

# Homology Modeling

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- 1 Introduction
- 2 Homology modeling steps
- 3 SWISS-MODEL
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# Introduction

## Protein structure modeling

- Goal: predict structure from sequence with accuracy comparable to best experimental results
- Major approaches to 3D structure prediction:
  - ▶ **Template based modeling:** template available
    - ▶ **Homology modeling (comparative modeling)** (sequence alignment)
    - ▶ **Structure based modeling (fold recognition)**
  - ▶ **Free modeling:** no template available

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    - ★ **homology modeling (comparative modeling)**
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  - ▶ **Template-free modeling (FM):**
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- Fundamental observations:
  - ▶ amino acid sequence → unique structure
  - ▶ evolution: structure changes much slower than sequence
    - ★ similar sequences → almost identical structures
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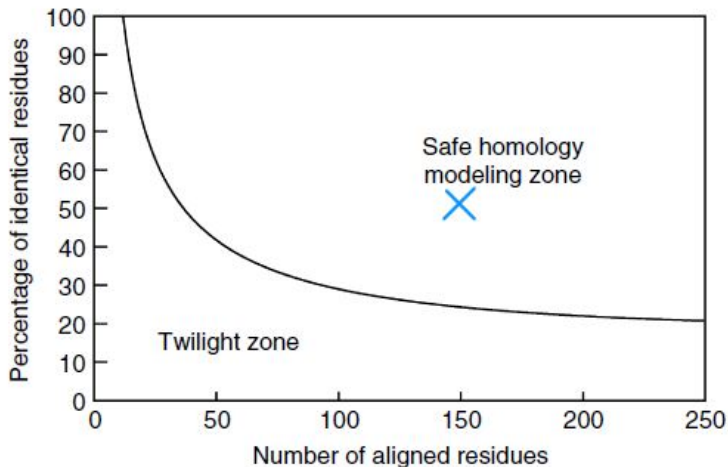
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# Safe homology modeling zone



**Figure:** The two zones of sequence alignments. (Rost B 1999, Twilight zone of protein sequence alignments.)

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- Terms
  - ▶ **Target:** the protein whose structure is to be modeled
  - ▶ **Template:** a homologue protein with known structure
- Length and % sequence identity of the alignment between the two must fall into the "safe" region

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- The steps of homology modeling:
  - ① Template selection and original alignment
  - ② Alignment correction
  - ③ Backbone generation
  - ④ Loop modeling
  - ⑤ Side-chain modeling
  - ⑥ Model optimization
  - ⑦ Model validation
- Steps 3-6: model building

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# Homology modeling steps

## 1. Template selection and original alignment

- Use sequence homology search and alignment tool, e.g. BLAST, with:
  - ▶ query sequence: target
  - ▶ database: PDB
- Obtained list of hits - the templates and alignments

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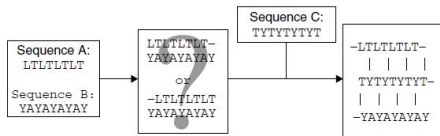
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## 2. Alignment correction

- Region of low sequence identity → use MSA with other sequences



**Figure:** A third sequence C enables to align sequences A and B (Krieger et al., Homology Modeling)

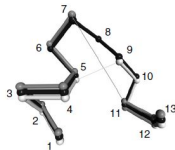
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- MSA helps to place deletions or insertions

	1	2	3	4	5	6	7	8	9	10	11	12	13
Template	PHE	ASP	ILE	CYS	ARG	LEU	PRO	GLY	SER	ALA	GLU	ALA	VAL
Model (bad) 1	PHE	ASN	VAL	CYS	ARG	ALA	PRO	---	---	---	GLU	ALA	ILE
Model (good) 2	PHE	ASN	VAL	CYS	ARG	---	---	---	ALA	PRO	GLU	ALA	ILE

(a)



(b)

**Figure:** (a) The 3-residue deletion appears to be modeled better in the first alignment (aligned proline). (b) Structural alignment with template ( $C_{\alpha}$ -trace: black). While the alignment with the higher score (dark gray) leads to a big gap of 7.5Å, the second alignment has only a tiny gap of 1.3Å. (Krieger et al., Homology Modeling)

# Homology modeling steps

## 3. Backbone generation

- Copy coordinates of aligned residues from the template
  - ▶ if different residues  $\rightarrow$  only copy the backbone coordinates ( $N$ ,  $C_\alpha$ ,  $C$  and  $O$ )
  - ▶ if identical residues  $\rightarrow$  side chain can also be included
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## 4. Loop modeling

- Treatment of gaps:
  - ▶ in the model (deletions) → omit residues from the template
  - ▶ in the template (insertions) → cut the template backbone, insert the missing residues
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  - ▶ cannot happen in secondary structure elements  
→ in loops and turns
  - ▶ difficult to predict!
  - ▶ often different also in aligned loops!



