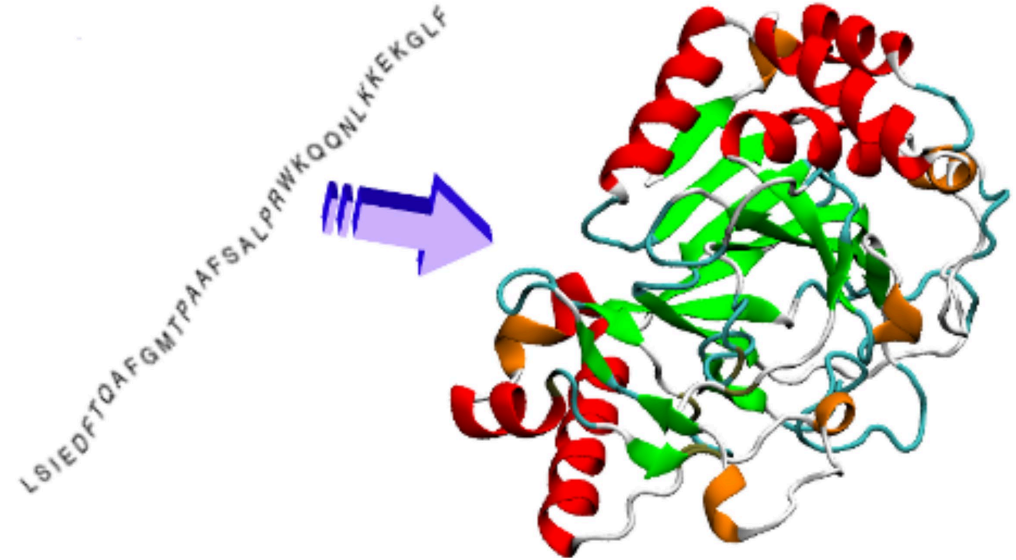


# CASP14: Critical Assessment of Structure Prediction



- Rigor
- Transparency
- Collaboration
- Communication



Advancing solutions to the Protein Folding Problem

# CASP Requirements

- Many Targets.
- Each Participant makes many predictions.
- Many Participants.
- Gold standard
- Head-to-head methods comparison
- Clear Metrics
- Authoritative evaluation.

# Founders and Organizers



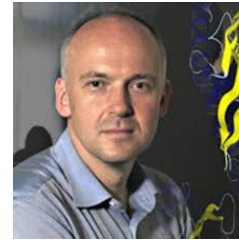
Anna Tramontano



Krzysztof Fidelis



Andriy Kryshatfovych



Torsten Schwede



Maya Topf



Jan Pedersen



Tim Hubbard



Steve Bryant



Burkhard Rost

# CASP14 ASSESSORS

- Topology
- High accuracy modeling
- Refinement
- Contacts
- Accuracy estimation
- Assemblies
- CAPRI
- Function

Nick Grishin, Lisa Kinch



Andrie Lupus, Joana Pereira, Marcus Harman



Dan Rigden



Alfonso Valencia, Rosalba Lepore



Chaok Seok



Ezgi Karaca



Marc Lesink, Shoshana Wodak

Sandor Vadja, Dima Kozakov

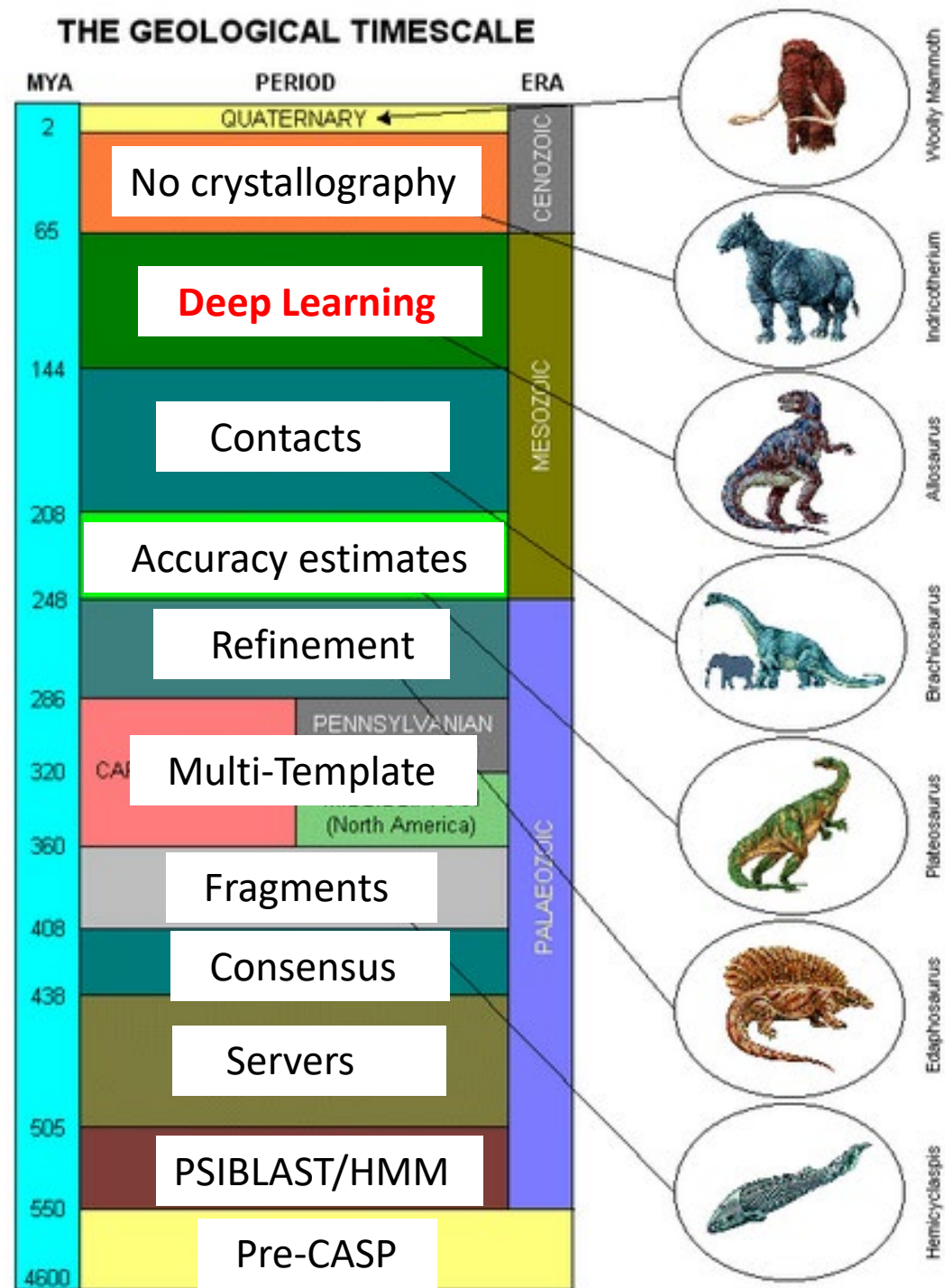


# How this meeting (should) work

- Main zoom sessions
- Main interface – posters links, How to, link to Airmeet
- Airmeet lounge – help, informal meetings, poster sessions.
- DISCORD channels
- Extra sessions
- Ongoing interest groups

