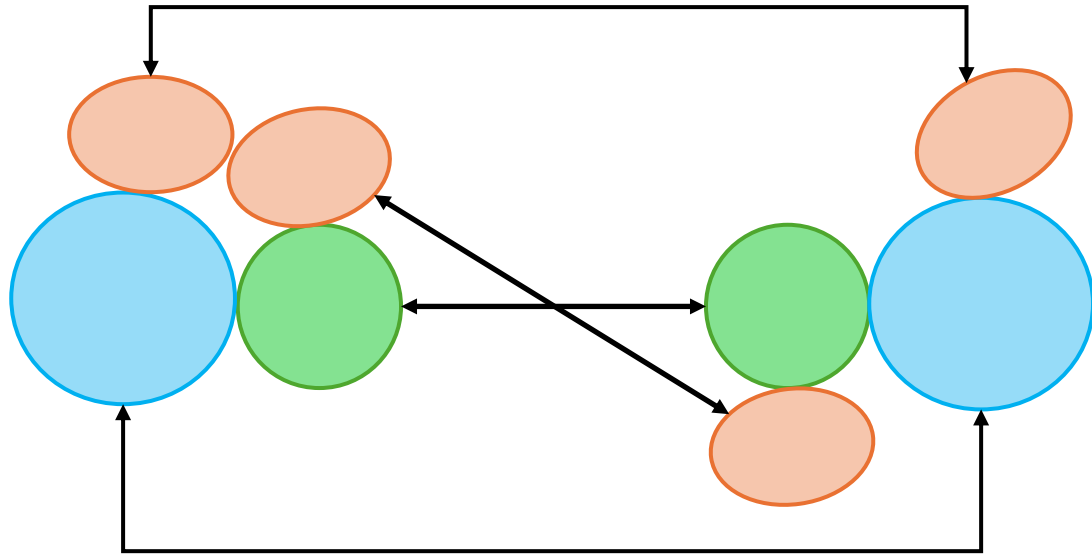


# **Analysis and evaluation of CASP16 protein oligomer predictions**

**Rongqing Yuan, Jing Zhang, Andriy Kryshafovych, Gabriel Studer,  
Nick V. Grishin, and Qian Cong**

**University of Texas Southwestern Medical Center**

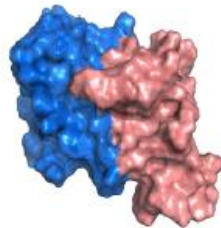
# The classic oligomer scoring routine in CASP



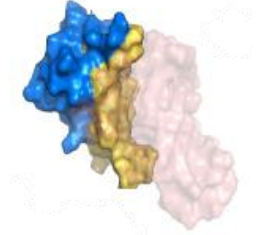
**Assembly/Global:**

IDDT

TM score



**Interface/Local:**



DockQ: interface size-weighted average

$$\text{IPS}(M, T) = J_C(M, T) = \frac{|M_{\text{i-Res}} \cap T_{\text{i-Res}}|}{|M_{\text{i-Res}} \cup T_{\text{i-Res}}|}$$

$$\text{ICS}(M, T) = 2 \cdot \frac{P(M_{\text{cnt}}, T_{\text{cnt}}) \times R(M_{\text{cnt}}, T_{\text{cnt}})}{P(M_{\text{cnt}}, T_{\text{cnt}}) + R(M_{\text{cnt}}, T_{\text{cnt}})}$$

$$\text{QS-best}(M, T) = \frac{|M_{\text{cnt}} \cap T_{\text{cnt}}|}{\max(M_{\text{cnt}}, T_{\text{cnt}})}$$

