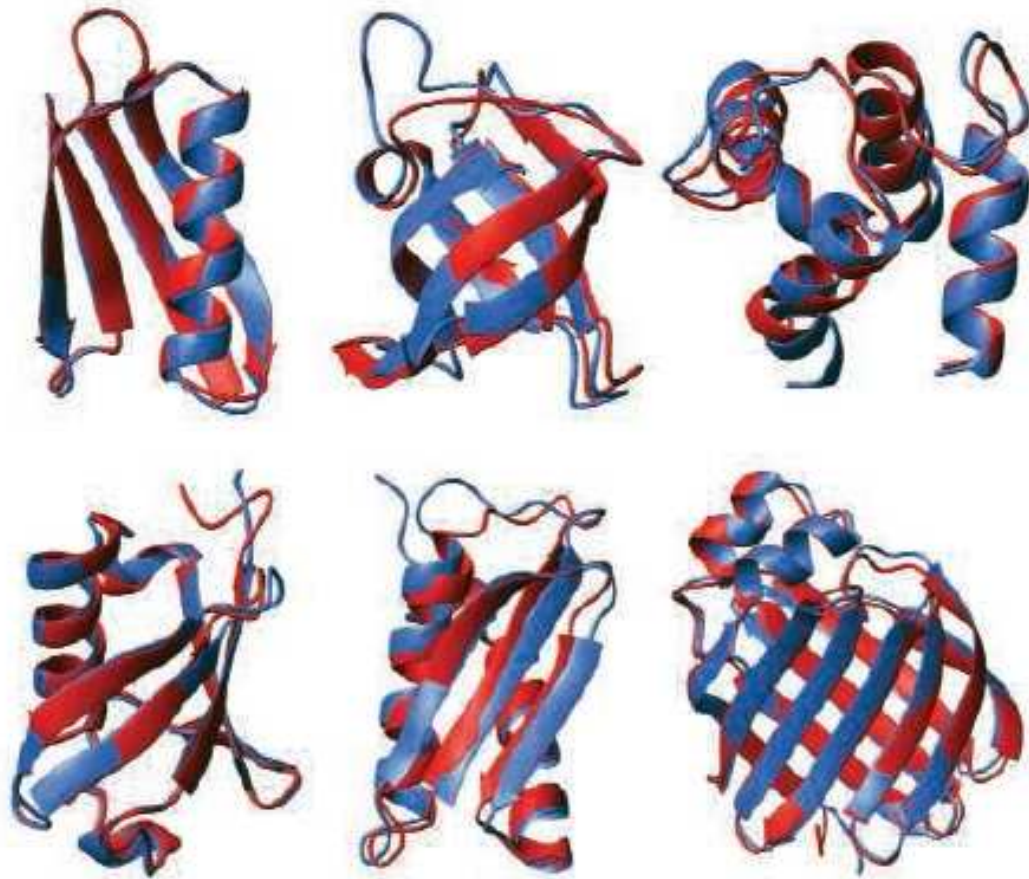
T0281 *ab initio* prediction (1.59Å)





# Zone 3 Conclusions

- A lot of progress over the CASPs.
- A long way to go still.
- Knowledge integration, multiple trajectories key.
- Discrimination remains a bottleneck.
- All atom description and refinement probably necessary.



**Tight fit.** Adding data from nuclear magnetic resonance experiments improves the accuracy of computer models of how proteins fold.