Protein structure  
Refinement  
Protein Assemblies  
Contacts and Distances  
Accuracy Estimation  
Deriving function  
Covid and CASP  
The future of deep learning

# CASP Punctuated Equilibrium



# Correlated Mutations and Residue Contacts in Proteins

Ulrike Göbel, Chris Sander, Reinhard Schneider, and Alfonso Valencia

*Protein Design Group, European Molecular Biology Laboratory, D-69012 Heidelberg, Germany.*

**ABSTRACT** The maintenance of protein function and structure constrains the evolution of amino acid sequences. This fact can be exploited to interpret correlated mutations observed in a sequence family as an indication of probable physical contact in three dimensions. Here we present a simple and general method to analyze correlations in mutational behavior between different positions in a multiple sequence alignment. We then use these correlations to predict contact maps for each of 11 protein families and compare the result with the contacts determined by crystallography. For the most strongly correlated residue pairs predicted to be in contact, the prediction accuracy ranges from 37 to 68% and the improvement ratio relative to a random prediction from 1.4 to 5.1. Predicted contact maps can be used as input for the calculation of protein tertiary structure, either from sequence information alone or in combination with experimental information. © 1994 Wiley-Liss, Inc.

**Key words:** protein structure prediction, predicted contact maps, correlated mutations

tions, differential replication of genetic information depending on genotype and phenotype, and elimination of cells containing dysfunctional or noncompetitive sequences. When functionally negative point mutations are compensated for by other mutations, the cells may survive and with it the protein sequence information. We need to learn how to extract information about the various types of evolutionary constraints from multiple sequence data and then exploit this information for the prediction of three-dimensional structure, via distance constraints.

## Functional or Structural Constraints?

Given many sequences in a protein family, the first tasks in decoding the observed mutational patterns are to identify constrained sequence changes on a background of neutral mutational drift, i.e., to separate signal from noise, and to separate the effects of structural constraints from those of functional constraints that have no structural implications. The task is difficult for several reasons. First, evolutionary constraints are not directly observable, as they specify which attempted point mutations would lead to the elimination of a particular genotype from a population. Second, the distinction between functional and structural constraints is not clear-cut: e.g., mutations in some residues may af-



Drag image to reposition. Double click to magnify further.



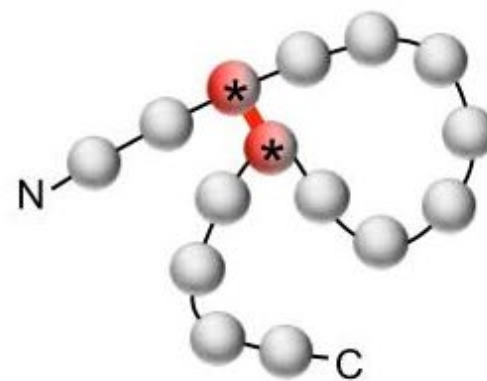
T	R	L	T	L	T	A	K	K	D	G	P	C	D
T	R	L	T	L	T	A	K	K	D	G	P	C	D
T	R	L	T	L	T	A	K	K	D	G	P	C	D
T	K	L	C	L	T	A	K	K	E	G	P	K	D
T	K	L	T	L	T	A	K	K	E	G	P	K	D
T	K	L	T	L	G	A	K	K	E	G	G	C	D
T	W	L	T	L	T	A	K	K	V	G	P	C	D
T	W	L	T	L	T	A	K	K	V	G	P	C	D



