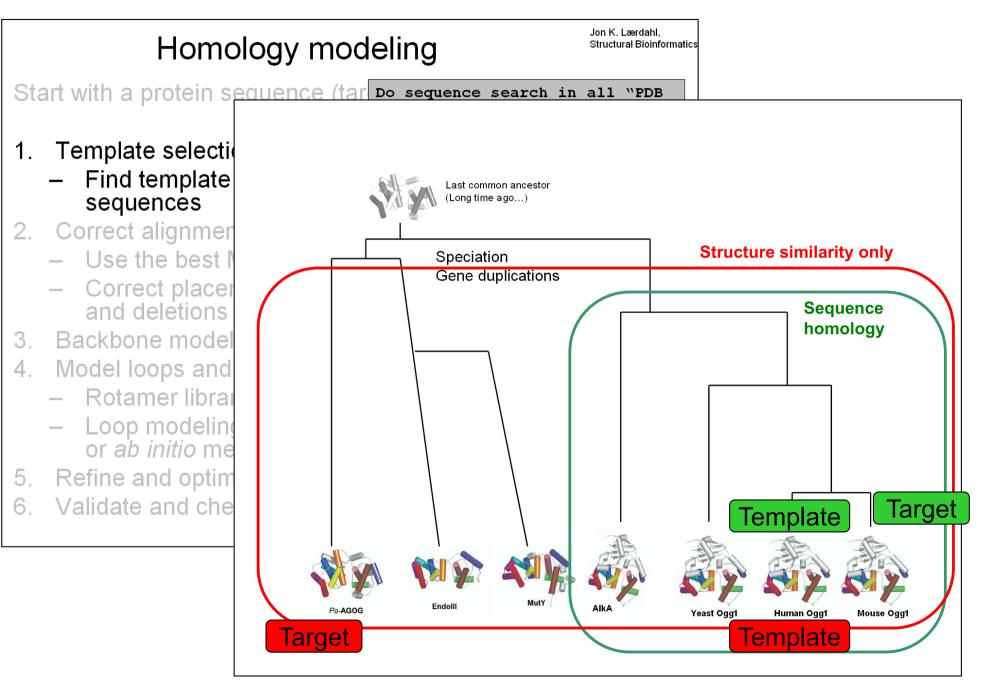
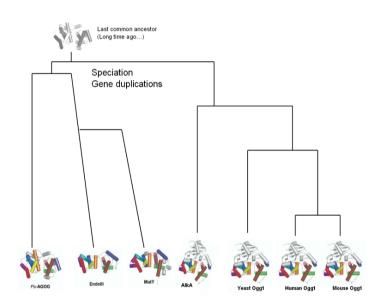
#### When homology modeling does not work?

Jon K. Lærdahl, Structural Bioinformatics



## Threading

- Same as "fold recognition"
- Prediction of the structural fold of a protein sequence by "fitting" the sequence onto structures from a structural database
- Secondary structure prediction is important to choose the best template candidates
- Calculate energy and other parameters for all possibilities
- Choose the best fold, for example the one with the lowest energy
- Detects structural similarity in the absence of sequence similarity
  - GenThreader
  - Phyre2
  - Fugue
- May only be used to generate a rough model
- Threading does *not* give accurate models!
- May be used to detect remote homologs
  - No hits with BLAST or PSI-BLAST?
  - Try threading!
- "BLAST will give you the protein family"
- "Threading will give you the protein superfamily"
- Might argue: threading is more useful for detecting homology than for generating 3D structures



### **Threading/Fold recognition**

#### >Unknown protein

MPARALLPRRMGHRTLASTPALWASIPCPRSELRLDLVL PSGQSFRWREQSPAHWSGVLADQVWTLTQTEEQLHCTVY RGDKSQASRPTPDELEAVRKYFQLDVTLAQLYHHWGSVD

SHFQEVAQKFQGVRLLRQDP GMVERLCQAFGPRLIQLDDV LRKLGLGYRARYVSASARAI EAHKALCILPGVGTKVADCI IAQRDYSWHPTTSQAKGPSP WAQATPPSYRCCSVPTCANP. RWGTLDKEIPQAPSPPFPTS KARHPQIKQSVCTTRWGGGY

What is the structure of this?



 Optional Job description

 Amino Acid Sequence I

 Or try the sequence finder (NEW!)

