

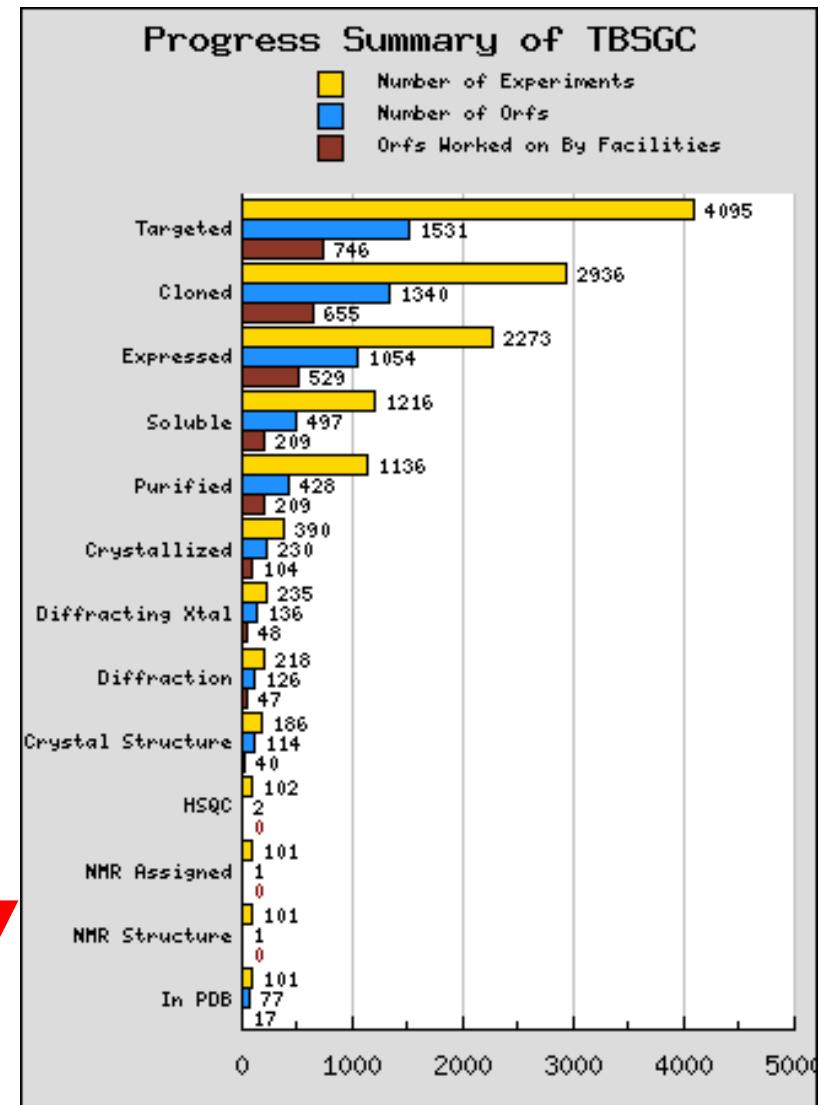
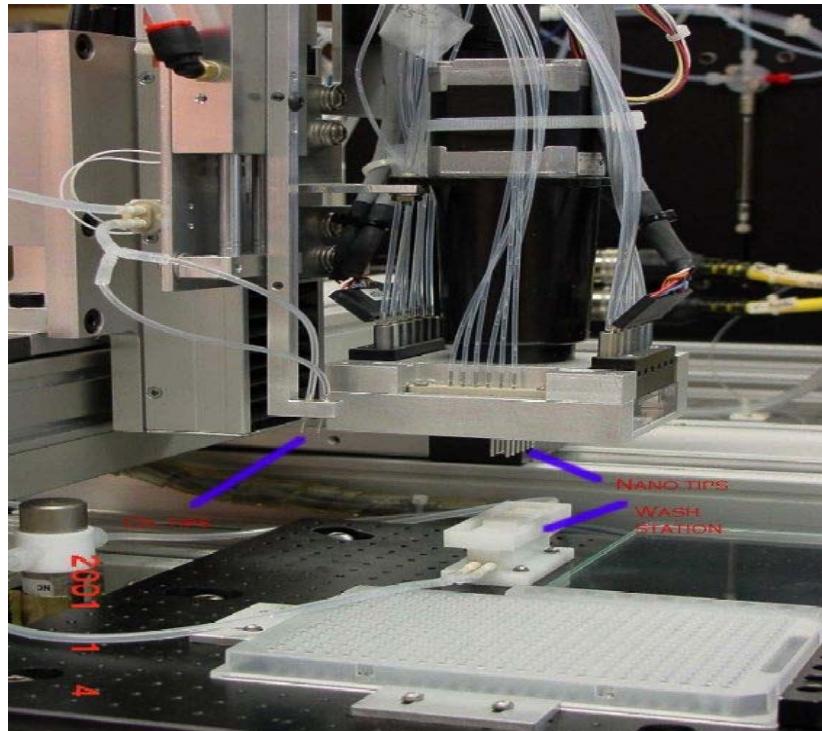
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## Estructura de Proteínas

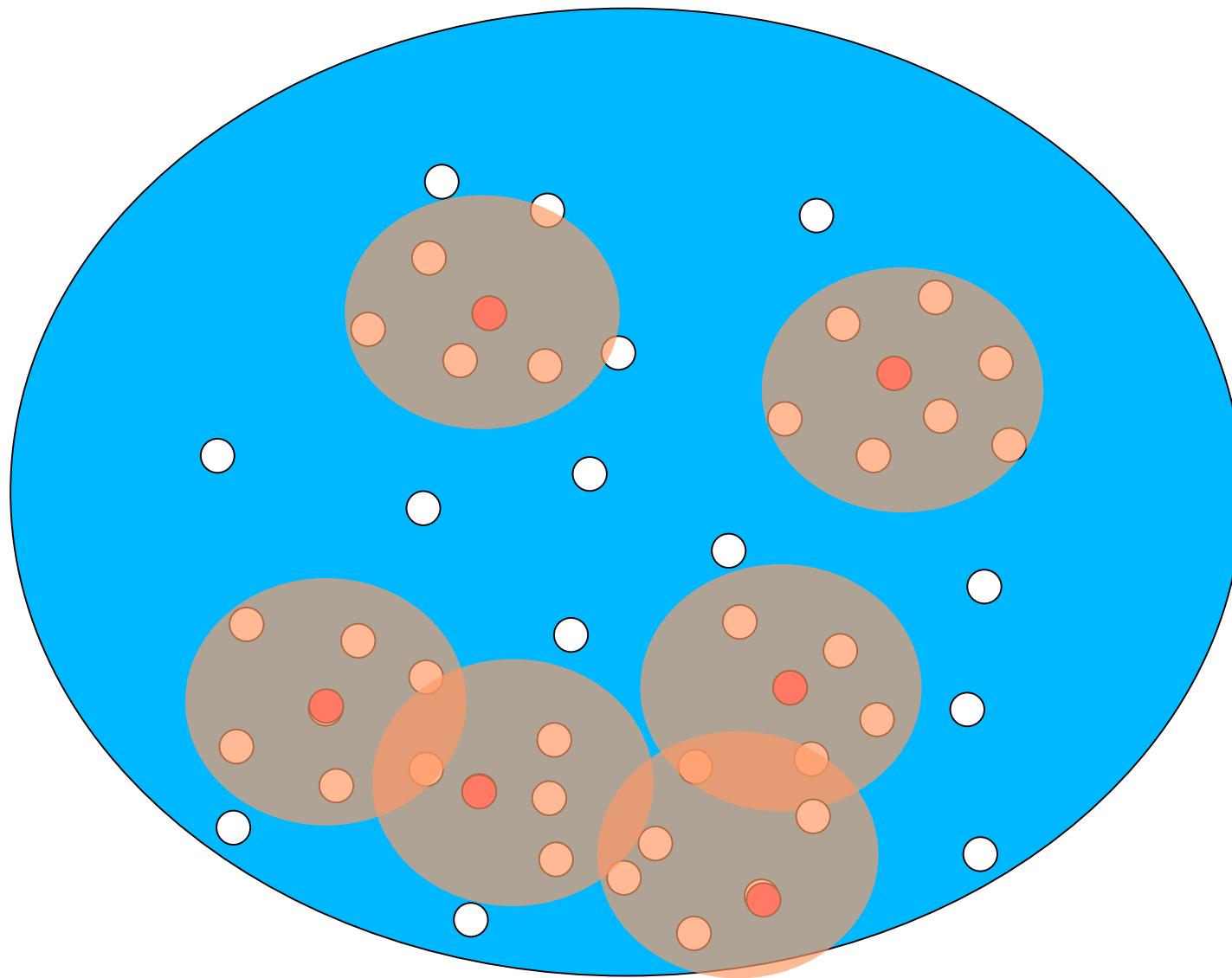
# Predicción de Estructura Tridimensional de Proteínas

Florencio Pazos (CNB-CSIC)