# An overview of oligomer targets and groups in CASP16

**AF2**    ■ Y    ■ N    ■ N/A

**AF3**    ■ Y    ■ N    ■ N/A

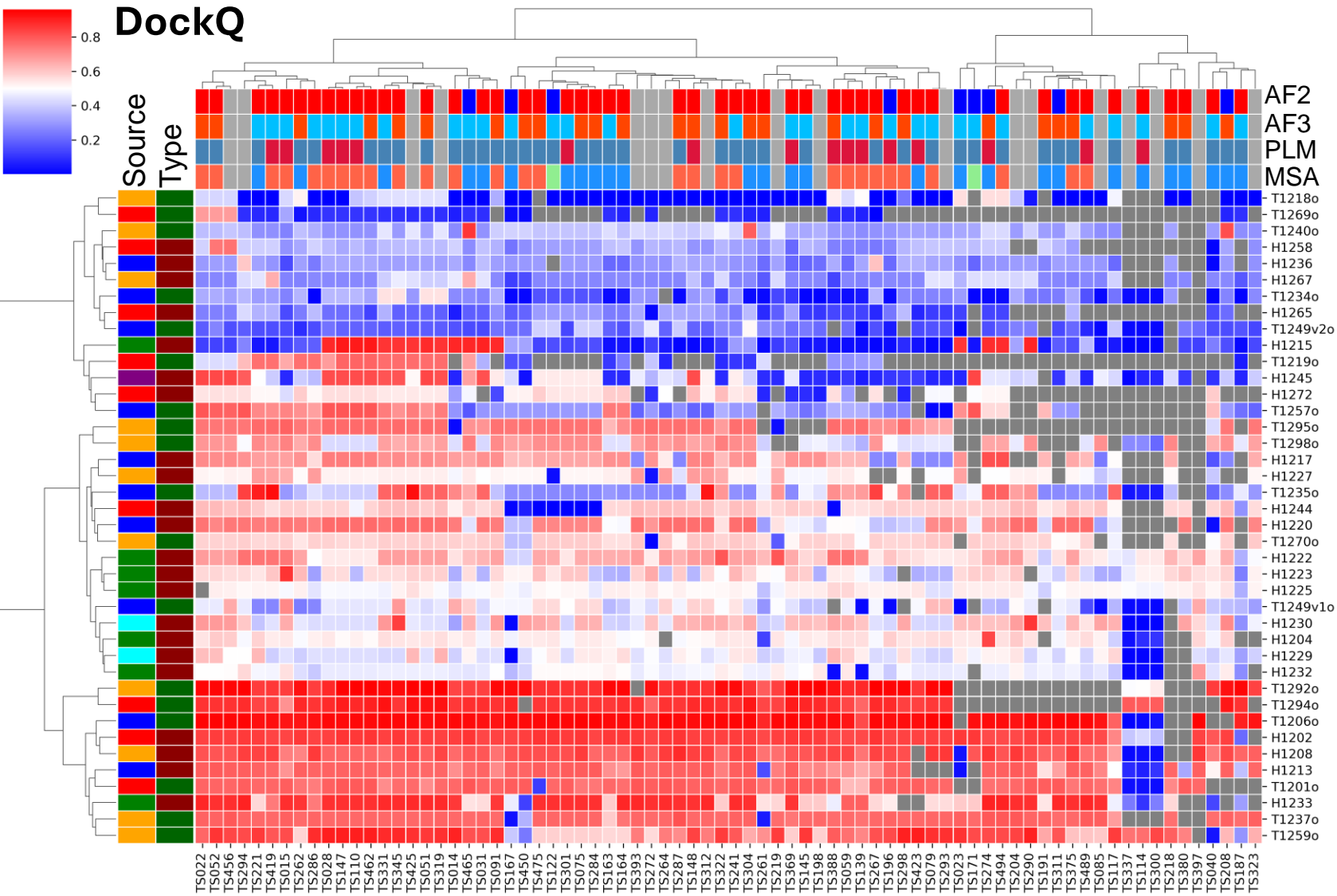
**PLM**    ■ Y    ■ N    ■ N/A

**MSA**    ■ No MSA    ■ N/A

■ Enhanced MSA    ■ Use MSA

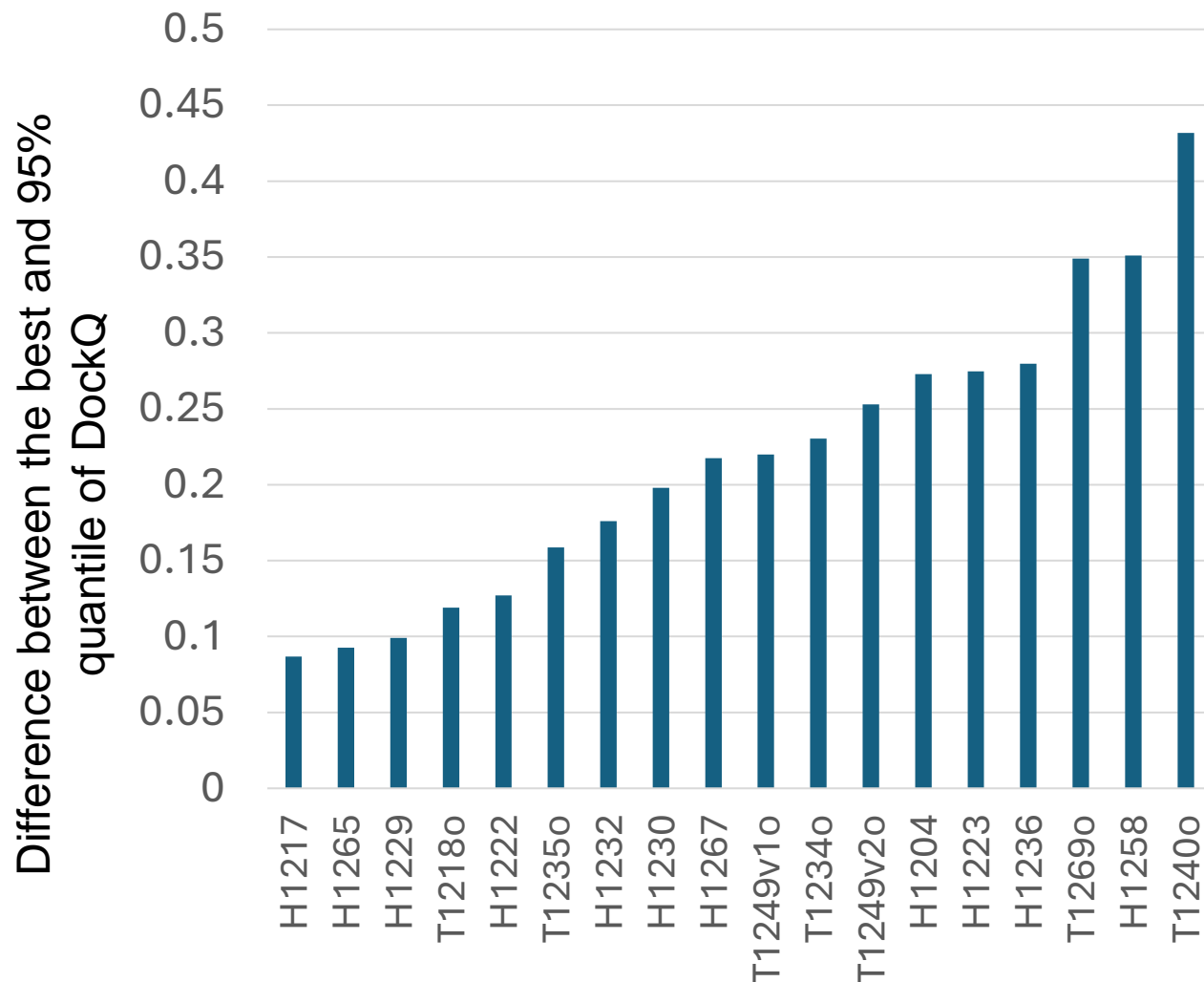
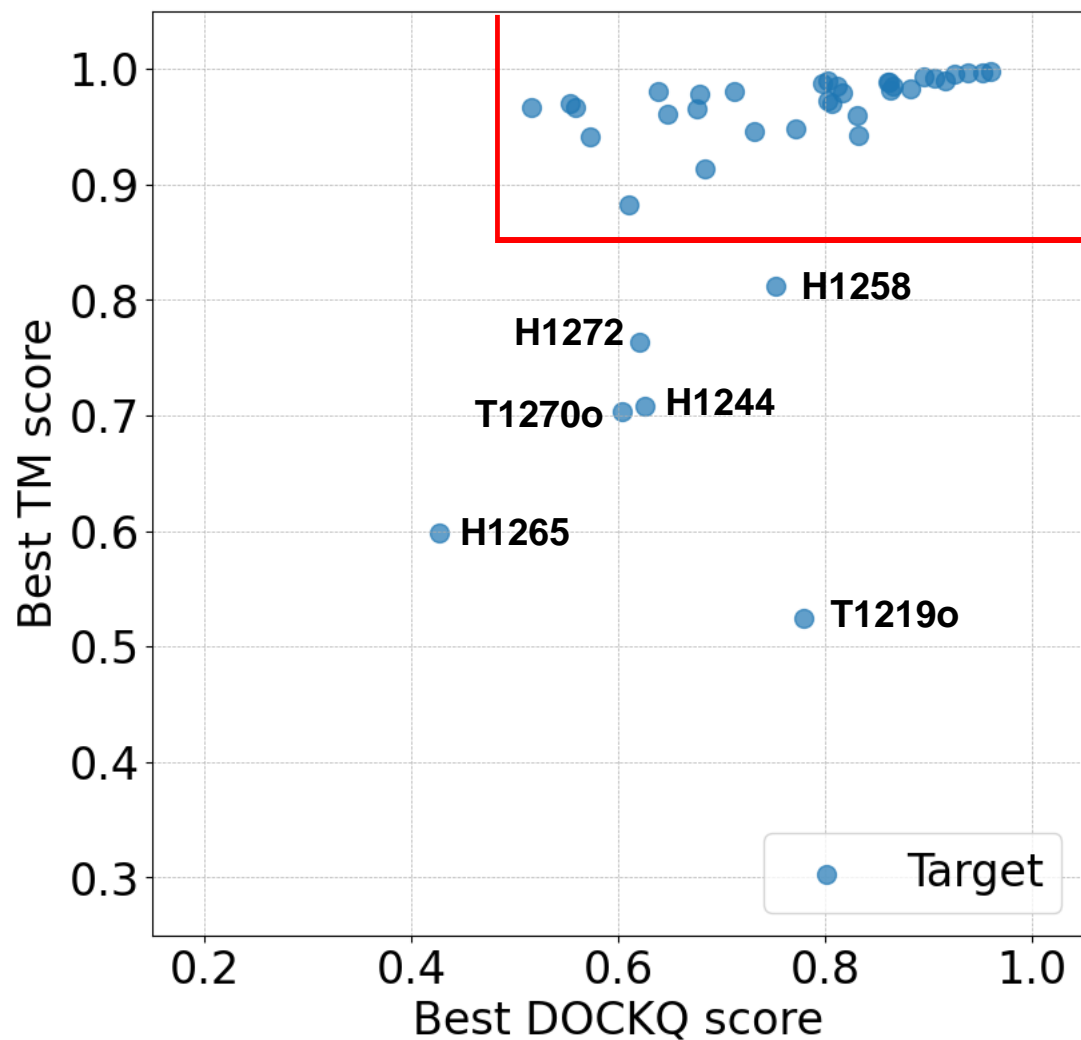
**Type**    ■ hetero-oligomer (22)  
            ■ homo-oligomer (18)