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    - ★ >90% → accuracy compared to crystallographically determined structures
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  - ▶ check bond length/angles, number of bumps
  - ▶ well-minimized models can still be misfolded!
  - ▶ one number for protein, not for single aa!
- 2 Determine of "normality indices", e.g.:
  - ▶ inside/outside distribution of polar/apolar residues
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- ▶ input: amino acid sequence of the target
- ▶ optionally: up to 5 template structures

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- ▶ input: user-defined target-template alignment

### 3 **project mode**

- ▶ input: project file from DeepView (Swiss-PdbViewer) with manually optimized target-template alignments
- ▶ control over a wide range of parameters

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  - ① template selection
  - ② target template alignment
  - ③ model building
  - ④ evaluation
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  - ▶ Splitting of PDB files into protein chains
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- Calculation of local pair-wise alignments of the target to the templates
- Heuristic improvement of the alignment

# SWISS-MODEL

## 2. Target template alignment

- Superposition of max. 5 templates per batch using iterative least squares algorithm
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# SWISS-MODEL

## 3 Model building

- Generation of model core
  - ▶ Weighting of templates by sequence similarity to the target
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- If CSP solution is not good or loops  $> 10$  residues  
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# SWISS-MODEL

## 3 Model building: energy minimization

- Joining of rigid fragments
  - deviations in target structure geometry
  - regulation by **steepest descent energy minimization**

# SWISS-MODEL

## 4. Evaluation

- Several tools to evaluate reliability of the model:
  - ▶ **C-score** estimates variability of the template structure at each position (IN/DELS: C-score=99)
  - ▶ **Force field energy for the overall structure/each residue** identifies regions with conformational or electrostatic problems
  - ▶ **WhatCheck** report and evaluation by atomic mean force potential **ANOLEA** (optional)
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- Best fully automated structure prediction server in CASP8 (2008)
- Pipeline
  - Template identification
  - Structure assembly
  - Atomic model construction
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## Pipeline

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threading through a PDB structure library using
  - ▶ MUSTER  
profile-profile alignment algorithm
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local meta-threading server including HHSEARCH and 4 others

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- ▶ Continuous fragments: assembled into full-length models
- ▶ Unaligned loops: *ab initio* modeling
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  - ① threading templates
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  - ① general statistic terms from PDB ( $C_{\alpha}$ /side chain correlations, H-bonds, hydrophobicity)
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  - ③ sequence-based contact prediction from SVMSEQ
- ▶ 9 sets of predictions:
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Full-atomic model built by REMO from  $C_{\alpha}$ -traces
  - ▶ Basic backbone atoms: secondary structure specific backbone library
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    - clash/break-amendment
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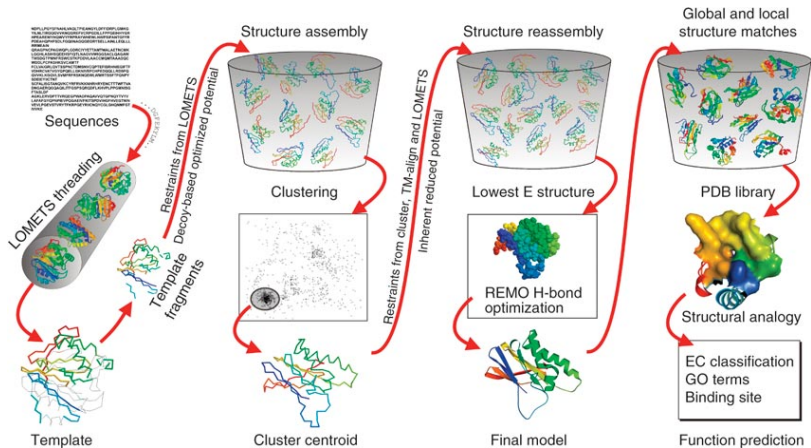
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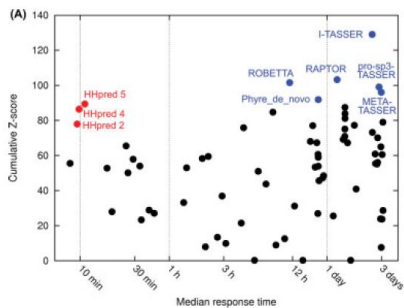
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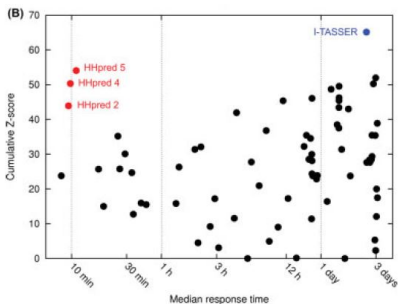


**Figure:** I-TASSER pipeline. (Roy, Kucukural, Yang 2010, I-TASSER: a unified platform for automated protein structure and function prediction.)

# CASP8 results



(a)



(b)

**Figure:** Model accuracy versus response time for the 72 servers in CASP8 (a) on the 164 target domains and (b) on the 85 single-domain targets. (Soeding et al. 2009, Fast and accurate automatic structure prediction with HHpred.)



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