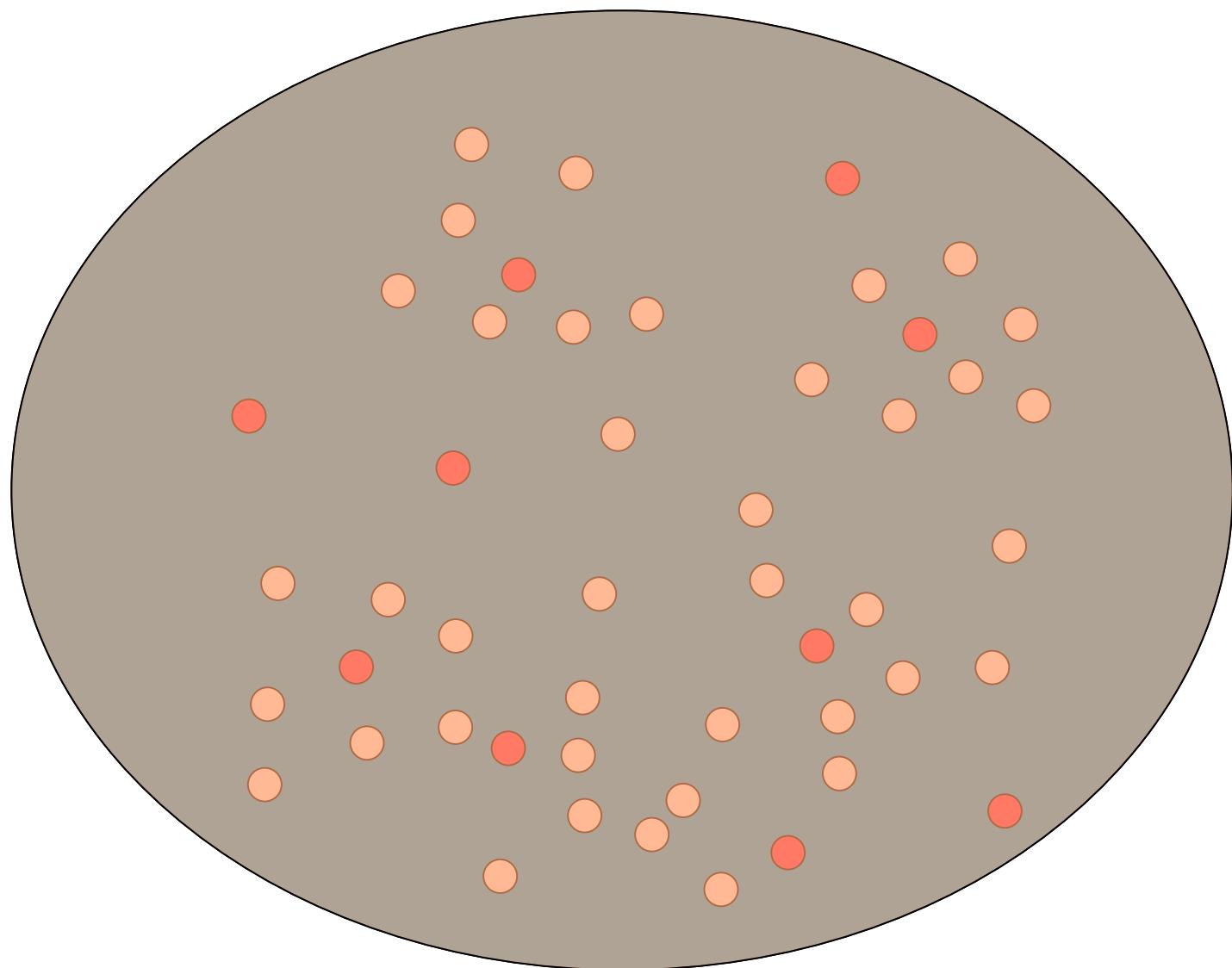
# Genómica Estructural



# Genómica estructural y predicción de estructura

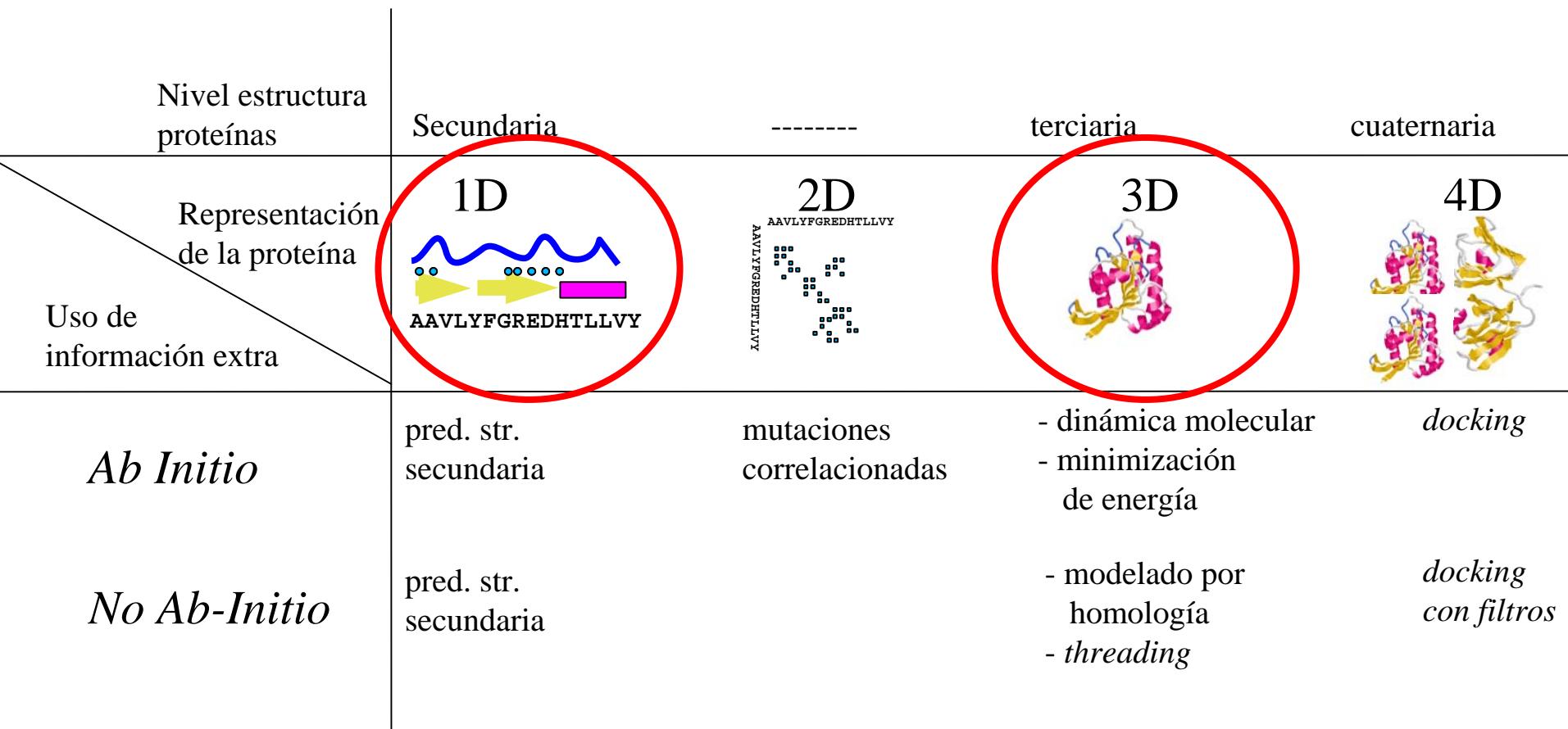


# Genómica estructural y predicción de estructura



# Predicción de estructura de proteínas

## Clasificación de los métodos de predicción



# Predicción de Estructura de Proteínas

## Métodos 3D

- *Ab initio*
- Diseño por homología/Modelado comparativo.
- Reconocimiento de plegamiento/  
diseño por homología remota/*threading*

## *Ab Initio*

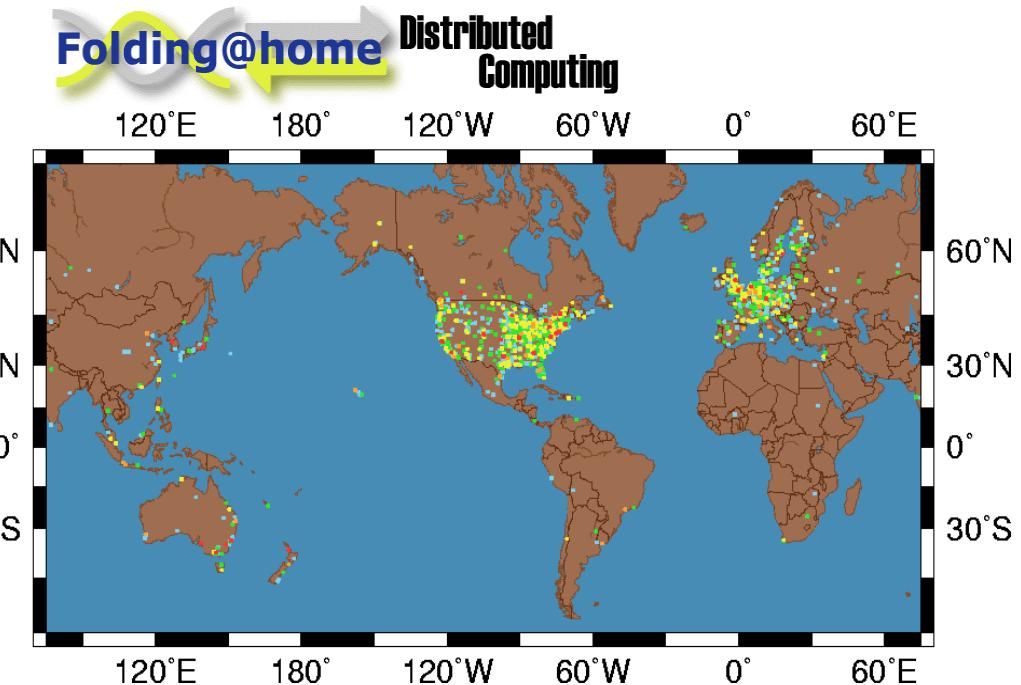
Basados en principios físico/químicos básicos (potenciales de interacción, ...).

Solo usan la secuencia primaria como entrada.

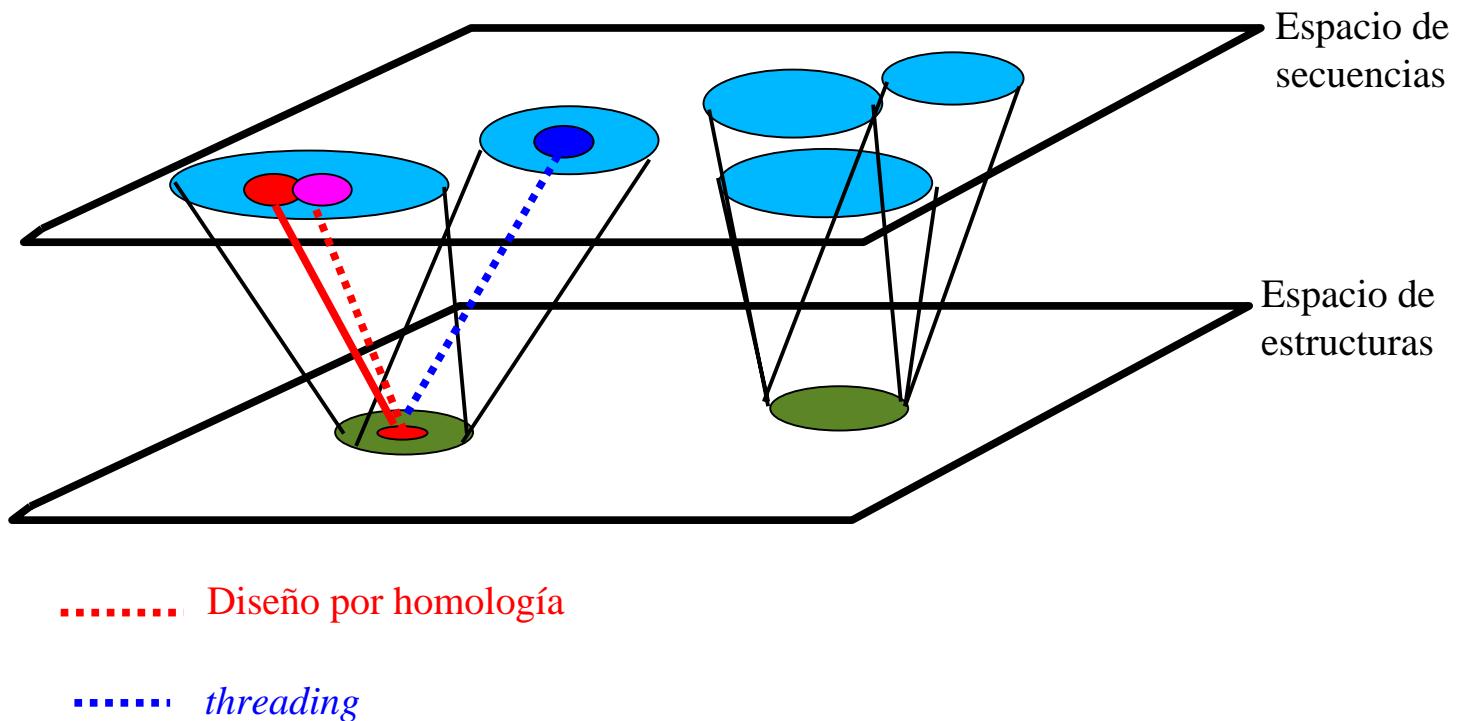
Interesantes pues son los que más conocimiento aportan sobre el proceso de plegamiento.

No usables aún (en general) para predicción 3D por

- Potenciales empíricos y semiempíricos con pequeñas inexactitudes que se acumulan para proteínas grandes y/o simulaciones largas.
- Requieren muchísima potencia de cálculo.

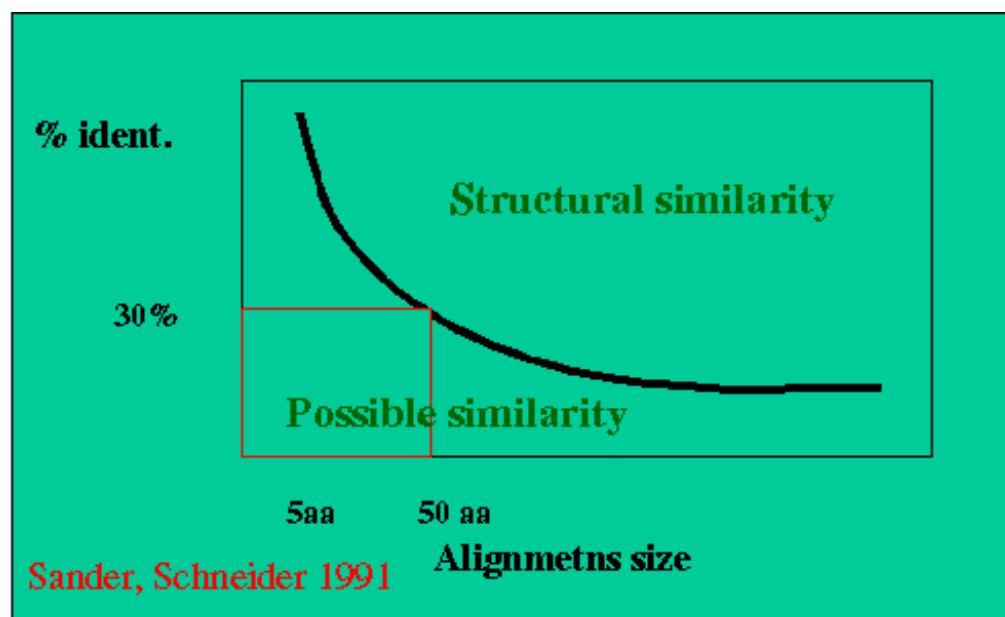
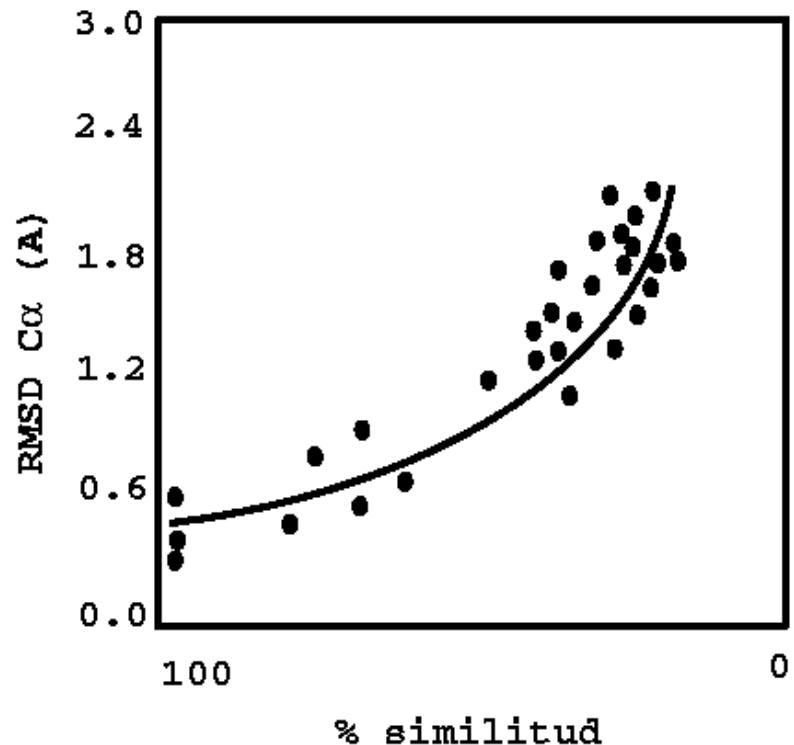


# Modelado por Homología vs. *Threading*



# Modelado por homología

Relación entre parecido estructural y parecido en secuencia



Chothia, C. & Lesk, A.M. (1986) The relation between the divergence of sequence and structure in proteins. *EMBO J.*, **5**, 823-826.

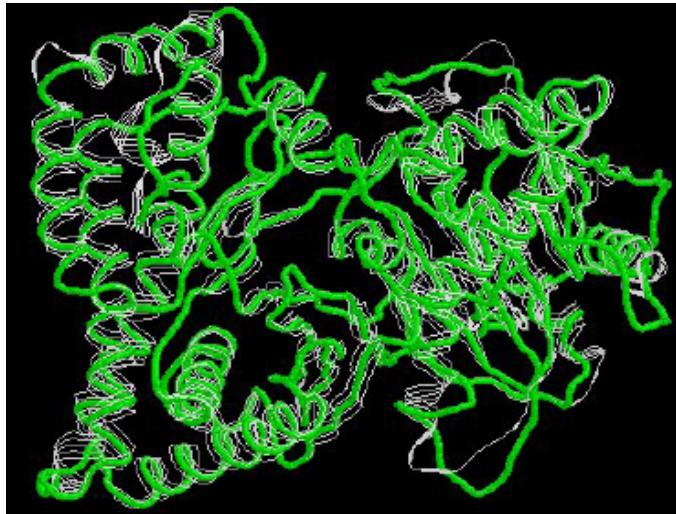
Sander, C. & Schneider, R. (1993) The HSSP data base of protein structure-sequence alignments. *Nucleic Acids Res.*, **21**, 3105-3109.