**Source**    ■ eukaryotes (9)  
              ■ bacteria (11)  
              ■ viral (10)  
              ■ antibody-antigen (7)  
              ■ viral protein-human (2)  
              ■ singleton (1)

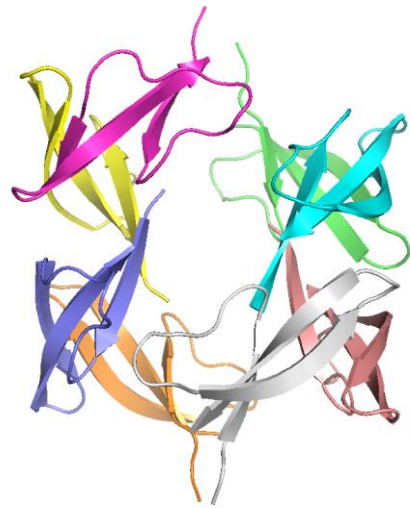
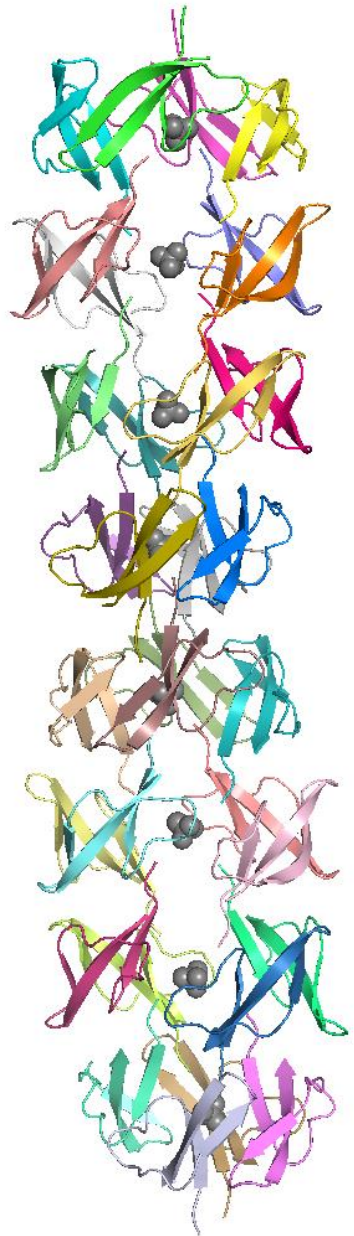