 Modelling Mode I

 Normal • Intensive •

 Phyre Search

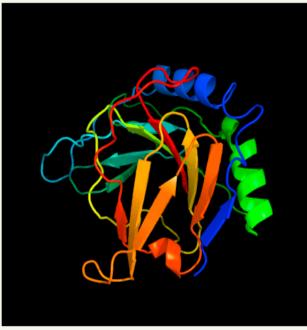
967857 submissions since Feb 14 2011

Phyre<sup>2</sup>

Emailjonkl@medisin.uio.noDescriptionALKBH1\_\_\_\_DateSun Nov 16 15:24:04 GMT 2014Unique Job IDadf2998f1014a31fSequenceMGKMAAAVGS ... Download FASTAJob Expiry29 days Renew for 30 days

Download zip of all results

#### Top model



Model (left) based on template d2fdia1 Top template information Fold:Double-stranded beta-helix Superfamily: Clavaminate synthase-like Family:AlkB-like Confidence and coverage 100.0% Coverage: 50% Confidence: 194 residues ( 50% of your sequence) have been modelled with 100.0% confidence by the single highest scoring template. Additional confident templates have been detected (see Domain analysis) which cover other regions of your sequence. 259 residues ( 67%) could be modelled at >90% confidence using multiple-templates. You may wish to try resubmitting your sequence in "intensive" mode to model more of your sequence. 3D viewing Interactive 3D view in JSmol For other options to view your downloaded structure offline see the FAQ

Image coloured by rainbow N  $\rightarrow$  C terminus Model dimensions (Å): X:42.352 Y:42.991 Z:41.673

#### Threading/Fold recognition

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iew Alignments			Fold/PDB descriptor	Superfamily	Family			
	c2jhnB_ (length:295) 18% i.d.		2.9e-20	100 %	n/a	PDB header:hydrolase	Chain: B: PDB Molecule:3- methyladenine dna- glycosylase;	<b>PDBTitle:</b> 3-methyladenine dna-glycosylase from archaeoglobus fulgidus
	d1orna_ (length:214) 18% i.d.	Jamel & Mol	1.7e-18	100 %	n/a	DNA-glycosylase	DNA-glycosylase	Endonuclease III
	d1m3qa1 (length:190) <b>95% i.d.</b>		3.1e-18	100 %	n/a	DNA-glycosylase	DNA-glycosylase	DNA repair glycosylase, 2 C- terminal domains
	d2abk (length:211) <b>17% i.d.</b>		3.1e-18	100 %	n/a	DNA-glycosylase	DNA-glycosylase	Endonuclease III

#### **Threading/Fold recognition**

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c2jhnB_ (length:295) 18% i.d.	2.9e-20	100 %	n/a	PDB header:hydrolase	Chai Mole meth	HIGH	50.426	0.0004	- 162.3	-4.7	205.0	129	144	345	<u>1ngnA0</u>	a.96.1.2	<b>*</b>
	MDL				glyco	HIGH	50.375	0.0004	- 230.5	-1.5	189.0	141	182	345	2ofkA0	-	
d1orna_ (length:214) 18% i.d.	1.7e-18	100 %	n/a	DNA-glycosylase	DNA												
Janeal B	MDL					MEDIUM	45.432	0.001	- 198.1	-4.1	160.0	142	187	345	<u>1lmzA0</u>	a.96.1.4	- <u>-</u>
d1m3qa1 (length.190) 95% i.d.	3.1e-18	100 %	n/a	DNA-glycosylase	DNA	MEDIUM	45.427	0.001	- 222.5	-4.7	155.0	133	186	345	<u>2jg6A0</u>	-	
d2abk_ (length:211) 17% i.d.	3.1e-18	100 %	n/a	DNA-glycosylase	DNA	LOW	35.934	0.012	- 335.6	-4.2	42.0	259	356	345	2pgeA0	-	
Janeil 🔍	<					LOW	34.659	0.016	- 226.5	-6.1	76.0	147	179	345	2i10A0	a.4.1.9 a.121.1.1	96 <u>1</u>

As for other bioinformatics methods:

- Precision might be overestimated
- The results might be completely wrong
- If several independent tools give the same result it is much more likely to be correct
- Use several tools!

#### 3D structure prediction – Summary 1

3 methods:

*Ab initio* modeling == *De novo* modeling

Knowledge-based modeling:

Homology modeling Threading == Fold recognition

Your results will be predictions: They must be checked with experiments!



### 3D structure prediction - Summary

Start with target sequence

- 2. No good hit with sequence searching:
  - Fold recognition/threading might give correct fold
- 3. No results from fold recognition/threading:
  - You *might* try *ab initio* folding, but the result will most likely be very unreliable

Homology models can be of good quality and might be useful for:

- Docking two or more proteins together
- Designing drugs
- Identifying active sites and amino acids for generating mutant proteins, etc.

Fold recognition/threading might give the protein overall fold and possibly indicate function

If the fold is that of a helical cytokine

Your protein is also possibly a helical cytokine



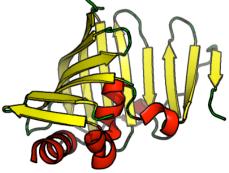


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## How to find a homolog...