# Modelado por Homología. Estrategia general

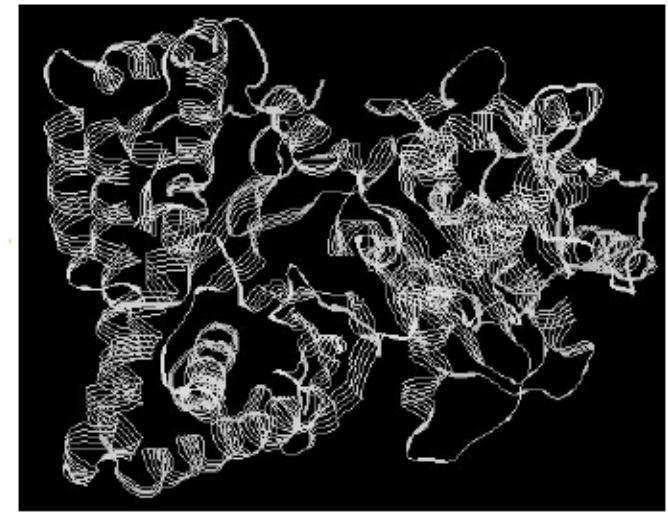
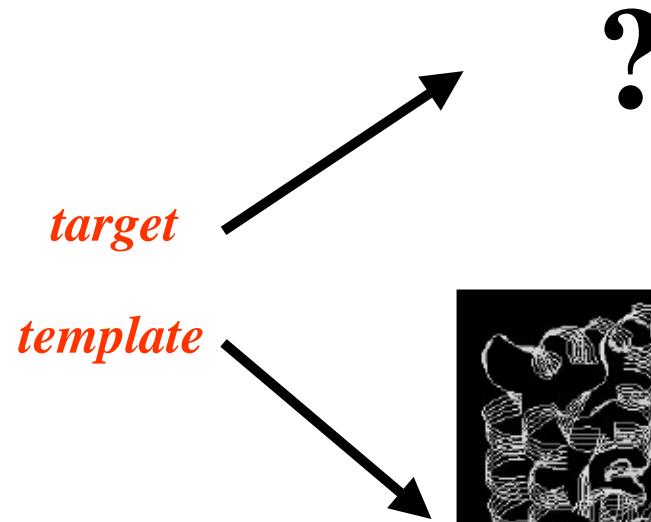
- 
- Localizar molde
  - Generar **alineamiento** entre secuencia problema y molde
  - Para átomos del esqueleto tomar las coordenadas del molde.
  - Para aa. conservados tomar mismas coordenadas para las cadenas laterales
  - Cadenas laterales de otros aa.
    - usar librerías de rotámeros
    - usar la mayor cantidad de átomos posibles ( $C\beta \rightarrow C\gamma, \dots$ )
  - Modelar loops (inserciones y delecciones)
  - Optimizar empaquetamiento (MD, ...)
  - Evaluar calidad del modelo

# Modelado por Homología. Alineamiento molde-proteína problema

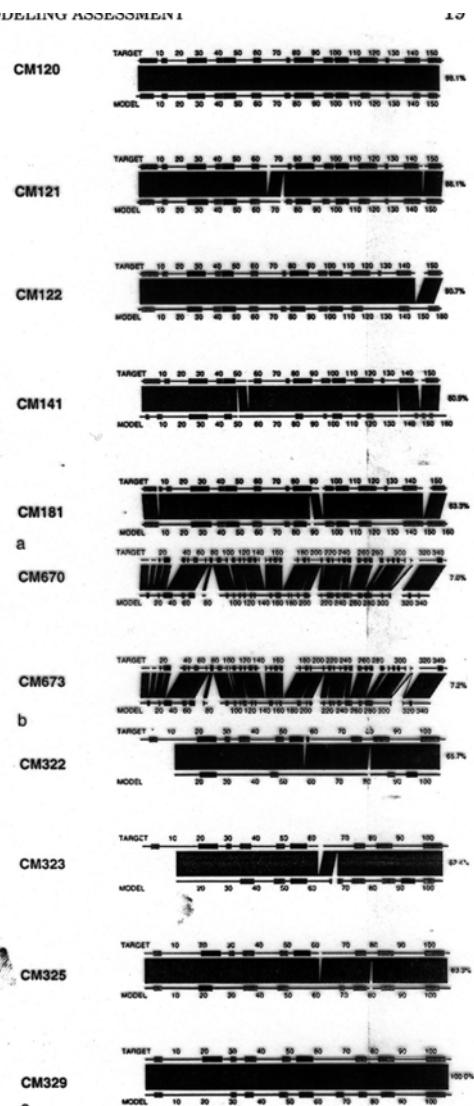
AHPLTSDFGGGHTERDLHA  
|| ||| : | | | | | : ||  
AHTLTSEGHHTEADVHA



*model*



# Modelado por Homología. Alineamiento molde-proteína problema



## MOLECULAR MODELING OF PROTEIN TERTIARY STRUCTURES

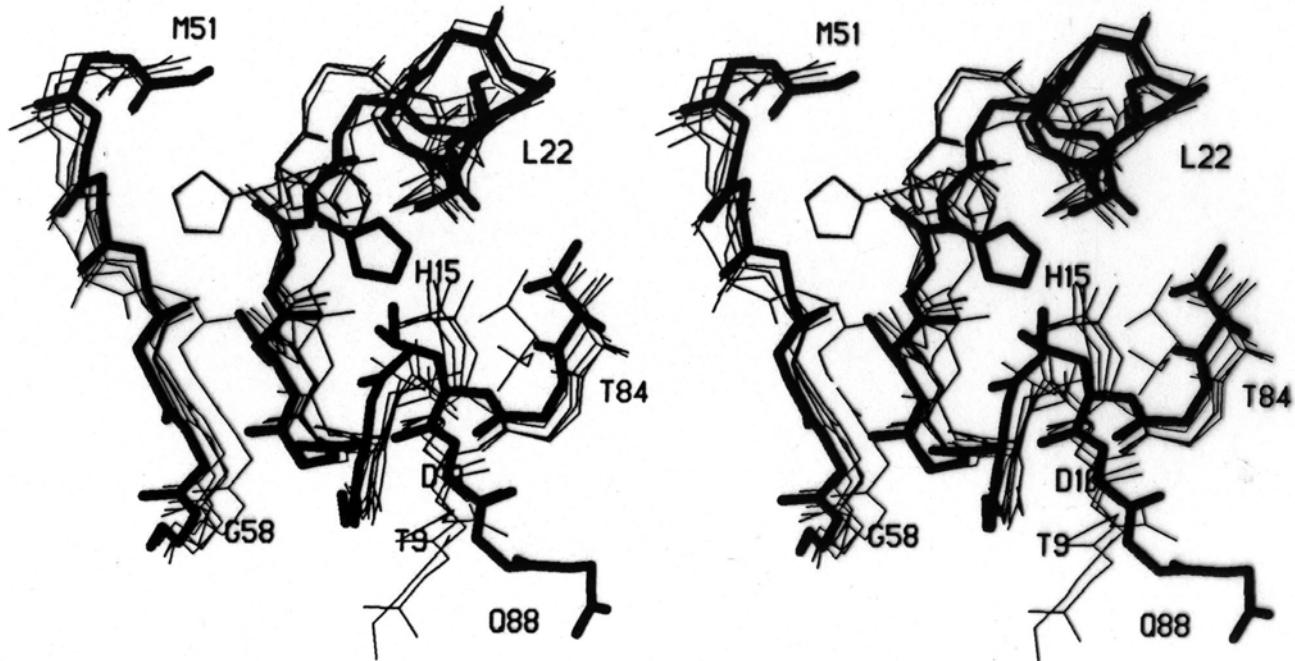


Fig. 3. Comparisons of sequence alignment with structural alignment for selected examples. Complete sets can be viewed on our Web page. The horizontal axes show the structural alignment with helices indicated in black and strands in grey; the lines between the axes indicate the sequence aligned residues. Thus, if the alignment is 100% correct, all the lines will be vertical; lines at an angle indicate errors in the alignment. a: T0001 (dihydrofolate reductase). b: T0027 (pectate lyase). c: T0009 (stellacyanin).

## Modelado por Homología. Cadenas laterales

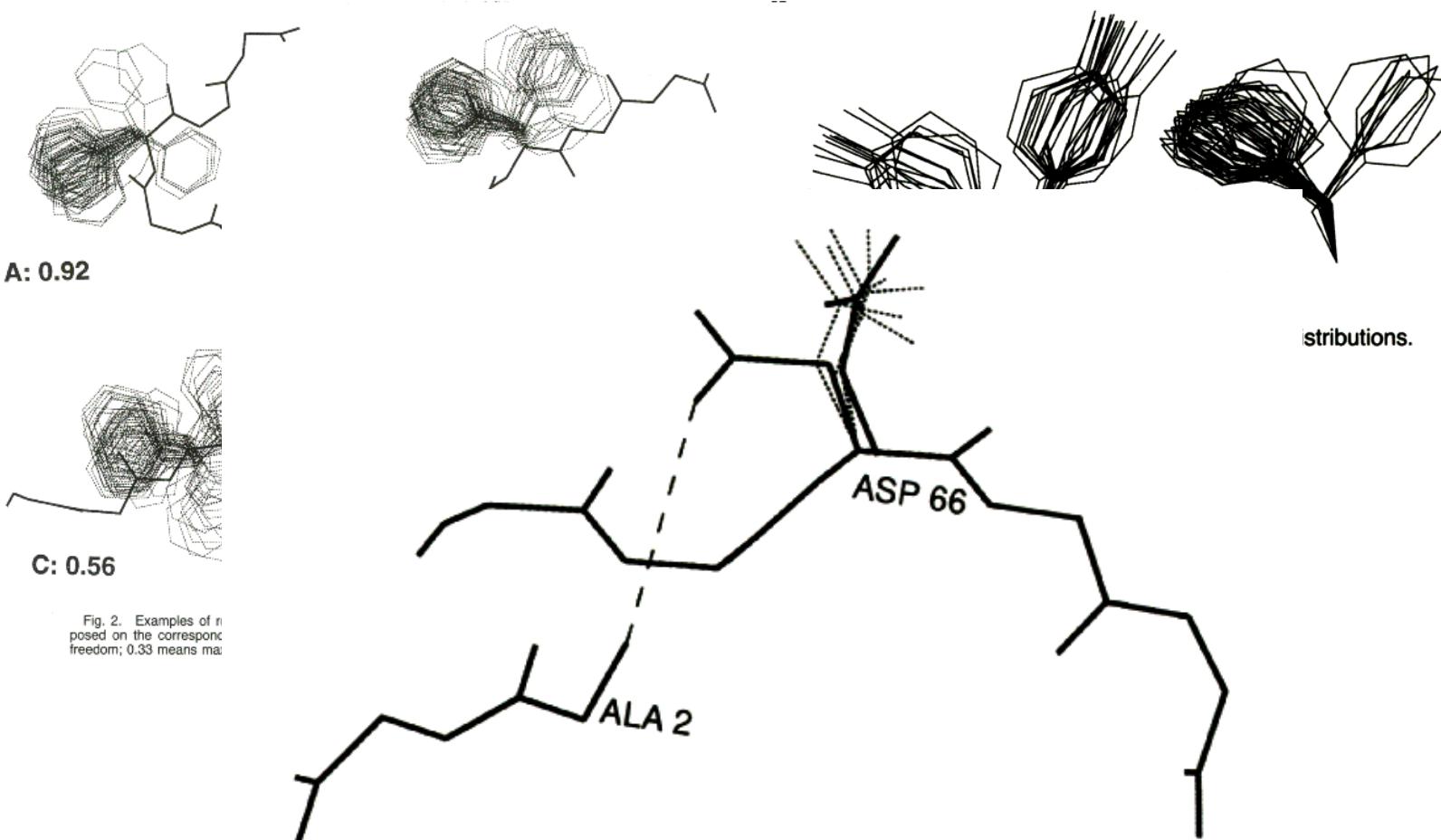


Fig. 6. Rotamer distribution and real position for aspartic acid-66 in HPR. The hydrogen bond between residue 66 and the backbone of residue 2 is indicated. The position-specific rotamers for residue 66 are shown in dashed lines.

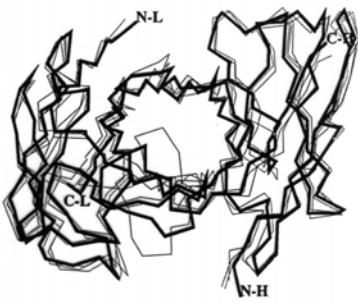
# Modelado por Homología. Nucleo Estructural

NM23



a

E5.2



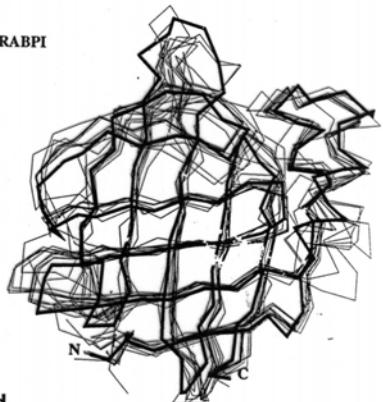
b

HPR



c

CRABPI



d

HFD



e

EDN



f

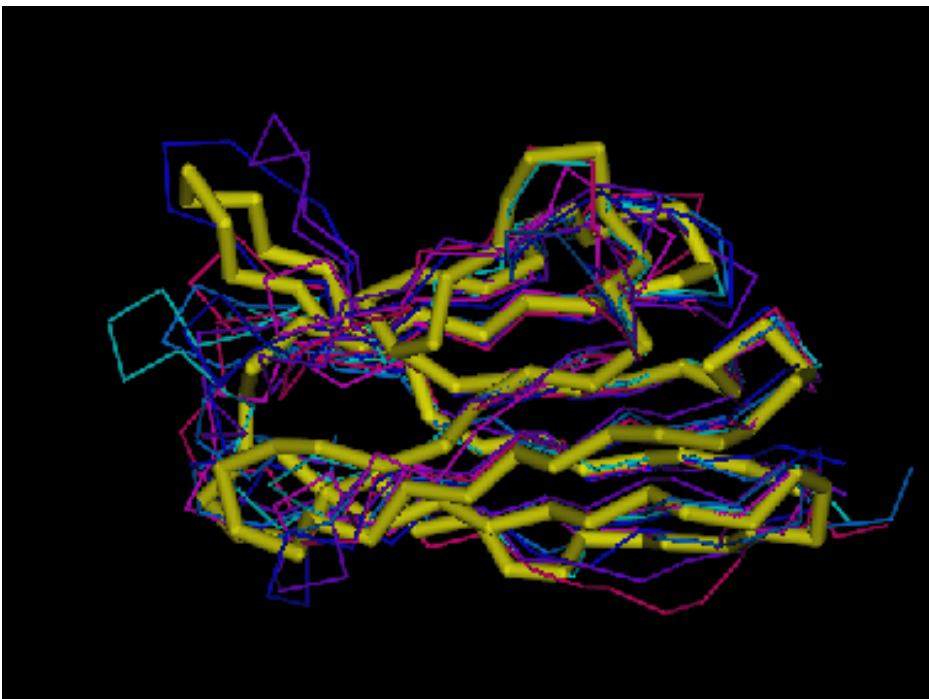


Fig. 1, a-f.