**What targets are still challenging for  
the community?**

# What targets are still challenging for the community?

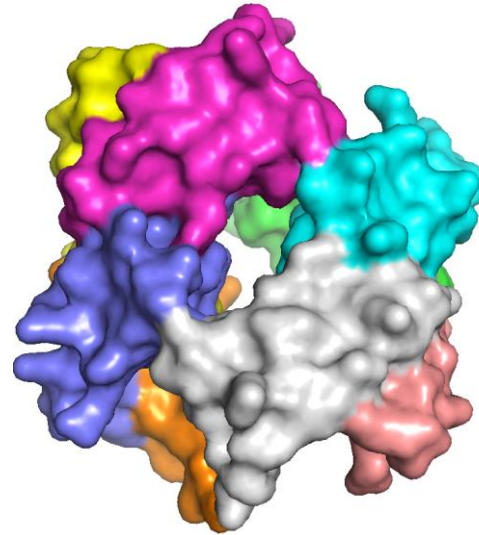


# Challenge 1: filament maintained by weak interactions



**T1219o target**

**Specified stoichiometry: An**



**T1219o model**



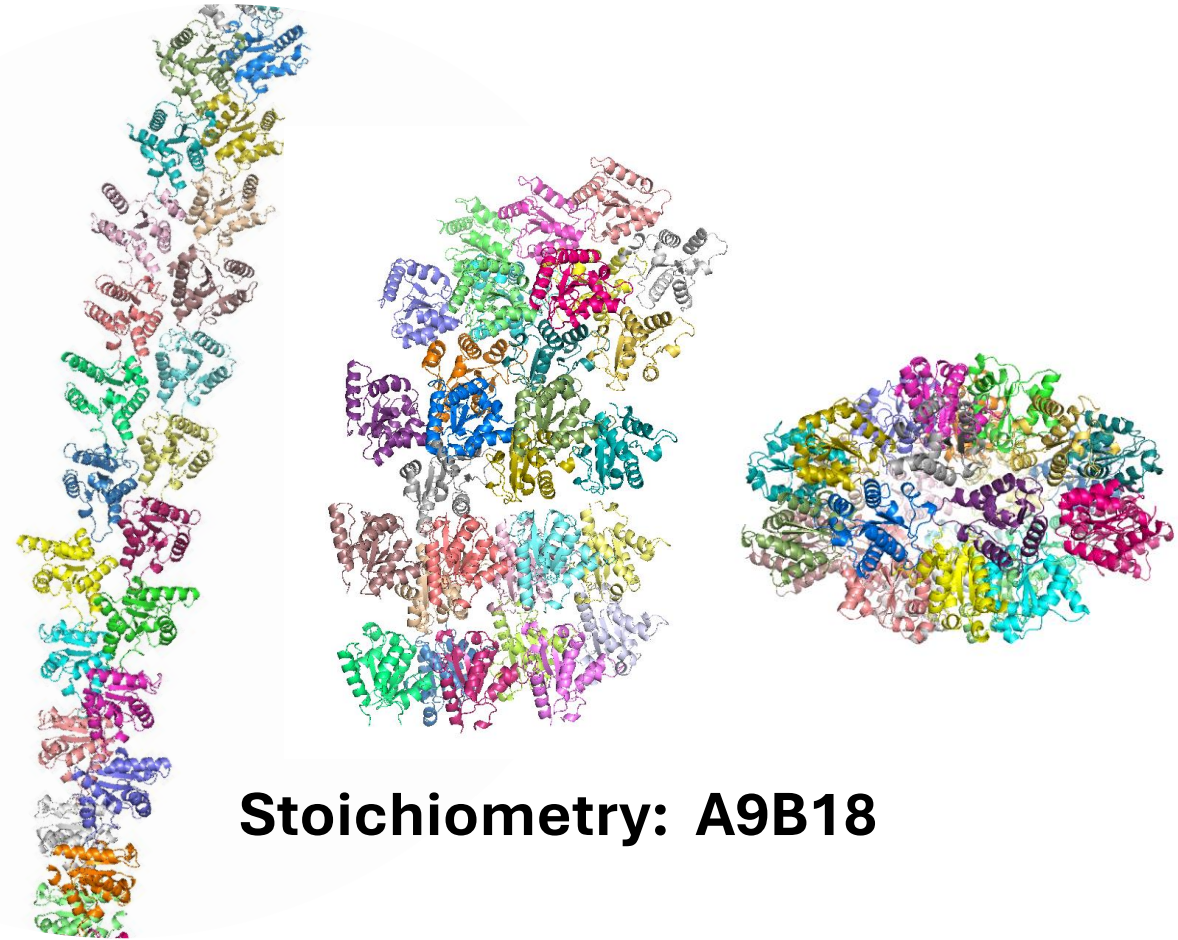
**3D structure of  
the exact protein  
(PDB: 1zmq)**