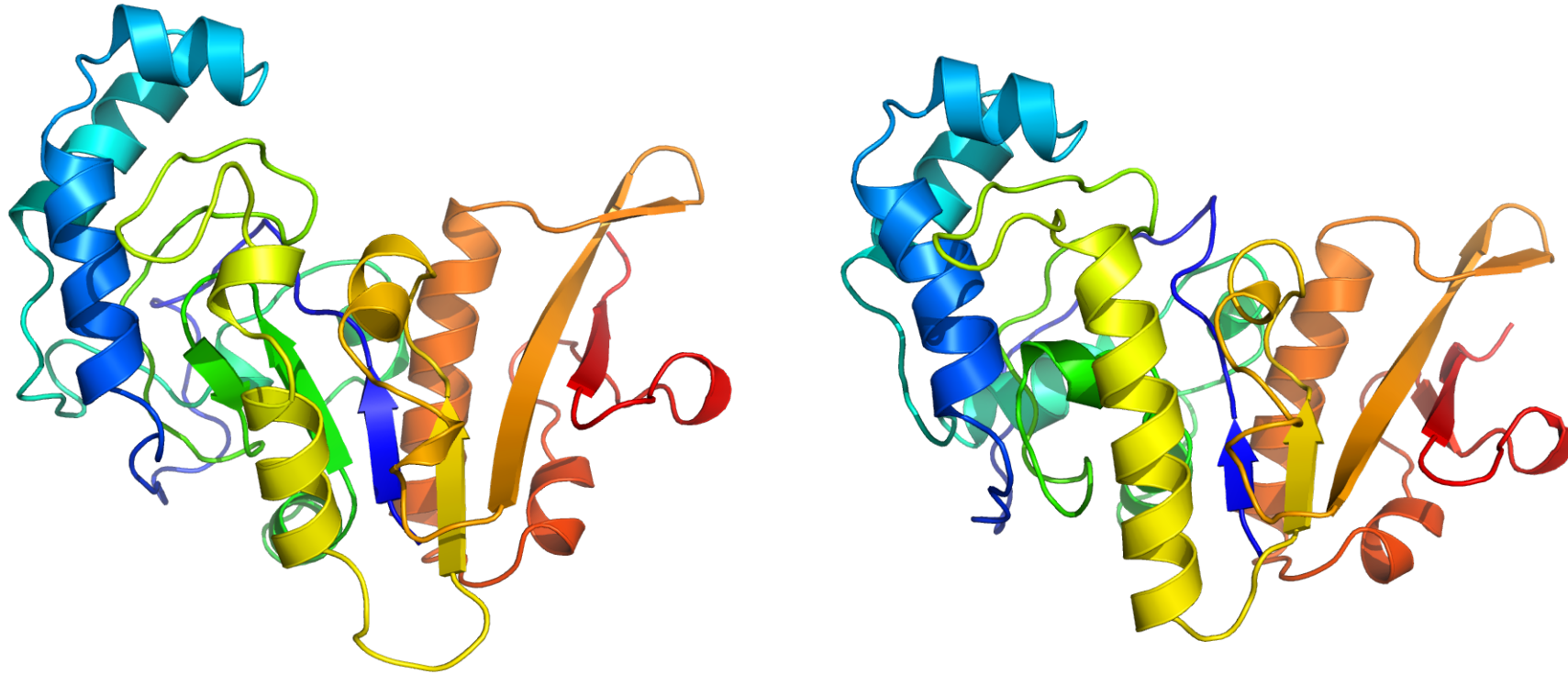
correlated

constraint

inference



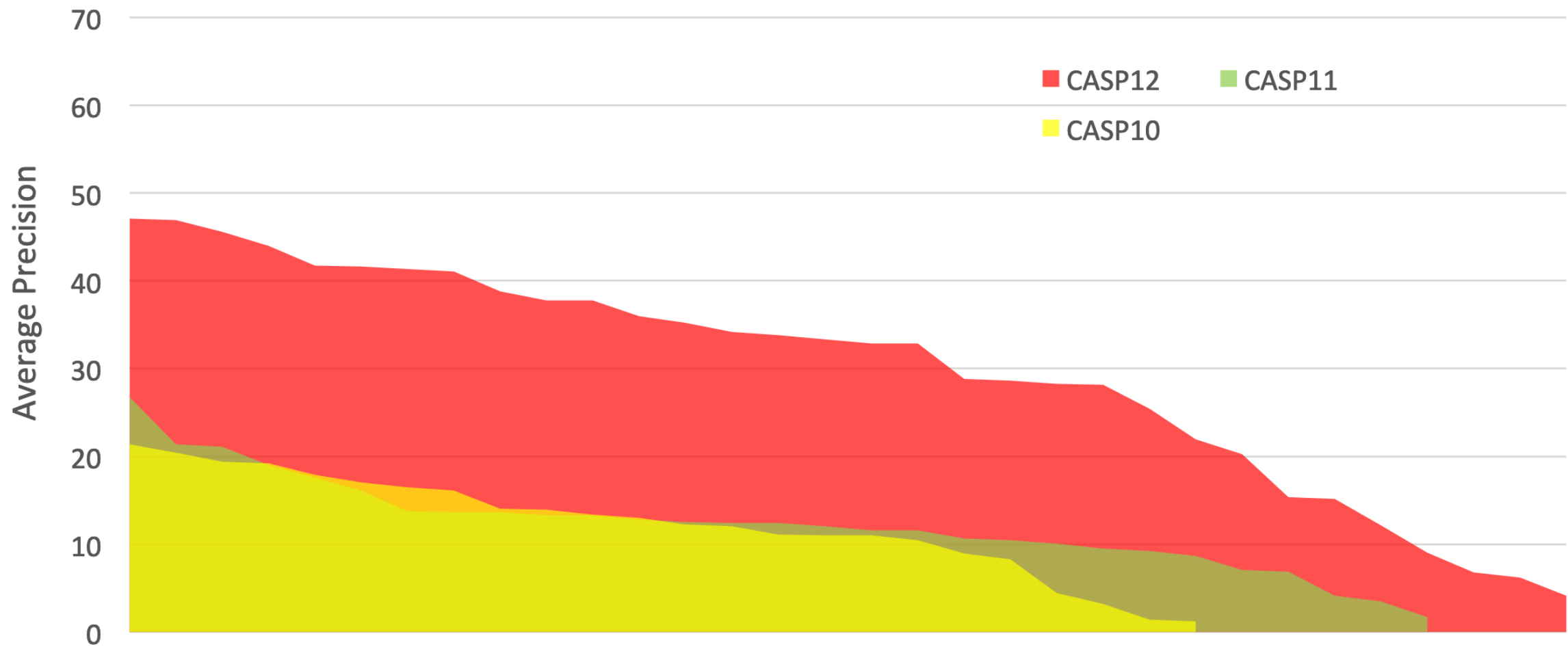
contact in 3D

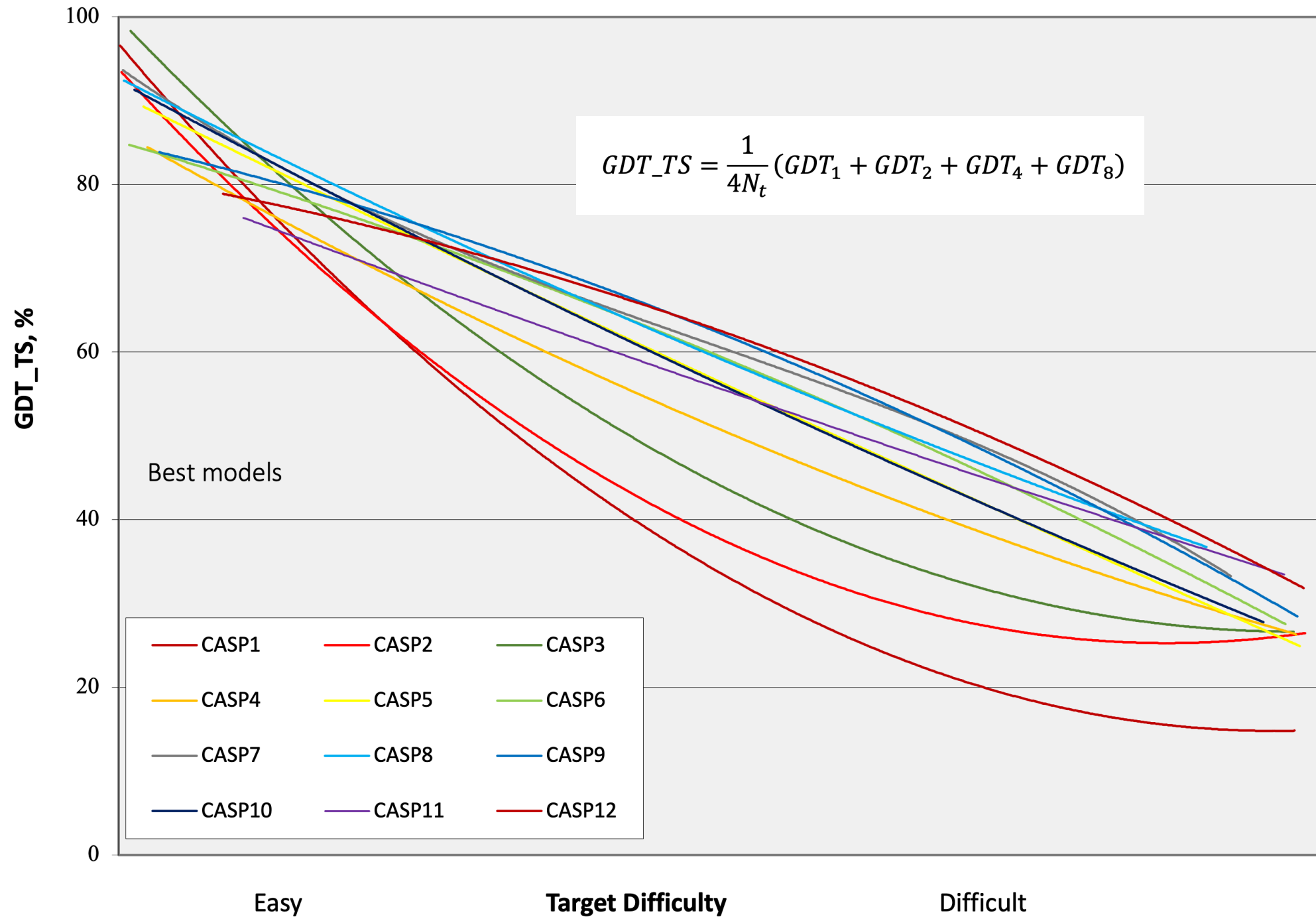


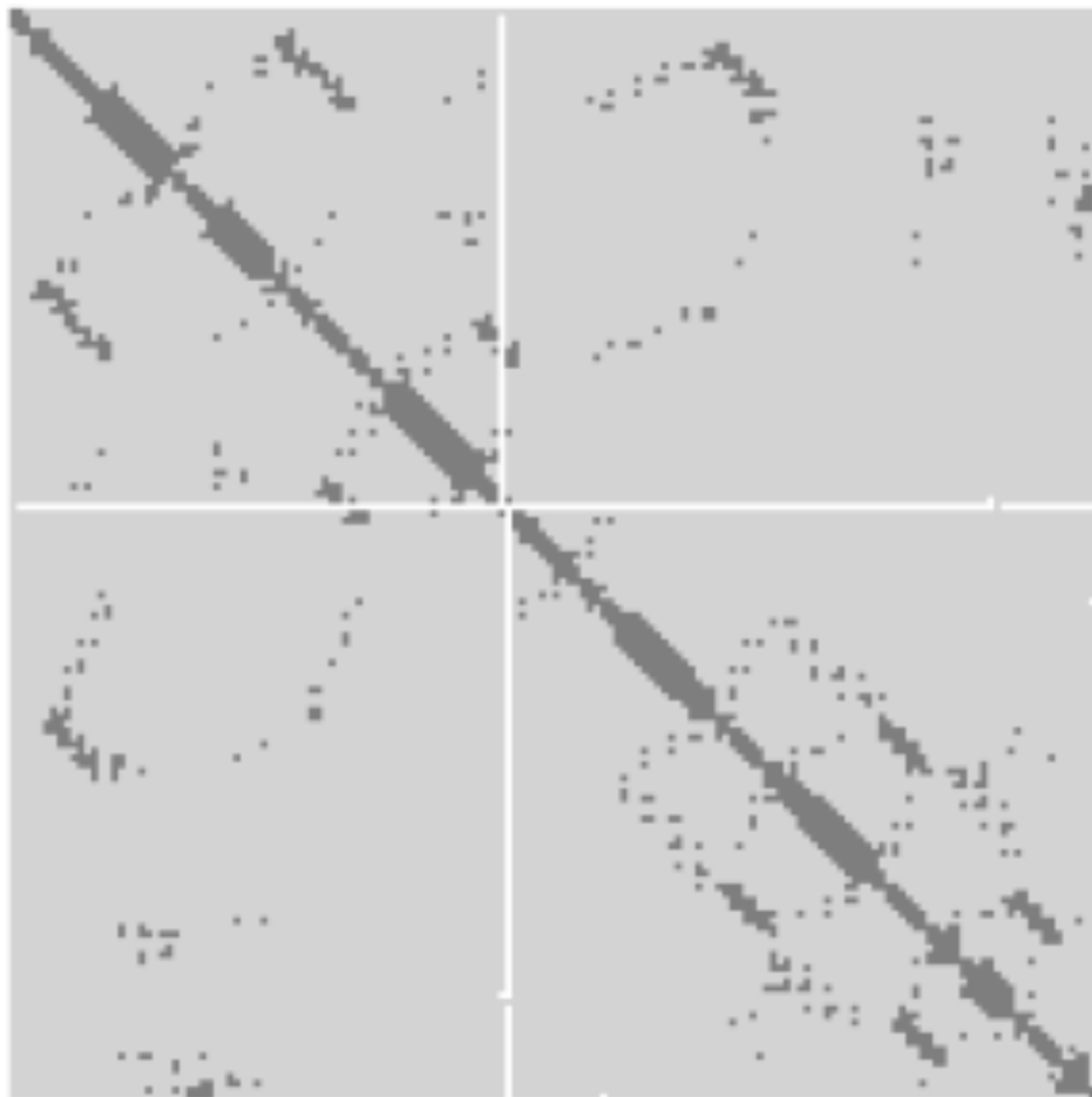