# Modelado por Homología. *Loops*

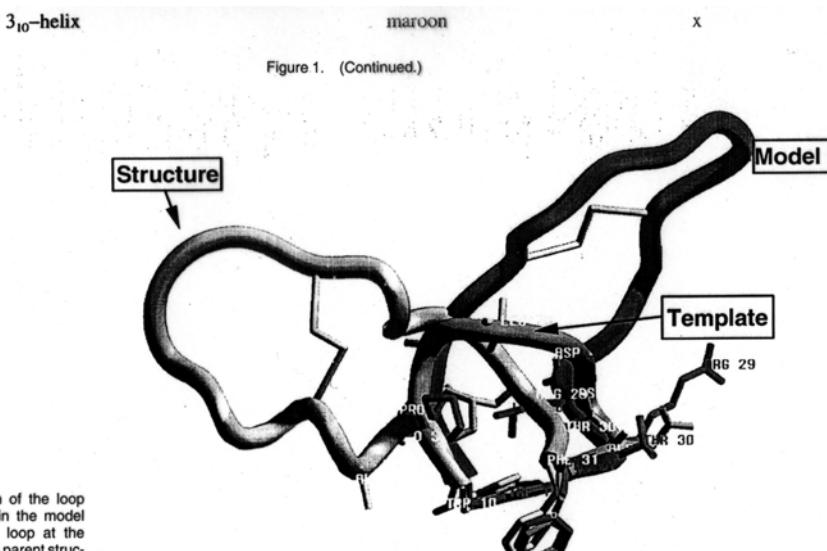
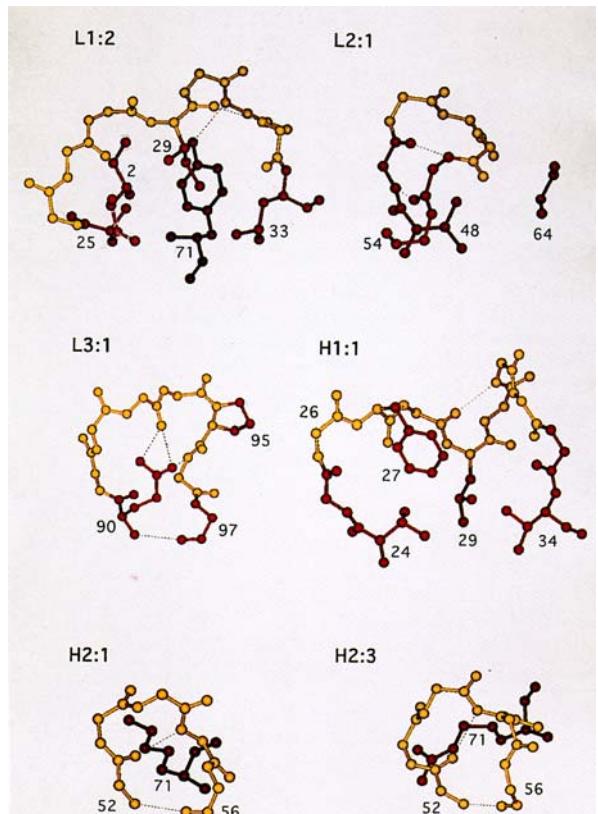
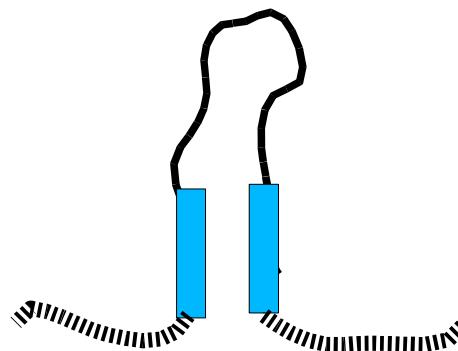
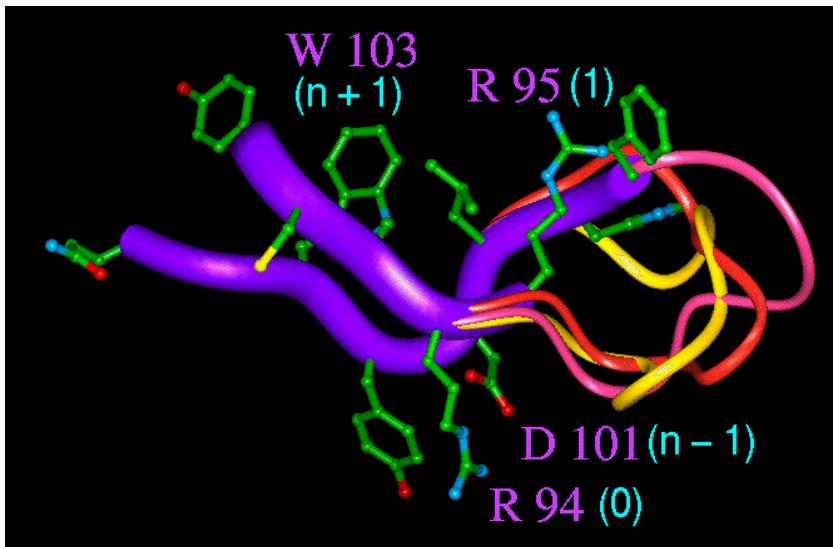
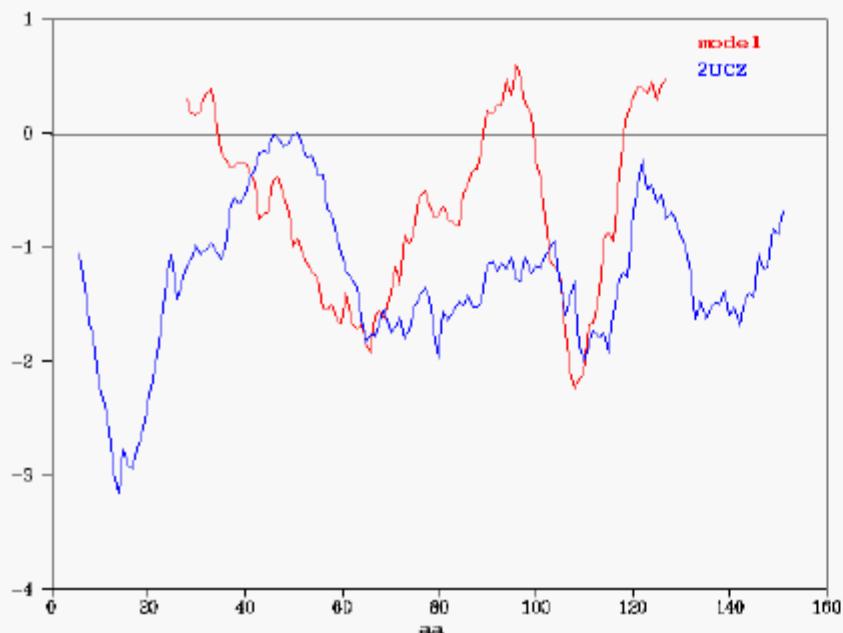


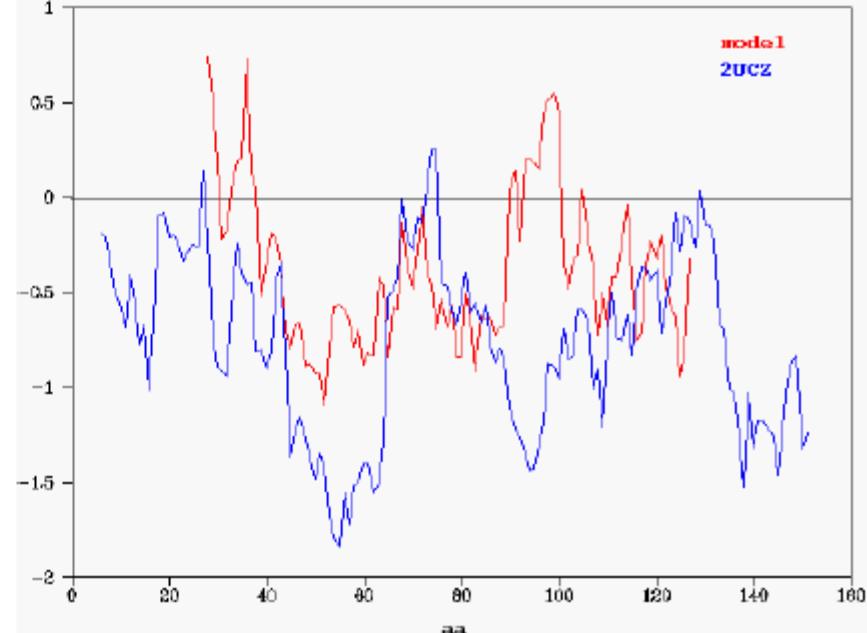
Fig. 2. Comparison of the loop Ala13-Gly27 of T0082 in the model and the structure. The loop at the equivalent position in the parent structure (1bol) is also shown.

# Modelado por Homología

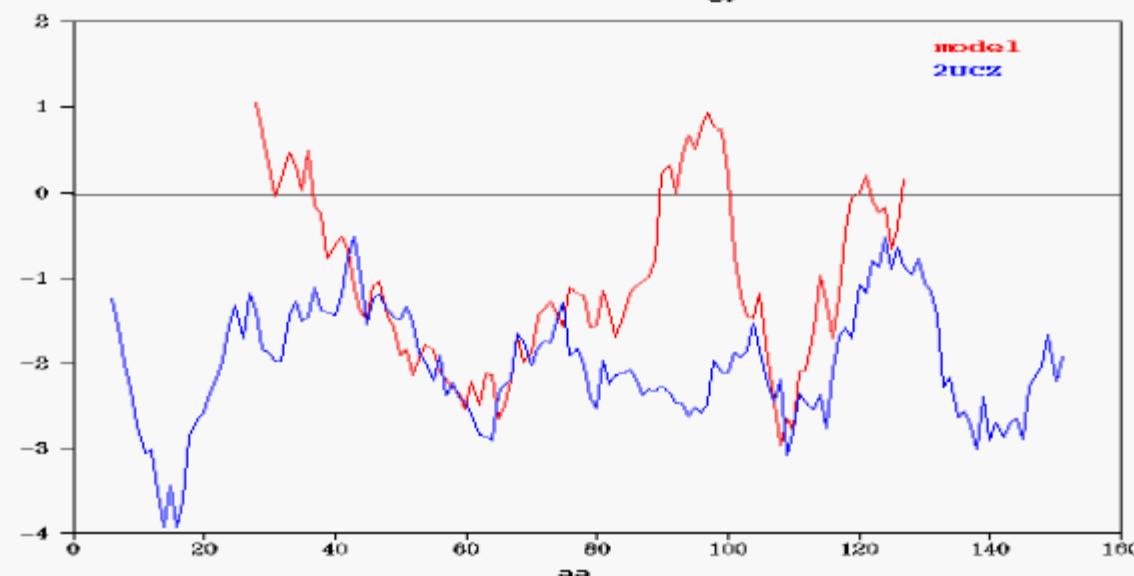
Pair Energy



Surface Energy



Combined Energy



# Modelado por Homología Servidores Públicos y Repositorios de Modelos

**SWISS-MODEL** - [www.expasy.ch/swissmod/SWISS-MODEL.html](http://www.expasy.ch/swissmod/SWISS-MODEL.html)

An automated comparative modelling server (ExPASy, CH)

CPHmodels - [www.cbs.dtu.dk/services/CPHmodels/](http://www.cbs.dtu.dk/services/CPHmodels/)

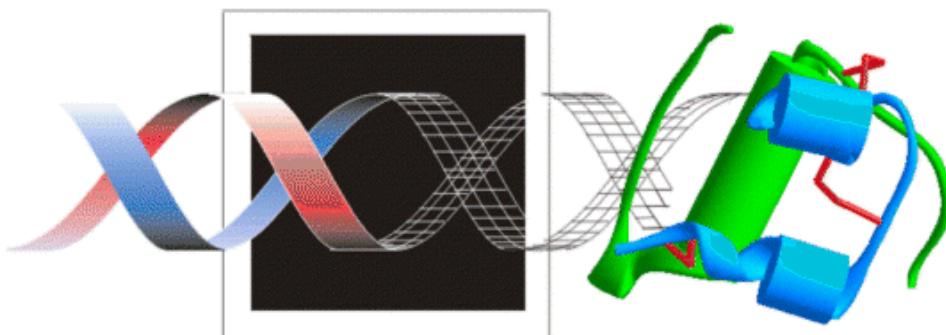
Server using homology modelling (BioCentrum, Denmark)

SDSC1 - [cl.sdsc.edu/hm.html](http://cl.sdsc.edu/hm.html)

Protein structure homology modeling server (San Diego, USA)

3D-JIGSAW - [www.bmm.icnet.uk/servers/3djigsaw/](http://www.bmm.icnet.uk/servers/3djigsaw/)

Automated system for 3D models for proteins (Cancer Research UK)