# Challenge 2: multiple possible interfaces between proteins and unusual shape of protein complex



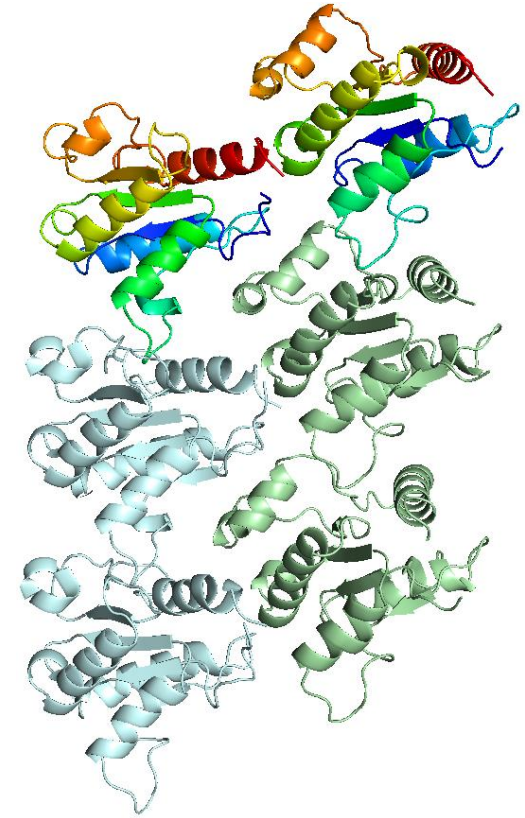
H1265 target



**Stoichiometry: A9B18**

**Examples of models for H1265**

# Challenge 2: multiple possible interfaces between proteins and unusual shape of protein complex



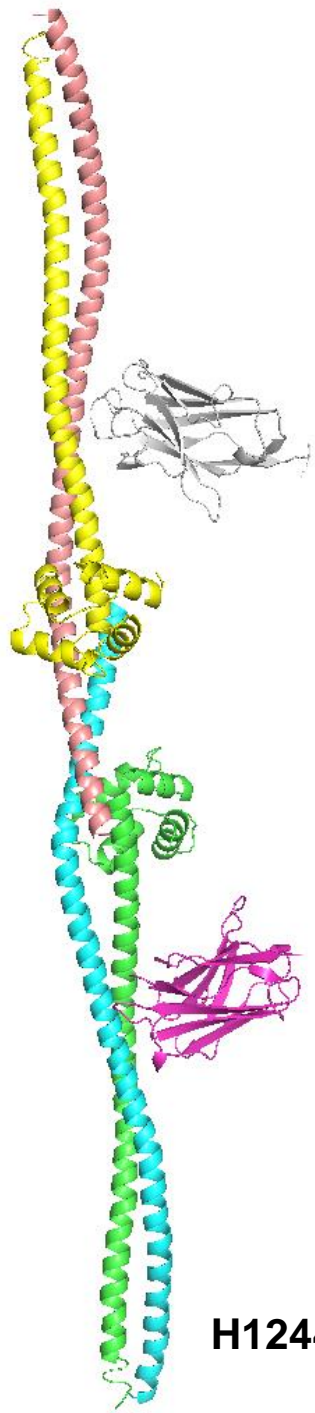
**The shape is correct, but  
the interfaces are incorrect**