‘So, either this group is close to solving the folding problem or they cheated somehow.’

Nick Grishin

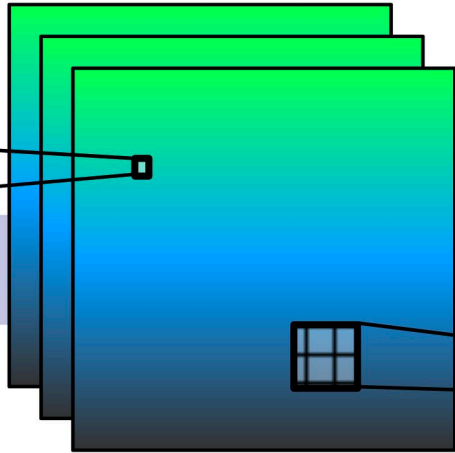
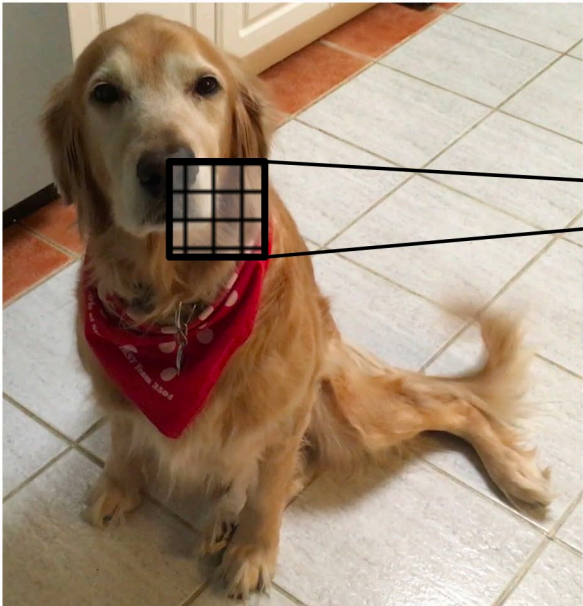
# Long contacts, L/5 lists