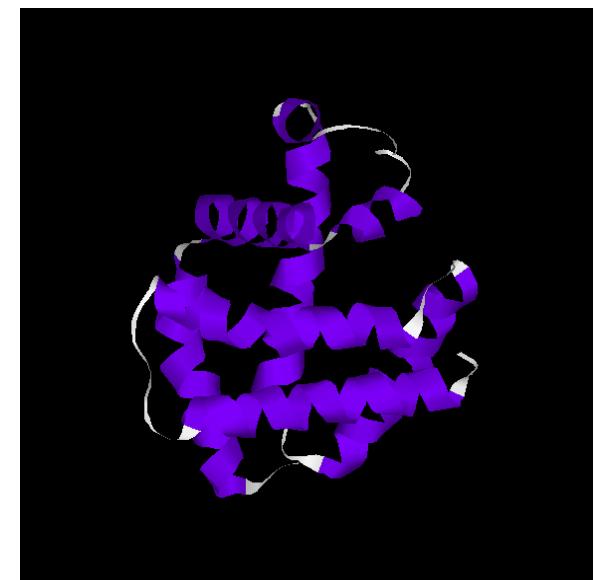
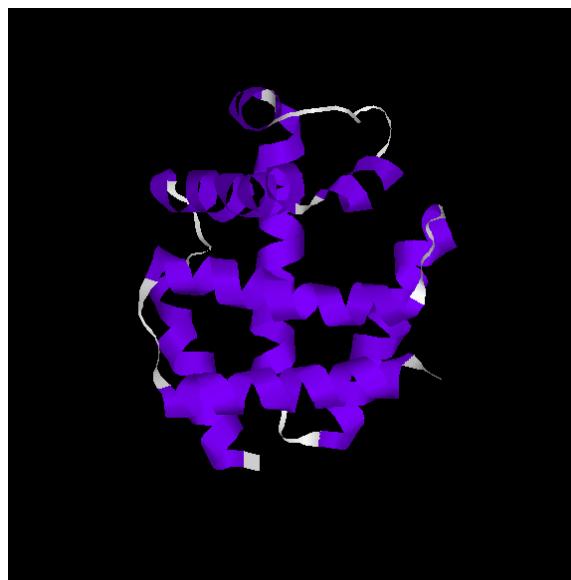
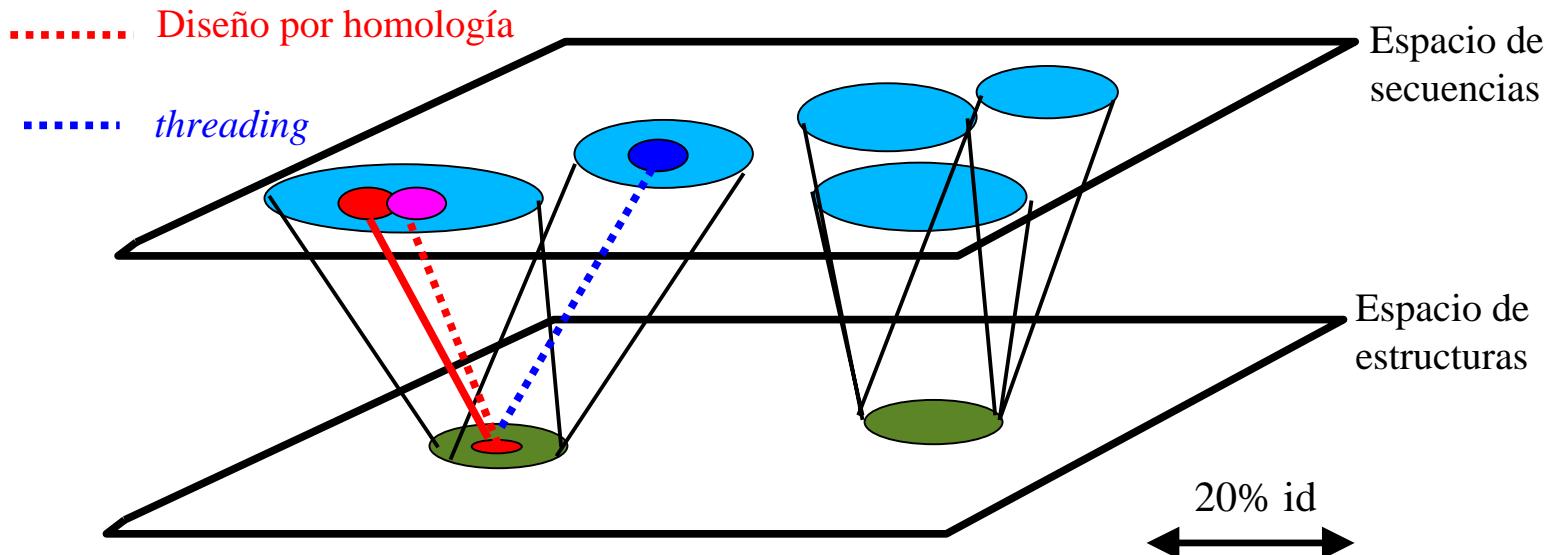
[http://www.expasy.ch/swissmod/SM\\_3DCrunch.html](http://www.expasy.ch/swissmod/SM_3DCrunch.html)



**Database of Comparative  
Protein Structure Models**

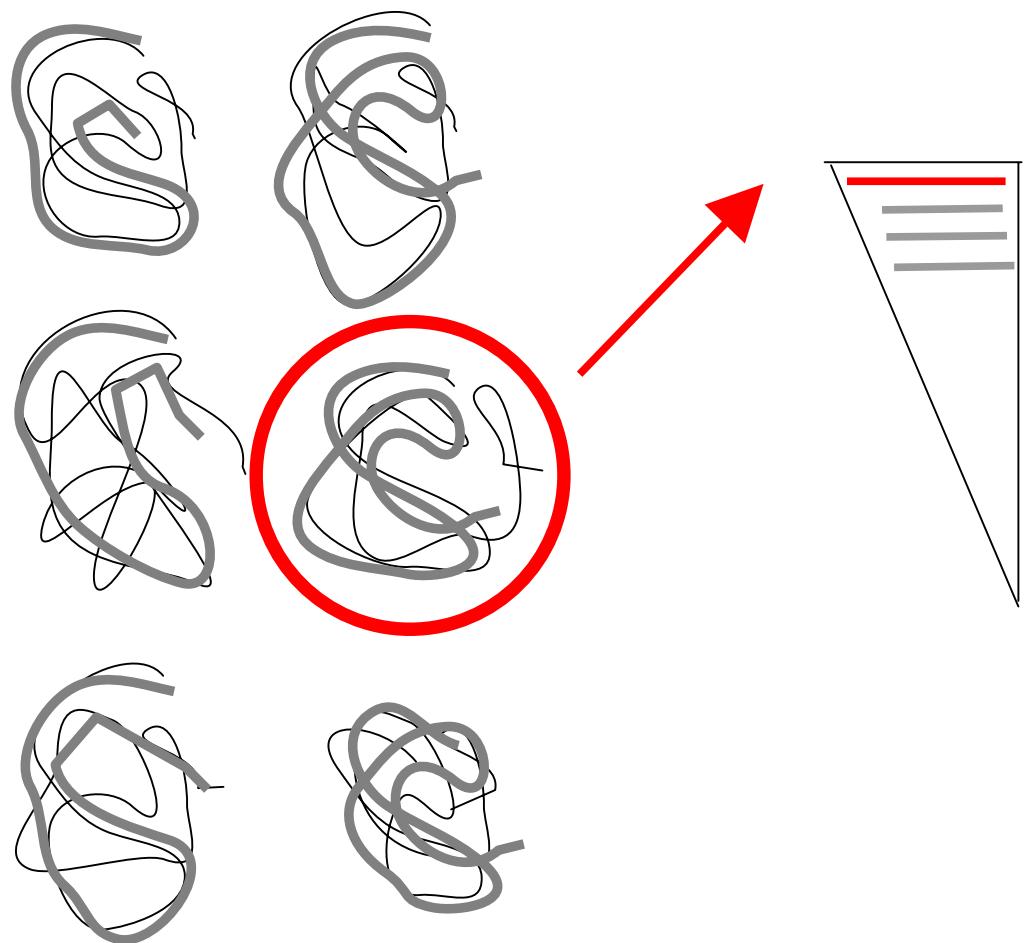
<http://pipe.rockefeller.edu/modbase>

# Modelado por Homología vs. Threading



## *Threading. Estrategia general*

Secuencia  
problema



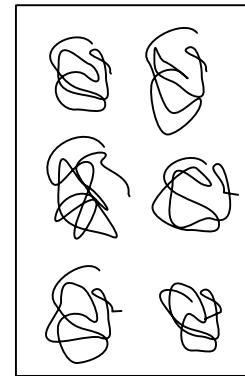
## Algoritmos de *threading*. General.

### 1. Library of protein structures (**fold library**)

all known structures

representative subset (seq. similarity filters)

structural cores with loops removed



### 2. Binary alignment algorithm with **Scoring function**

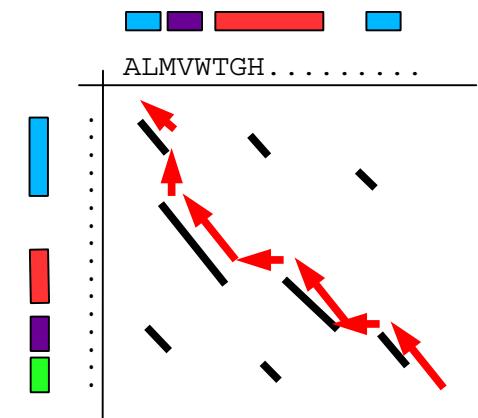
contact potential

environments

Instead of aligning a sequence to a sequence, align strings of descriptors that represent 3D structural features.

Usual Dynamic Programming: score matrix relates two amino acids

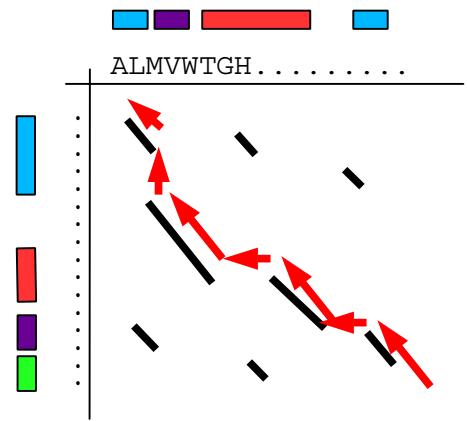
Threading Dynamic Programming: relates amino acids to environments in 3D structure



### 3. Method for generating models via alignments (same as homology modl.)

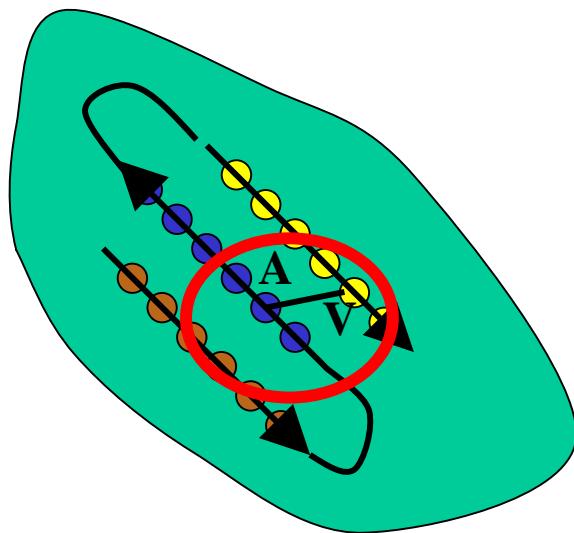
## Algoritmos de *threading* Función de Puntuación

- Aminoácido en ambiente similar a como suele estar en estructuras conocidas.
- Potenciales de solvatación.
- Potenciales de contacto.
- Coincidencia de estructuras secundarias (real y predicha) y accesibilidades.
- Matrices de homología remota extraídas de alineamientos estructurales.
- .....
- *Búsqueda con Modelos de Markov (HMMs).*

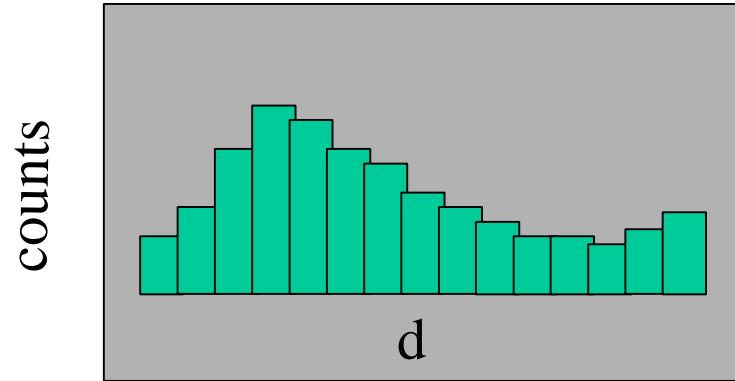


# Algoritmos de *threading*

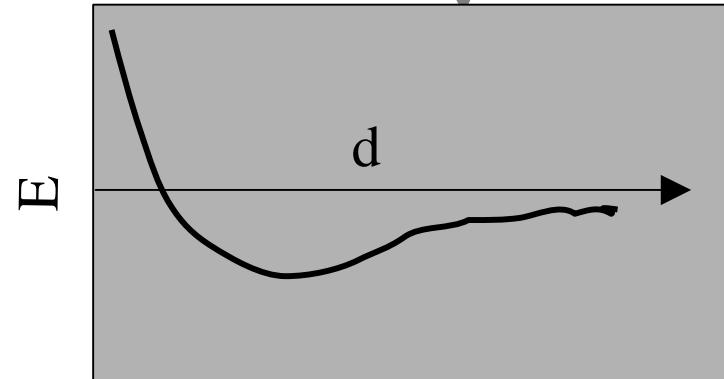
## Potenciales de contacto (potenciales estadísticos)



Count pairs of each residue type at different separations



*Energy of interaction =  
-KT ln (frequency of interactions)  
Boltzmann principle*