**H1265 target**

**A winning model from the Kihara group**

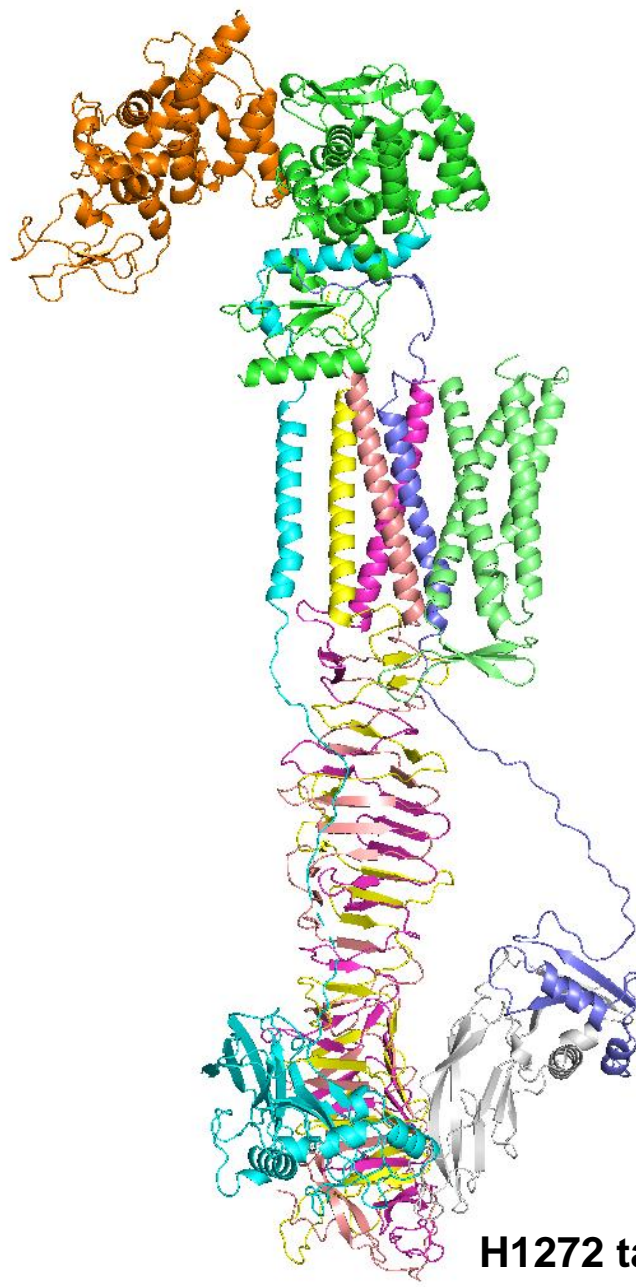


# Other challenging