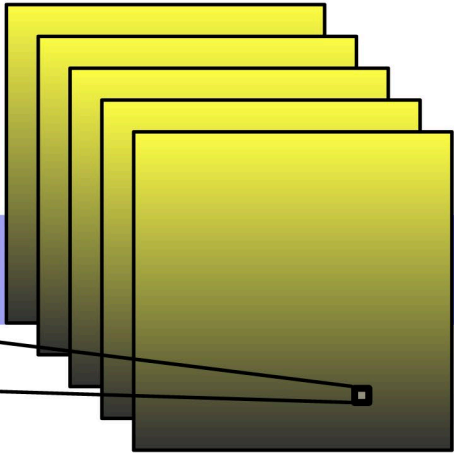




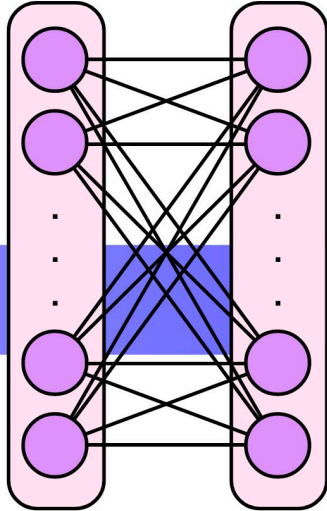
# Convolutional Neural Networks



Convolution  
Feature Maps



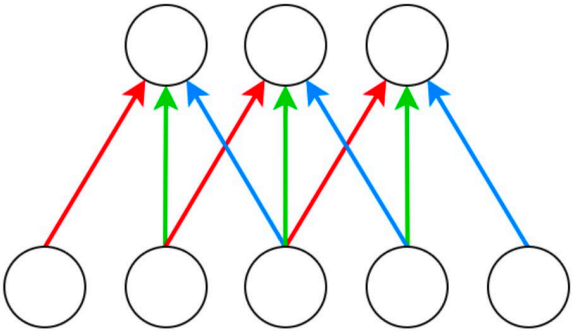
Convolution  
Feature Maps



Fully Connected  
Traditional NN

Dog: 0.99  
Cat: 0.02