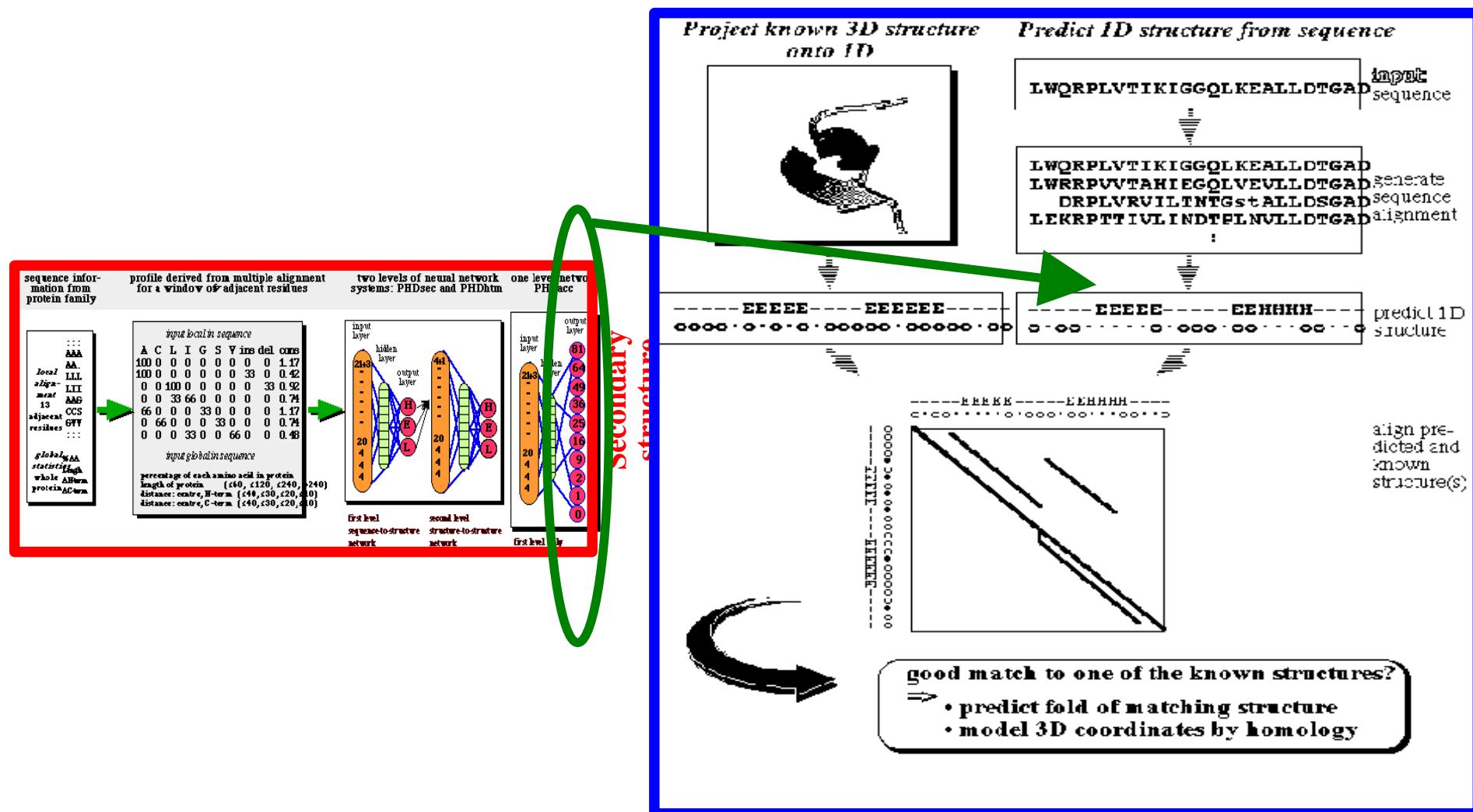


Jones, D., Taylor, W. and Thornton, J. (1992) A new approach to protein fold recognition. *Nature*, **358**, 86-89.

Sippl, M.J. (1995) Knowledge-based potentials for proteins. *Curr Opin Struct Biol*, **5**, 229-235.

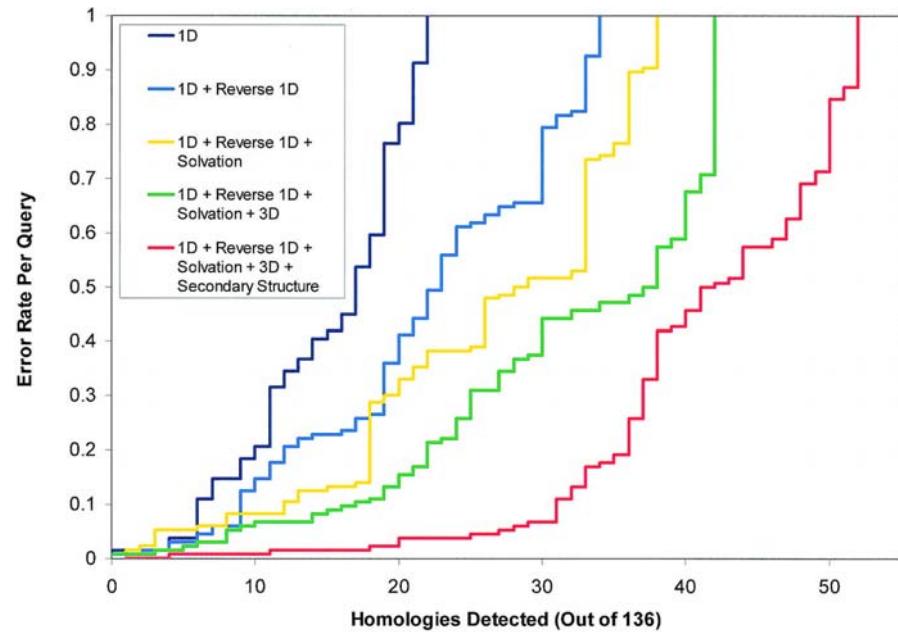
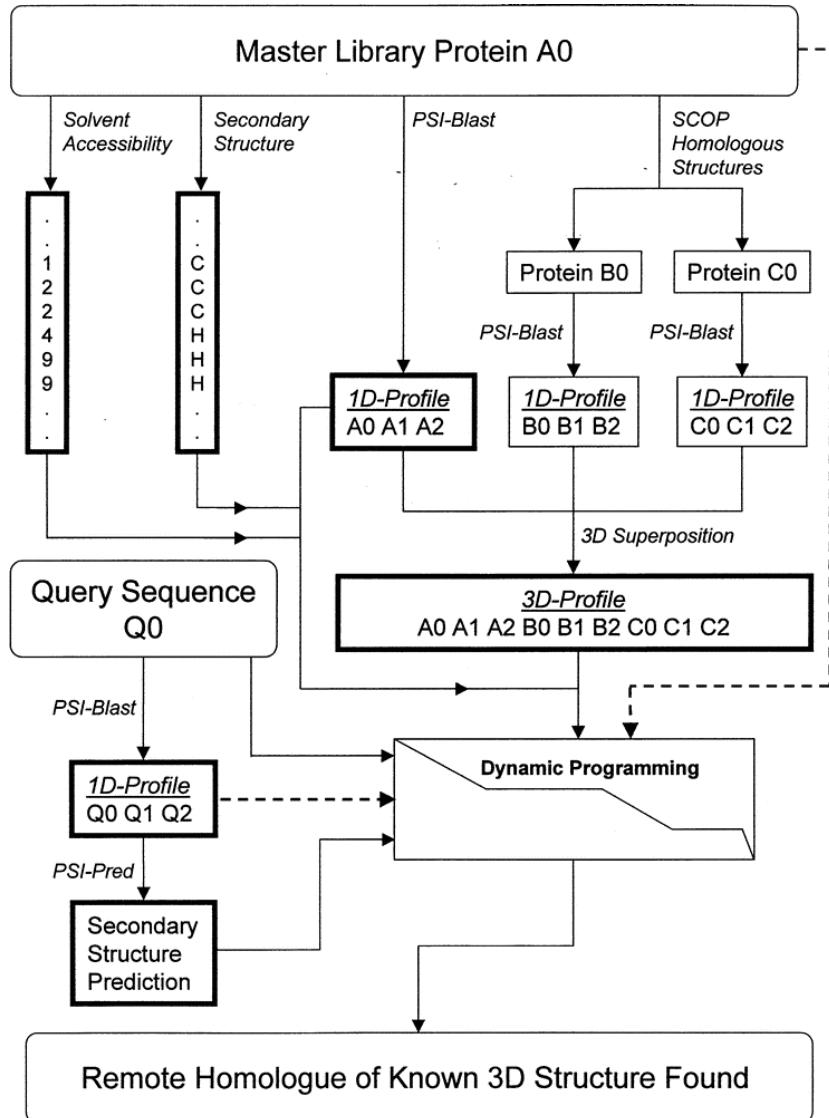
# Algoritmos de *threading*

## Coincidencia de estructura secundaria y accesibilidad



# Algoritmos de *threading*

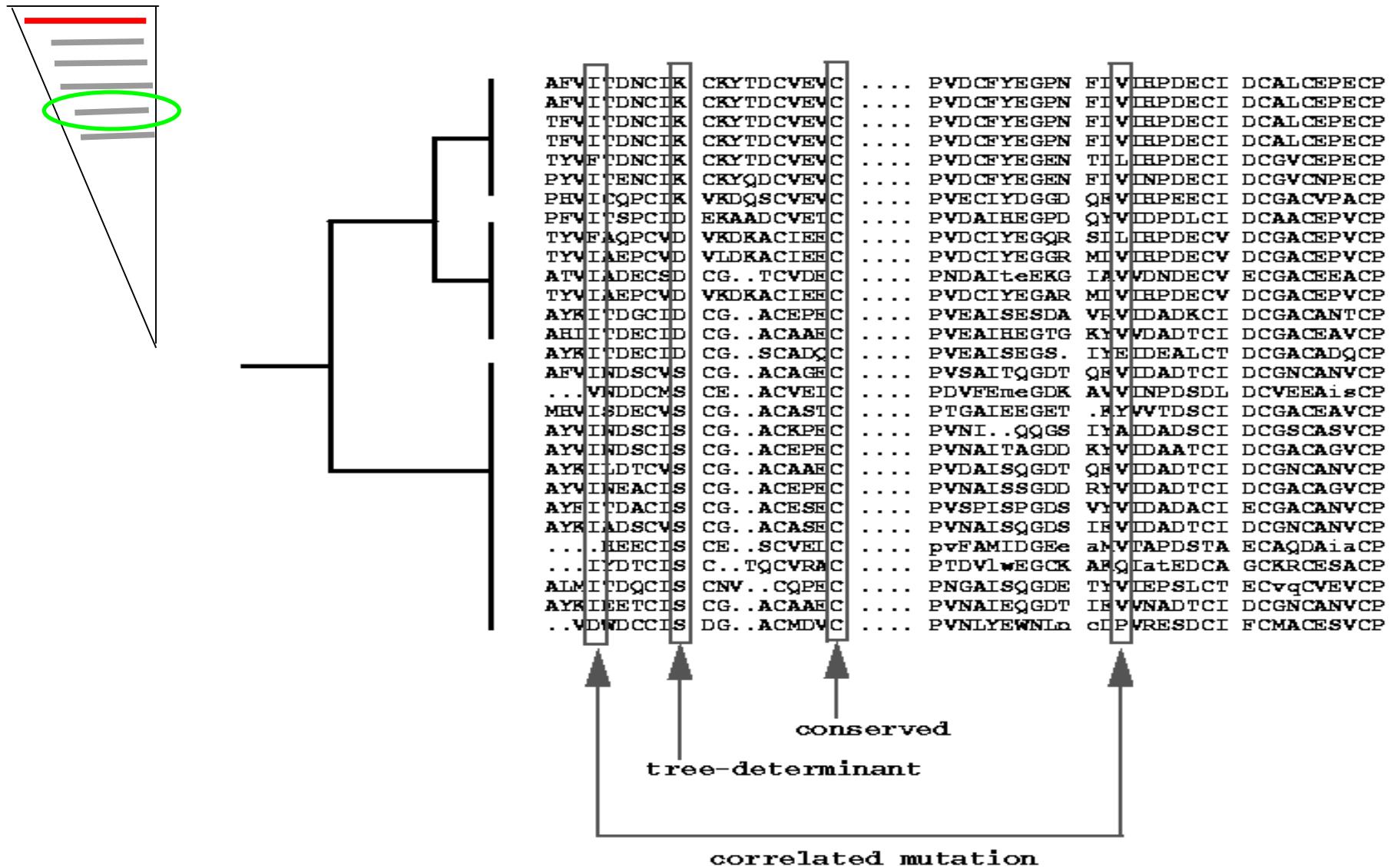
## Perfiles de secuencia + estructura secundaria