- Try blast (will find close homologs) or similar
  - Protein search will find more remote homologs than nucleotide search
- Then try psi-blast (will find less close homologs, that still have some sequence similarity)
- If you known the 3D structure of your query protein, use Dali or similar and search in PDB – will find remote homologs if template structure is known
- Else, try fold recognition might find homologs if template structure is known
- Homology can tell you about function, structure, etc.



## "Modeling" or "Experiment"

nature chemical biology

PUBLISHED ONLINE: 18 SEPTEMBER 2011 | DOI: 10.1038/NCHEMBIO.662

Jon K. Lærdahl.

ARTICLE

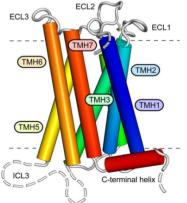
Structural Bioinformatics

# Ligand discovery from a dopamine D<sub>3</sub> receptor homology model and crystal structure

Jens Carlsson<sup>1,5</sup>, Ryan G Coleman<sup>1,5</sup>, Vincent Setola<sup>2,5</sup>, John J Irwin<sup>1</sup>, Hao Fan<sup>1,3,4</sup>, Avner Schlessinger<sup>1,3,4</sup>, Andrej Sali<sup>1,3,4</sup>, Bryan L Roth<sup>2\*</sup> & Brian K Shoichet<sup>1\*</sup>

G protein-coupled receptors (GPCRs) are intensely studied as drug targets and for their role in signaling. With the determination of the first crystal structures, interest in structure-based ligand discovery increased. Unfortunately, for most GPCRs no experimental structures are available. The determination of the  $D_3$  receptor structure and the challenge to the community to predict it enabled a fully prospective comparison of ligand discovery from a modeled structure versus that of the subsequently released crystal structure. Over 3.3 million molecules were docked against a homology model, and 26 of the highest ranking were tested for binding. Six had affinities ranging from 0.2 to 3.1  $\mu$ M. Subsequently, the crystal structure was released and the docking screen repeated. Of the 25 compounds selected, five had affinities ranging from 0.3 to 3.0  $\mu$ M. One of the new ligands from the homology model screen was optimized for affinity to 81 nM. The feasibility of docking screens against modeled GPCRs more generally is considered.

PCRs are a large family of membrane proteins that are critical for signal transduction. They have been a major focus of pharmaceutical research and are the primary targets of almost 30% of approved drugs<sup>1</sup>. All of these drugs were discovered without the aid of receptor structures by classical ligand-based medicinal chemistry. Accordingly, many of these drugs reflect their origins as mimics of natural signaling molecules. The determination of the first drug-relevant GPCR structures in the last 4 years<sup>2-4</sup> has opened up opportunities for structure-based discovery



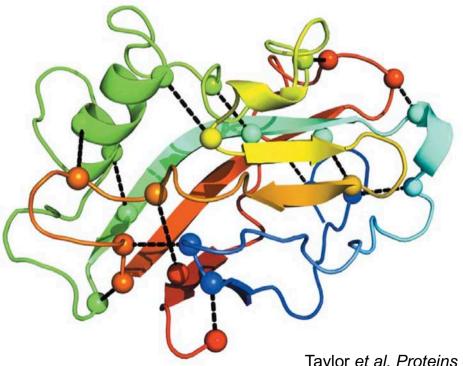
## CASP: Critical Assessment of Techniques for Protein Structure Prediction