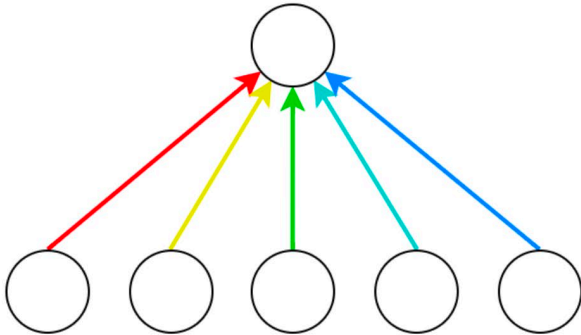
Convolution



— weight 1  
— weight 2  
— weight 3

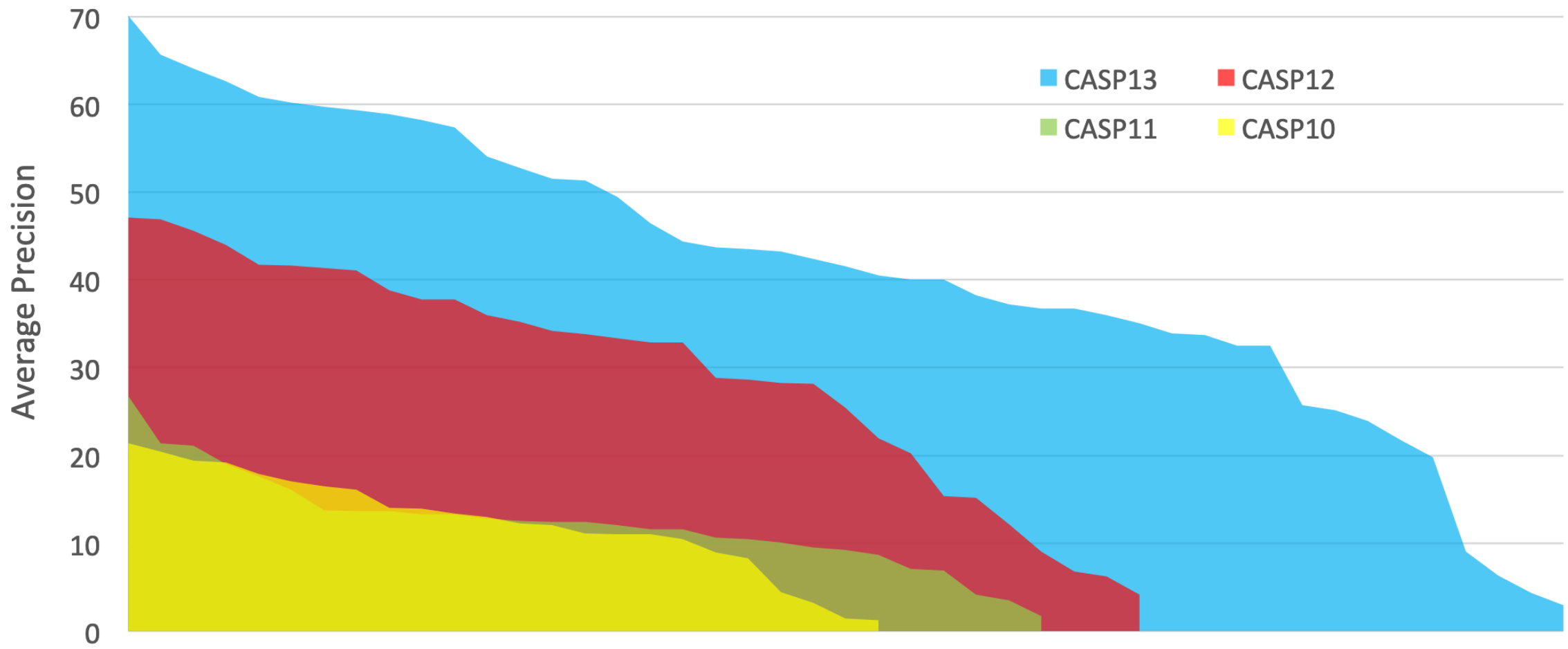
David Koes, CASP13

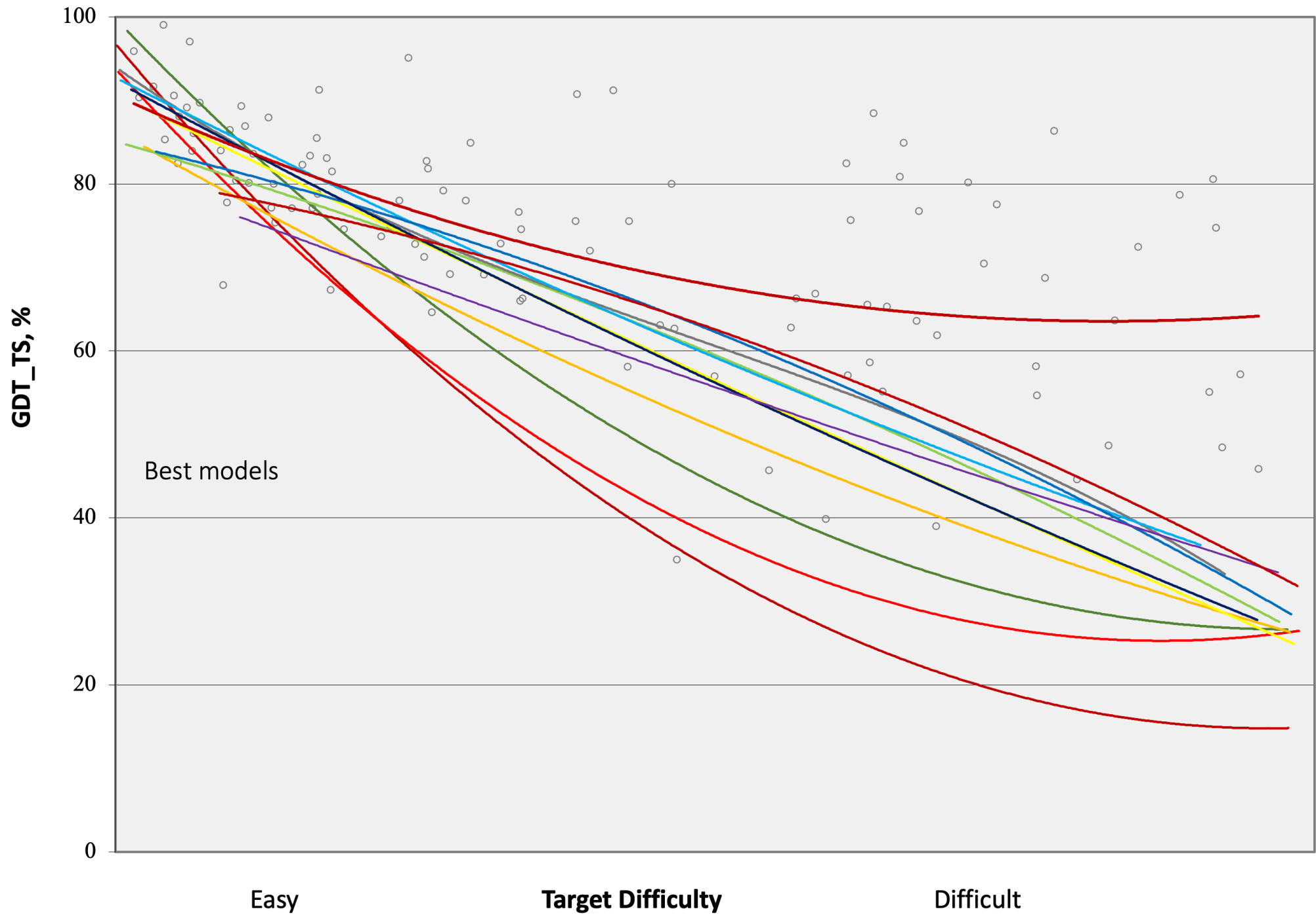
Fully-connected



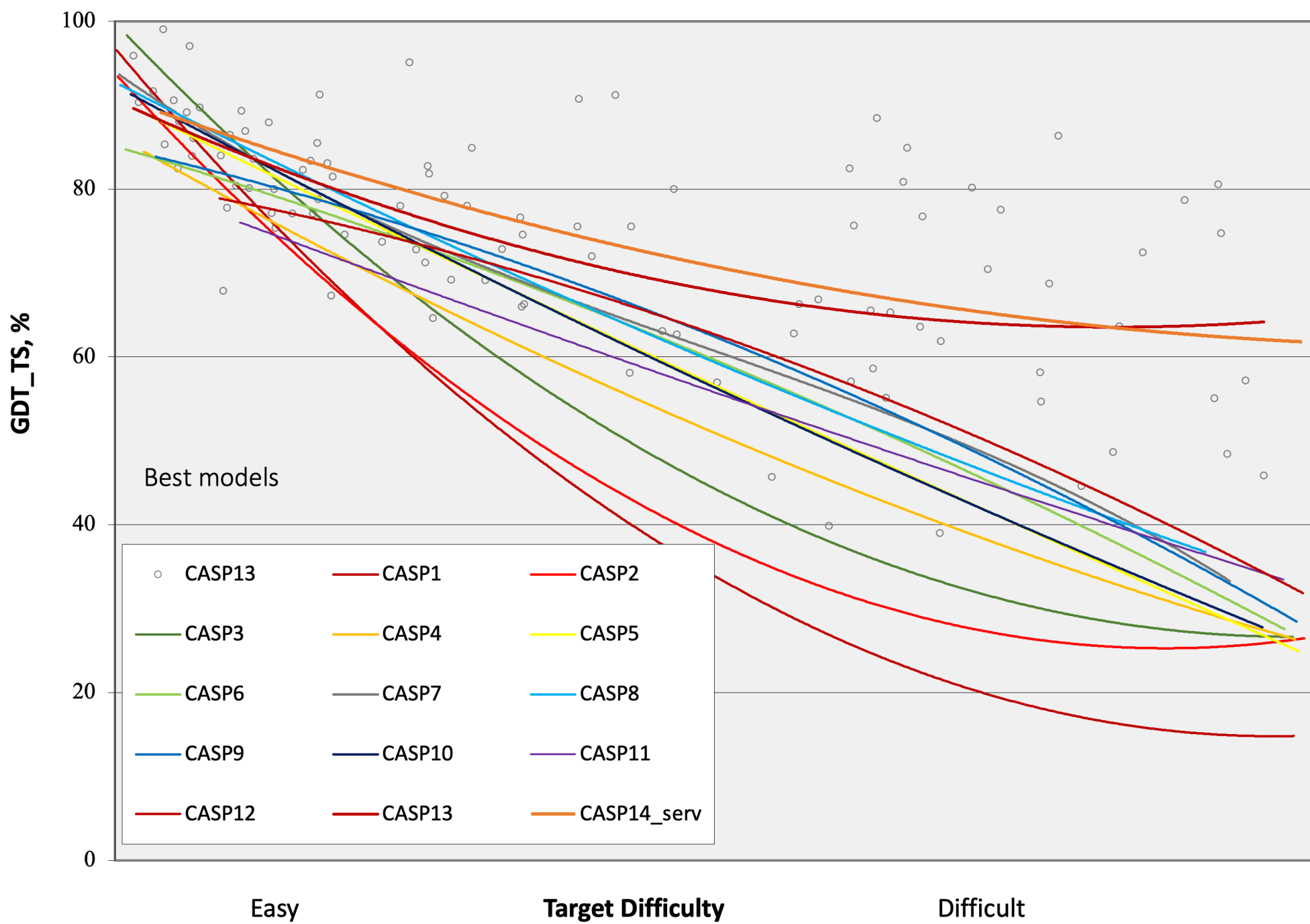
— weight 1  
— weight 2  
— weight 3  
— weight 4  
— weight 5