# Threading

## Post-procesamiento de resultados

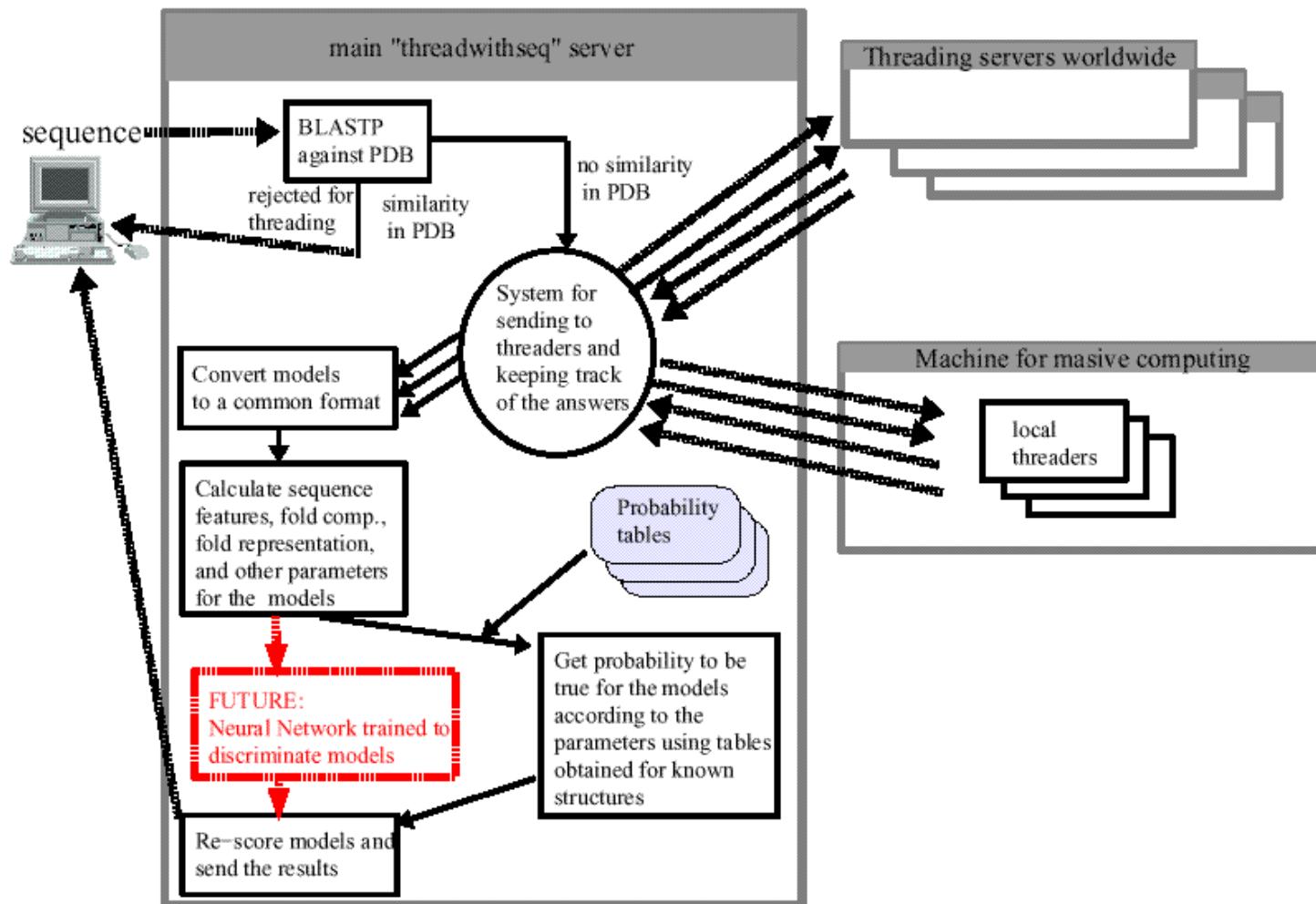
### Combinación con información adicional



# Threading

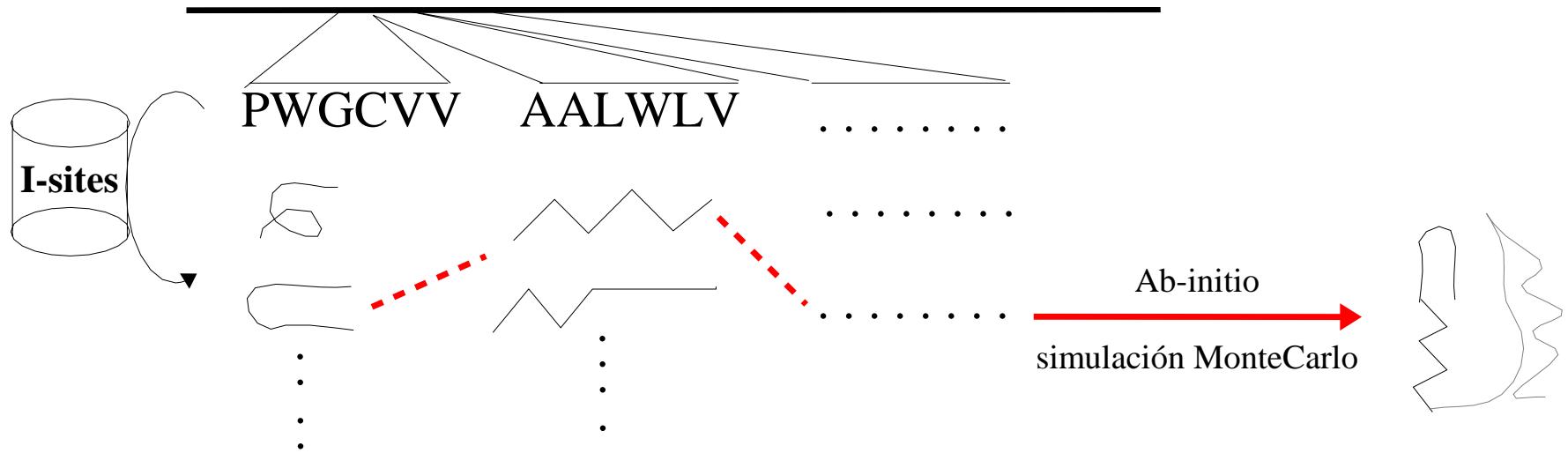
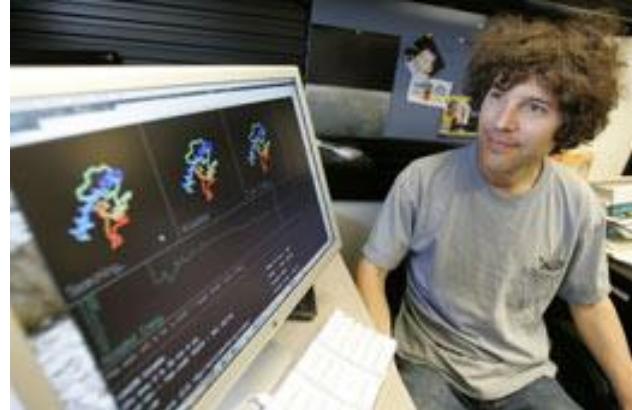
## Post-procesamiento de resultados

### Meta-servidores



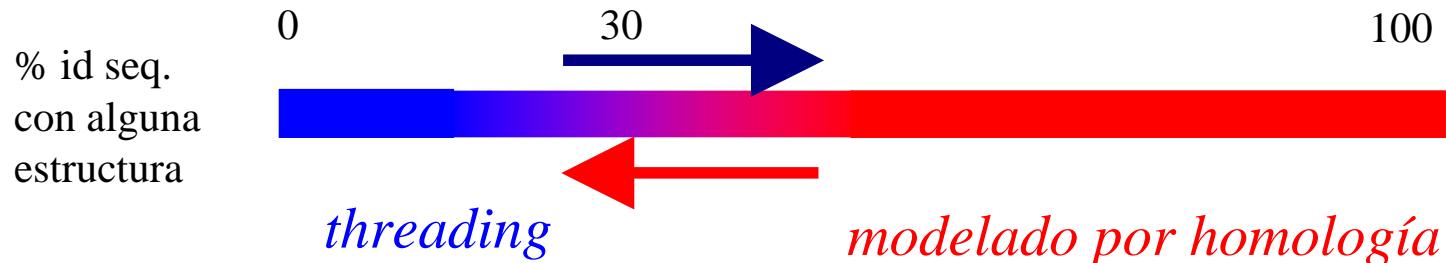
<http://bioinfo.pl/meta> (Metaserver + “3D-jury”)

# Predicción de Estructura *Mini-threading + ab-initio* *Rosetta*



<http://robetta.bakerlab.org/>

# Modelado por Homología vs. *Threading*



aplicación

cualquier  
secuencia

$\geq 30\%$  con  
algun PDB

calidad modelos

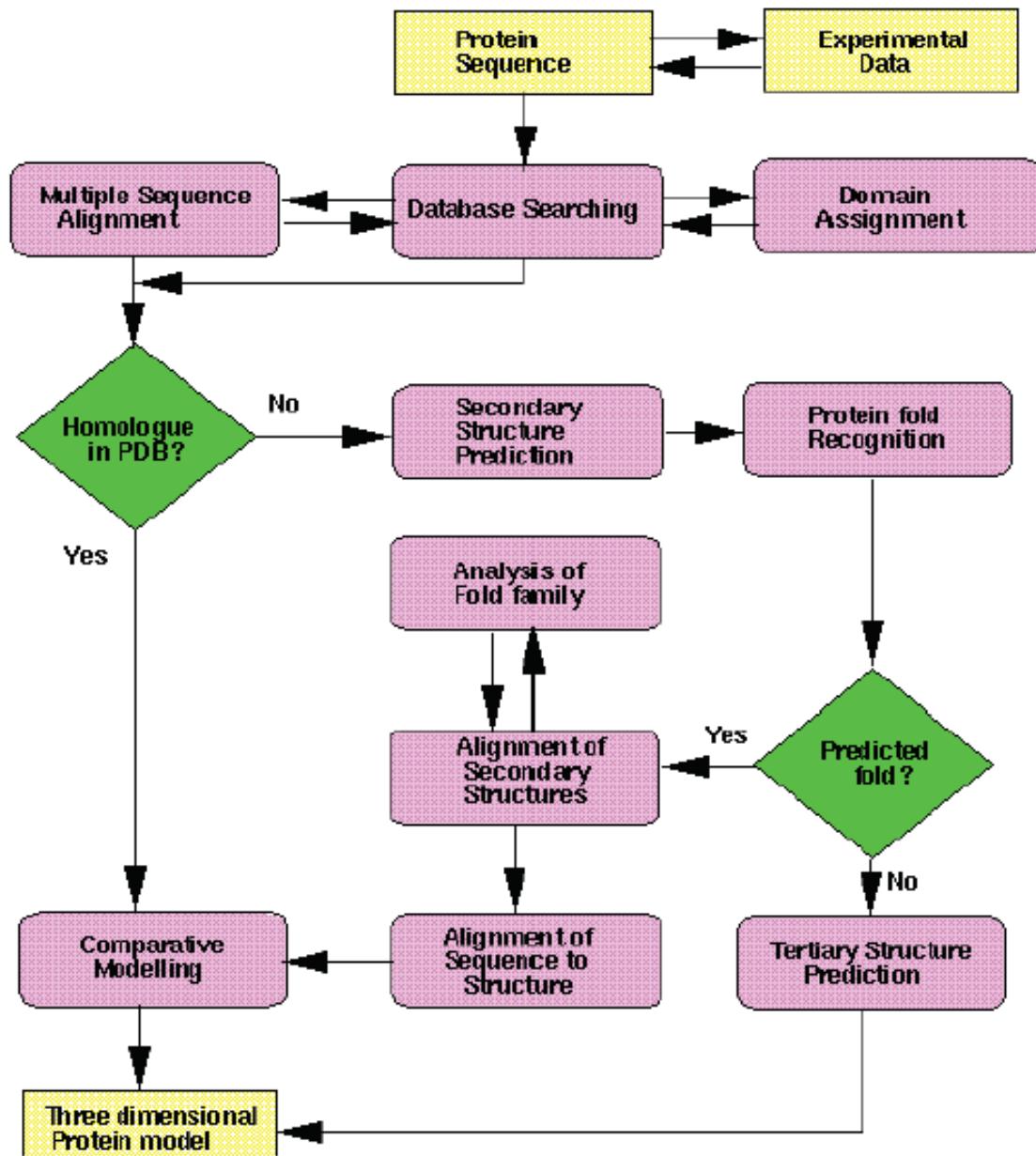
fold  
alineamiento

nivel  
atómico

- diferencia en loops  
y gaps
- movimientos de  
dominios
- cambios en el backbone