- Benchmarking of structure prediction tools

STOP RUSSIA'S INVASION IN UKRAINE	Protein Structure Prediction Center	合 🗈 🗄 (
Menu	Welcome to the Protein Structure Prediction Center!	Message Board
Menu Home FORCASP Forum PC Login PC Registration CASP Experiments CASP ROLL CASP ROLL CASP11 (2014) Home Targets Target List Target List Target Submission CASP10 (2012) CASP9 (2010) CASP8 (2008) CASP7 (2006) CASP6 (2004) CASP5 (2002) CASP4 (2000) CASP5 (2002) CASP4 (2000) CASP3 (1998) CASP2 (1996) CASP1 (1994) Initiatives Data Archive Local Services Proceedings Feedback Assessors People Community Resources	Our goal is to help advance the methods of identifying protein structure from sequence. The Center has been organized to provide the means of objective testing of these methods via the process of blind prediction. The Critical Assessment of protein Structure Prediction (CASP) experiments aim at establishing the current state of the art in protein structure prediction, identifying what progress has been made, and highlighting where future effort may be most productively focused. There have been ten previous CASP experiments. The eleventh experiment will start in May 2014. Description of these experiments and the full data (targets, predictions, interactive tables with numerical evaluation results, dynamic graphs and prediction visualization tools) can be accessed following the links: CASP1 (1994) [CASP2 (1996) [CASP3 (1998) ] CASP4 (2000) ] CASP5 (2002) ] CASP6 (2004) ] CASP7 (2006) ] CASP8 (2008) [ CASP9 (2010) ] CASP10 (2012) ] CASP11 (2014) Raw data for the experiments held so far are archived and stored in our <u>data archive</u> . In November 2011 we have opened a new rolling CASP experiment for all-year-round testing of ab initio modeling methods: CASP ROLL Details of the experiments have been published in a scientific journal <i>Proteins: Structure, Function and Bioinformatics</i> . CASP arroceedings include papers describing the structure and conduct of the experiments, the numerical evaluation measures, reports from the assessment teams highlighting state of the art in different prediction categories, methods from some of the most successful prediction measures and progress in various aspects of the modeling. Prediction methods are assessed on the basis of the analysis of a large number of blind predictions of protein structure. Summary of numerical evaluation of the appers [11], [21]. The latter paper also contains explanations of data handling procedures and guidelines for navigating the data presented on this website. Some of the best performing methods are implemented as fully automated servers and therefore ca	Message Board         CASP11 registration opens March 31         Dear CASP Participants, Exiting news: new CASP experiment is just around the corner! We hope that you are full of enthusiasm and anxiety (as we are) and have your computers greased and warmed up,,         Resuming CASP ROLL         Dear CASPers, Best regards for all of you in the New Year! Hoping that you had good rest after the CASP10 experiment and meeting, we are resuming CASP ROLL with two new targets later this week         Predictors meeting in Gaeta         Dear CASP10 Participants, On the last day of the Meeting we will have our regular Predictors gettogether. In advance, I would like to ask you to send in any comments regarding the CASP process in
	S     S     S     Discussion Forum       P     P     P     11	

## Contact assisted methods

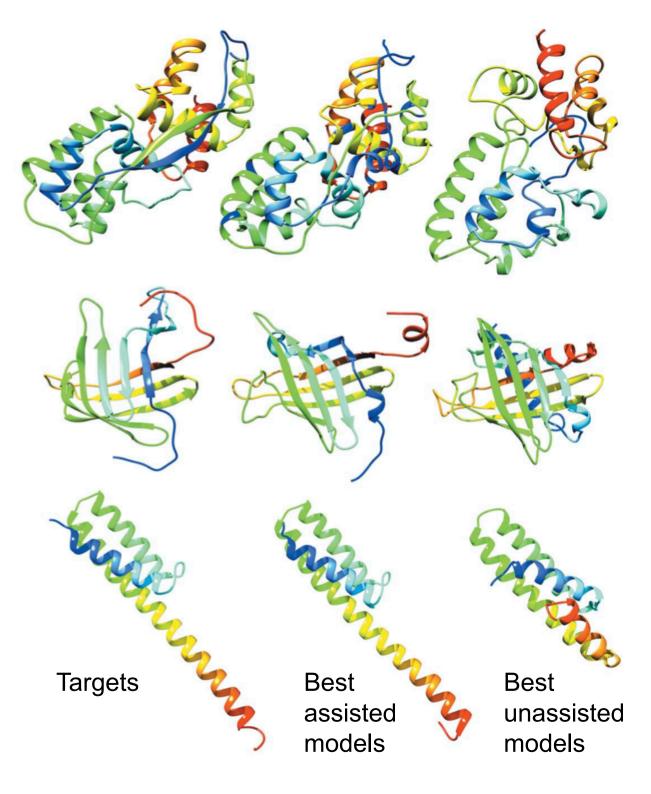
 Use the methods we have discussed, but in addition, information on residues that are close together in 3D space



Taylor et al. Proteins 82, 84 (2014)

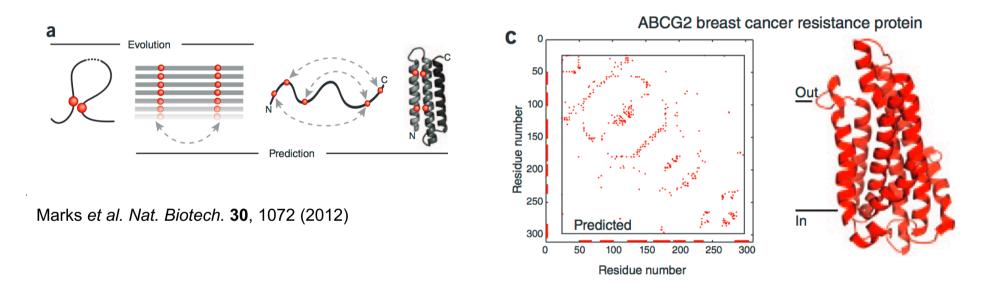
## Contact assisted methods

Taylor et al. Proteins 82, 84 (2014)



## Contact assisted methods

Co-evolution/co-variation from MSAs



- Experimental methods
  - -NMR
  - Crosslinkers & MS
- Promising field!

## End

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