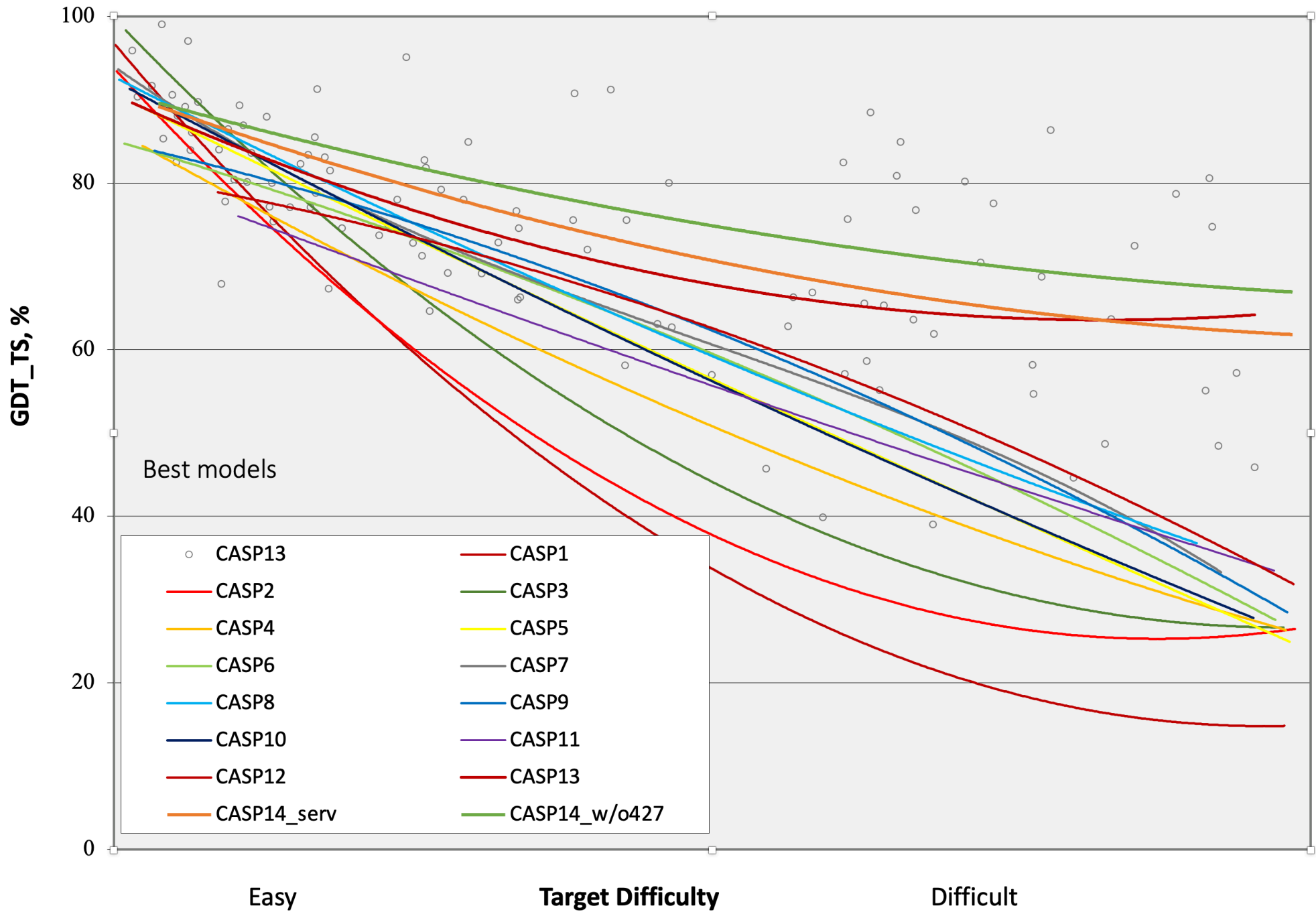
Long contacts, L/5 lists



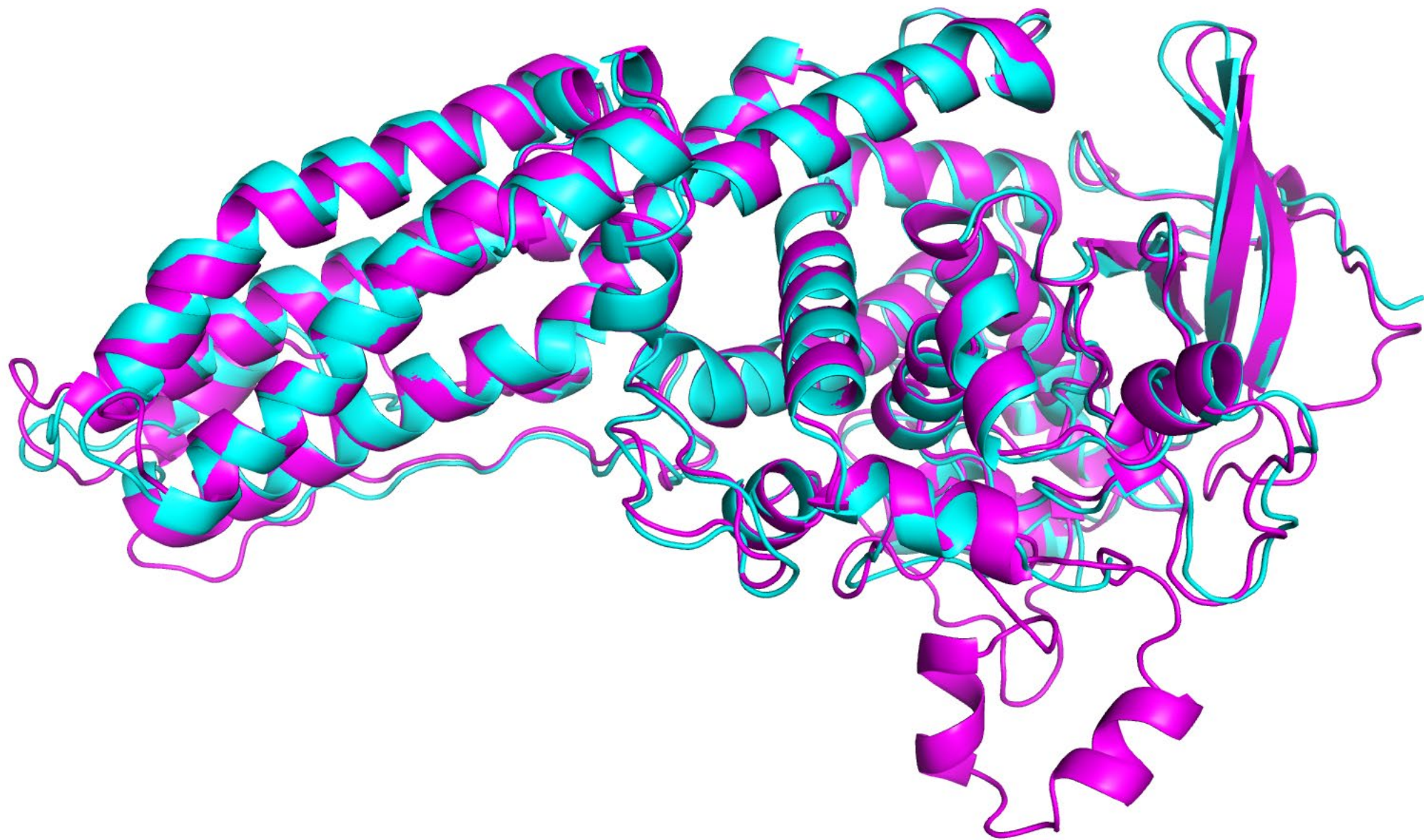


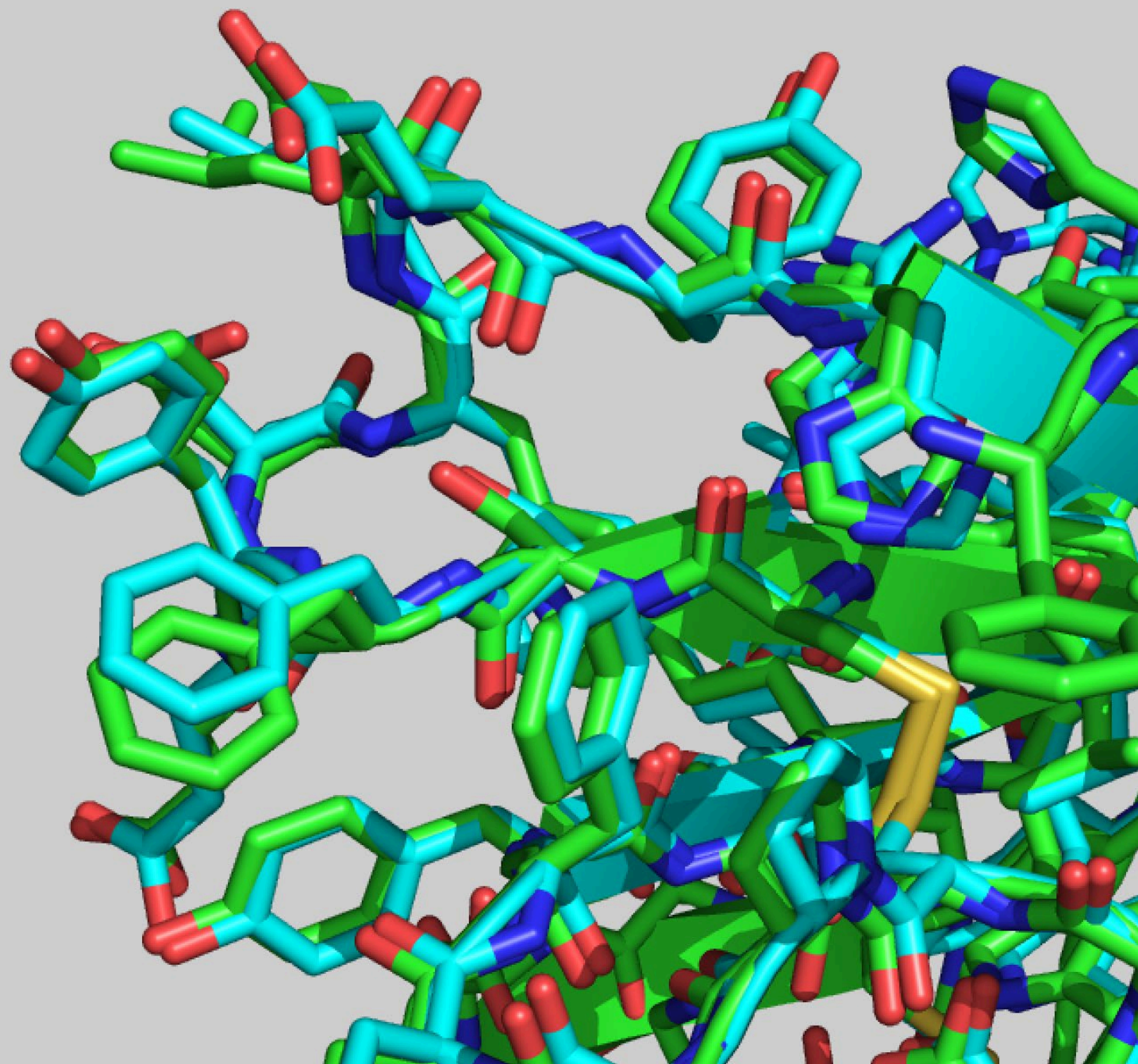












# Not an end, but a Beginning: The door is open to?:

- Protein complexes
- Accuracy estimation
- Protein design
- Protein dynamics
- Protein conformational change
- Preferred conformations of disordered proteins
- Mutation interpretation
- Ligand docking