- cadenas laterales
- loops



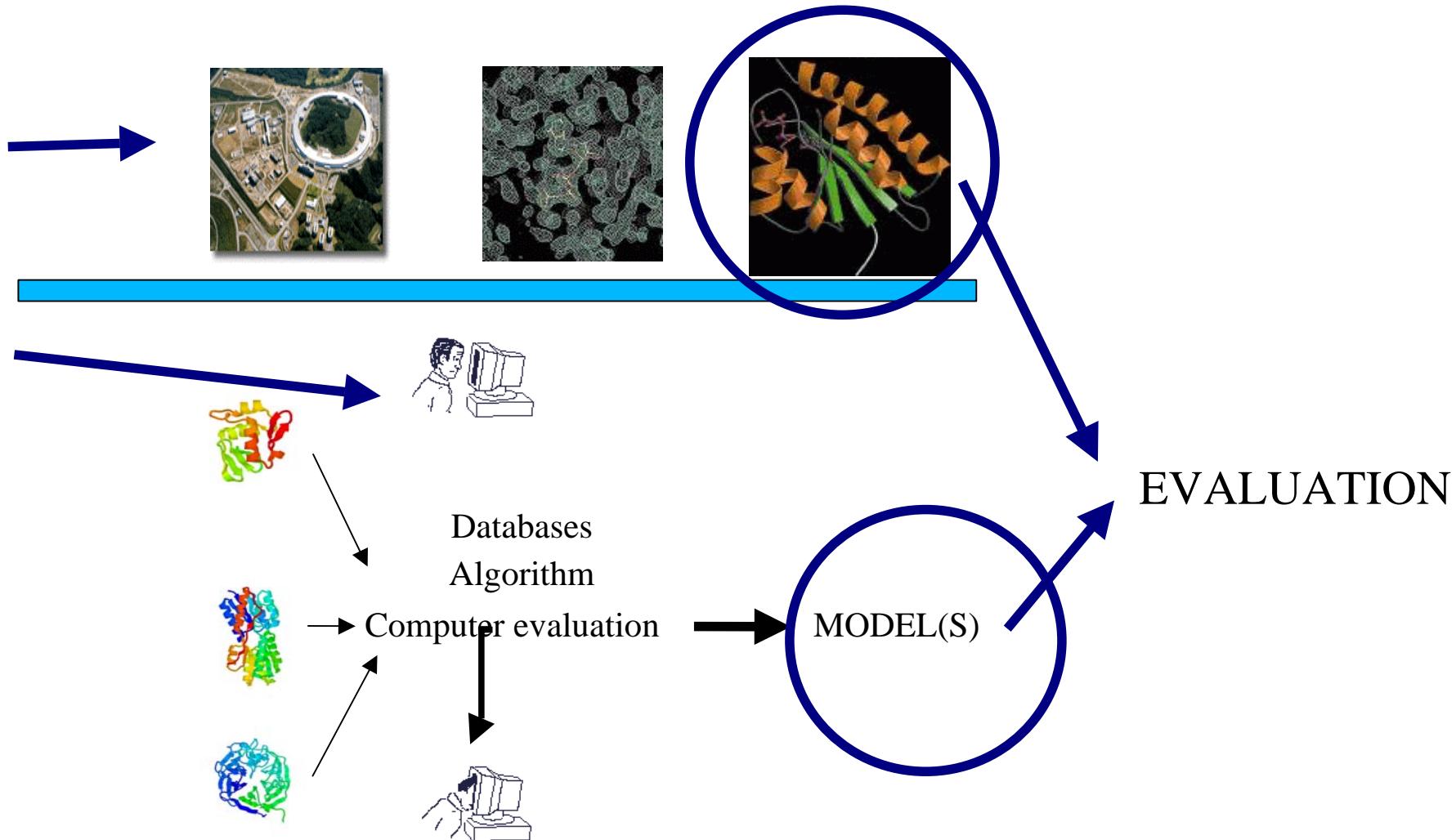


R. Russell  
EMBL

# Evaluación de métodos de predicción

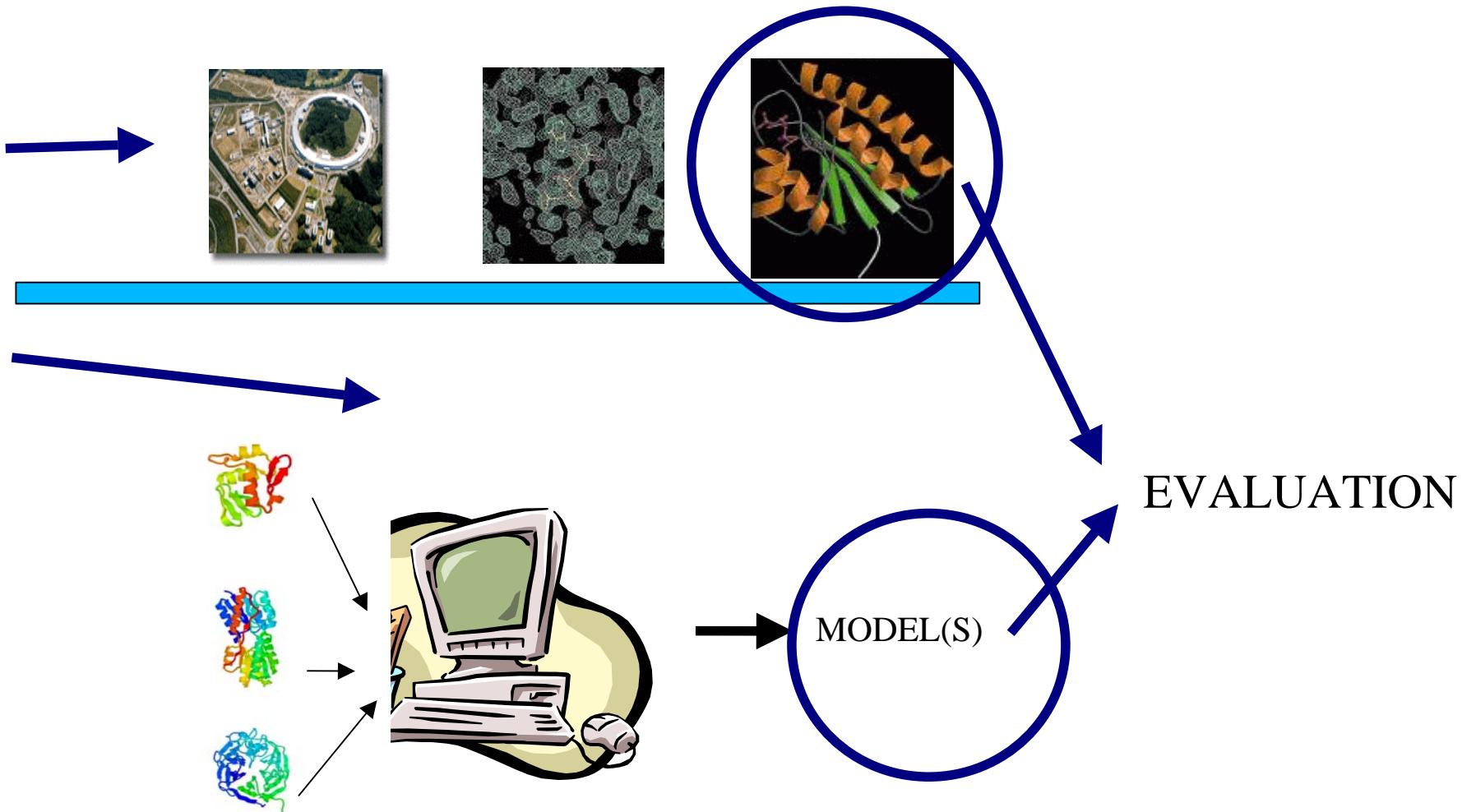
## I) CASP (bianual 94-06)

MAKEFGIPAAVAGTVLNVVEAGGWVTTIVSILTAVGSG  
GLSLLAAAGRESIKAYLKKEI KKGKRAVIW



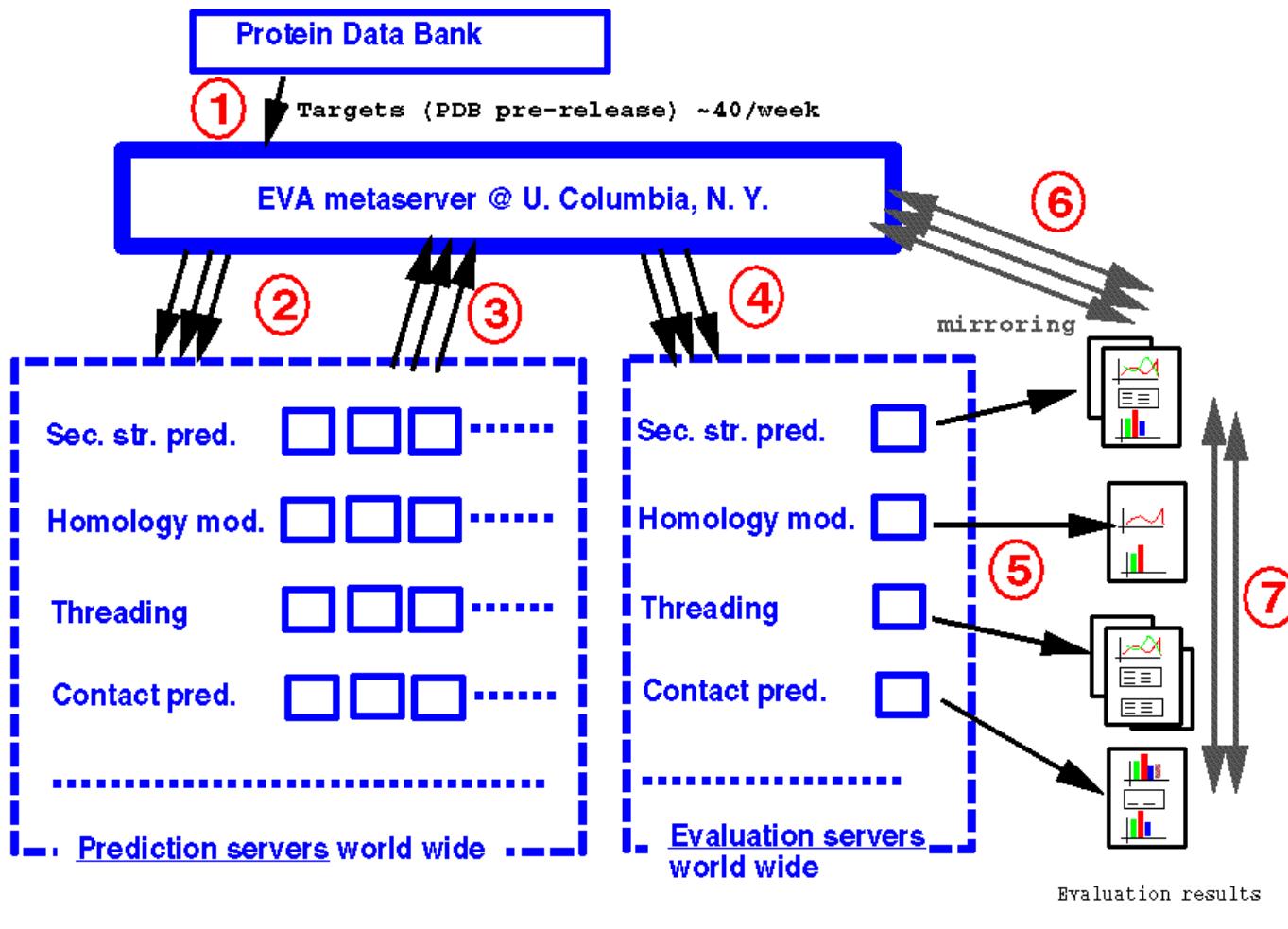
# Evaluación de métodos de predicción II) CAFASP (bianual 98-06)

MAKEFGIPAAVAGTVLNVVEAGGWVTTIVSILTAVGSG  
GLSLAAAGRESIKAYLKKEI KKGKRAVIW



# Evaluación de métodos

## III) EVA/LiveBench



Eyrich, V.A., Marti-Renom, M.A., Przybylski, D., Madhusudhan, M.S., Fiser, A., Pazos, F., Valencia, A., Sali, A. and Rost, B. (2001) EVA: continuous automatic evaluation of protein structure prediction servers. *Bioinformatics*, **17**, 1242-1243.

Koh, I.Y.Y., Eyrich, V.A., Marti-Renom, M.A., Przybylski, D., Madhusudhan, M.S., Eswar, N., Grana, O., Pazos, F., Valencia, A., Sali, A., et al. (2003) EVA: evaluation of protein structure prediction servers. *Nucl. Acids. Res.*, **31**, 3311-3315.

**Netscape: EVA: Evaluation of automatic structure prediction servers**

File Edit View Go Communicator Help

Bookmarks Location: <http://www.pdg.cnb.uam.es/eva/> What's Related

**EVA**

EVA mirrors - Secondary structure Comparative modelling Contacts

Version May 7, 2001

**OBJECTIVES:**  
EVA continuously analyses protein structures servers in 'real time'.

**RESULTS:**

- PDB statistics
- secondary structure
- comparative modelling
- inter-residue contacts

**INFORMATION:**

- EVA flow chart
- EVA concept
- Structure prediction
- Related resources

**CONTACT:**

- EVA [eva@cub.ac](mailto:eva@cub.ac)
- EVA [team](#)

EVA mirrors - Secondary structure Comparative modelling Contacts

100%

**Netscape: EVA\_con. Results in short.**

File Edit View Go Communicator

Bookmarks Location: <http://www.pdg.cnb.uam.es/eva/con/>

EVA home EVA e-mail EVA mirrors - Threading Contacts

**EVA\_con: Results in short**

Pages automatically updated twice a week. Last update: 05/24/01 18:00. Reload in your browser to get the actual results.

Averages are actually calculated using only the best results.

	#1 PDGCON	#2 CORNET
Average common (35 prots.)	2.075	

Summary (xd) 05/24/01 (18:00) 35 prots

(c) EVA Team <http://cubic.bioc.columbia.edu/eva>

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100%

**Netscape: EVA\_con. Results in short.**

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Bookmarks Location: <http://www.pdg.cnb.uam.es/eva/con/>

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100%

**Netscape: Eva-Cm RANKING PAGE**

File Edit View Go Communicator Help

Bookmarks Location: <http://pipe.rockefeller.edu/~eva/cm/> What's Related

**EVA CM**

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## Statistical analysis of Eva-CM results.

The Student t distribution statistics are used to assess the statistical significance of ranking of protein structure modeling methods ([details](#)).

**Analysis of Fold accuracy (% Equivalent Positions):**

Ranking of the methods:

	cphmodels	SwissModel	sdsc1
1. cphmodels		-2.03 ± 16.21 [295]	-1.36 ± 11.30 [314]
2. SwissModel	2.03 ± 16.21 [295]		-1.79 ± 16.91 [1671]
3. sdsc1	1.36 ± 11.30 [314]	1.79 ± 16.91 [1671]	

t-Student statistical analysis of the comparisons:

	cphmodels	SwissModel	sdsc1
1. cphmodels		-2.03 ± 16.21 [295]	-1.36 ± 11.30 [314]
2. SwissModel	2.03 ± 16.21 [295]		-1.79 ± 16.91 [1671]
3. sdsc1	1.36 ± 11.30 [314]	1.79 ± 16.91 [1671]	

**Analysis of Alignment accuracy (% of correct aligned positions):**

Ranking of the methods:

(c) EVA Team <http://cubic.bioc.columbia.edu/eva>

EVA home EVA e-mail EVA mirrors - Secondary structure Comparative modelling Threading Contacts

100%

4 weeks running EVA => more targets than CASP1+2+3+4

# Predictión de Estructura de Proteínas Futuro...?

- Combinación de métodos de predicción con datos estructurales a baja resolución
- Integración en los proyectos de *structural genomics*.
- Predicción de función

- 
- Qu, Y., Guo, J.T., Olman, V. and Xu, Y. (2004) Protein structure prediction using sparse dipolar coupling data. *Nucleic Acids Res*, **32**, 551-561. Print 2004.
  - Arakaki, A.K., Zhang, Y. and Skolnick, J. (2004) Large-scale assessment of the utility of low-resolution protein structures for biochemical function assignment. *Bioinformatics*, **20**, 1087-1096.
  - Meiler, J. and Baker, D. (2003) Rapid protein fold determination using unassigned NMR data. *Proc Natl Acad Sci U S A*, **100**, 15404-15409.
  - Li, W., Zhang, Y., Kihara, D., Huang, Y.J., Zheng, D., Montelione, G.T., Kolinski, A. and Skolnick, J. (2003) TOUCHSTONEX: Protein structure prediction with sparse NMR data. *Proteins*, **53**, 290-306.
  - Zheng, W. and Doniach, S. (2002) Protein structure prediction constrained by solution x-ray scattering data and structural homology identification. *J Mol Biol*, **316**, 173-187.

[http://pdg.cnb.uam.es/pazos/cursos/protstr\\_cnb](http://pdg.cnb.uam.es/pazos/cursos/protstr_cnb)