targets

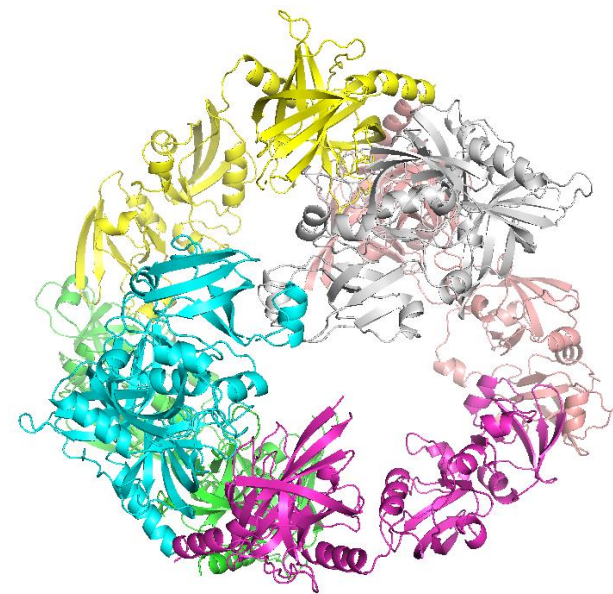


**H1244 target**

**H1258 target**



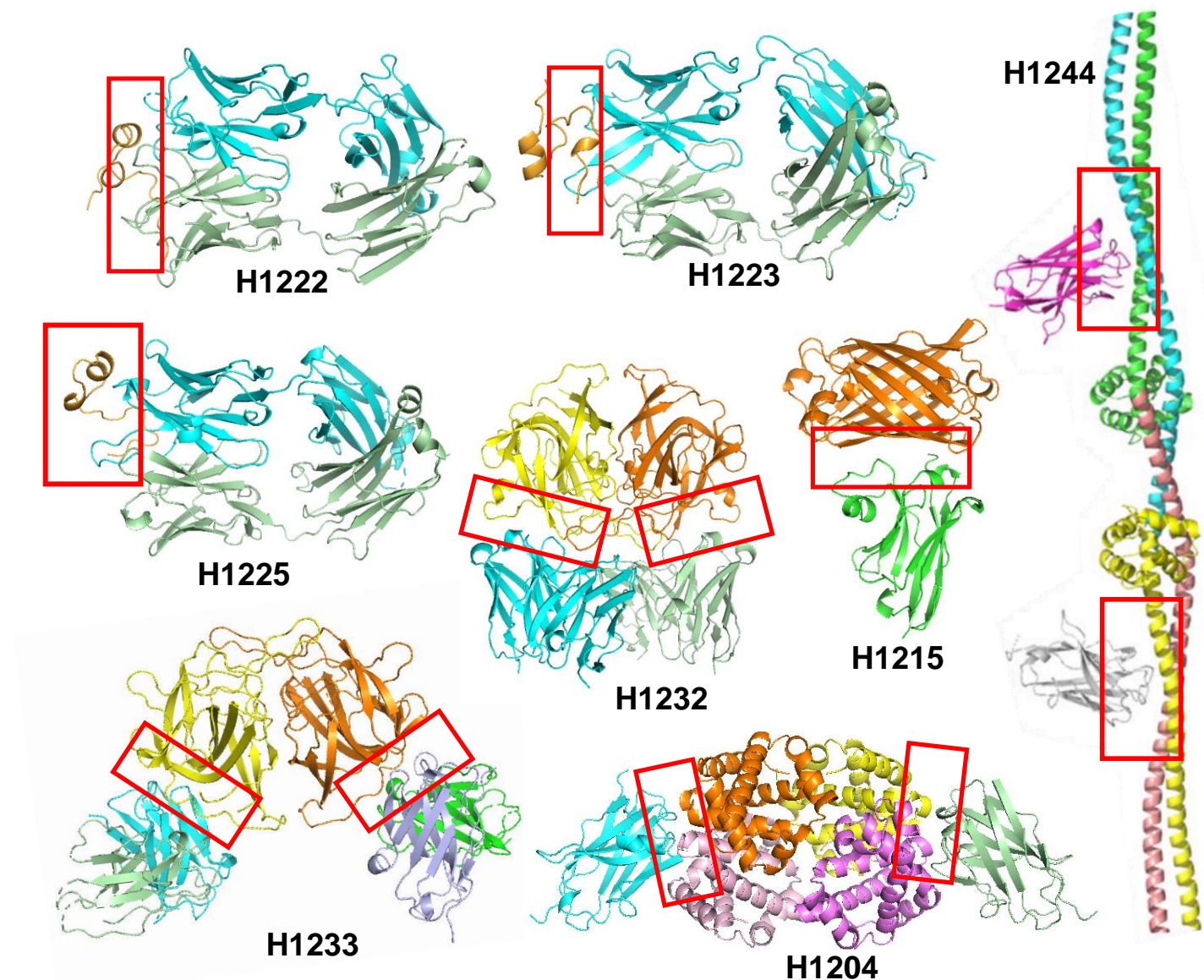
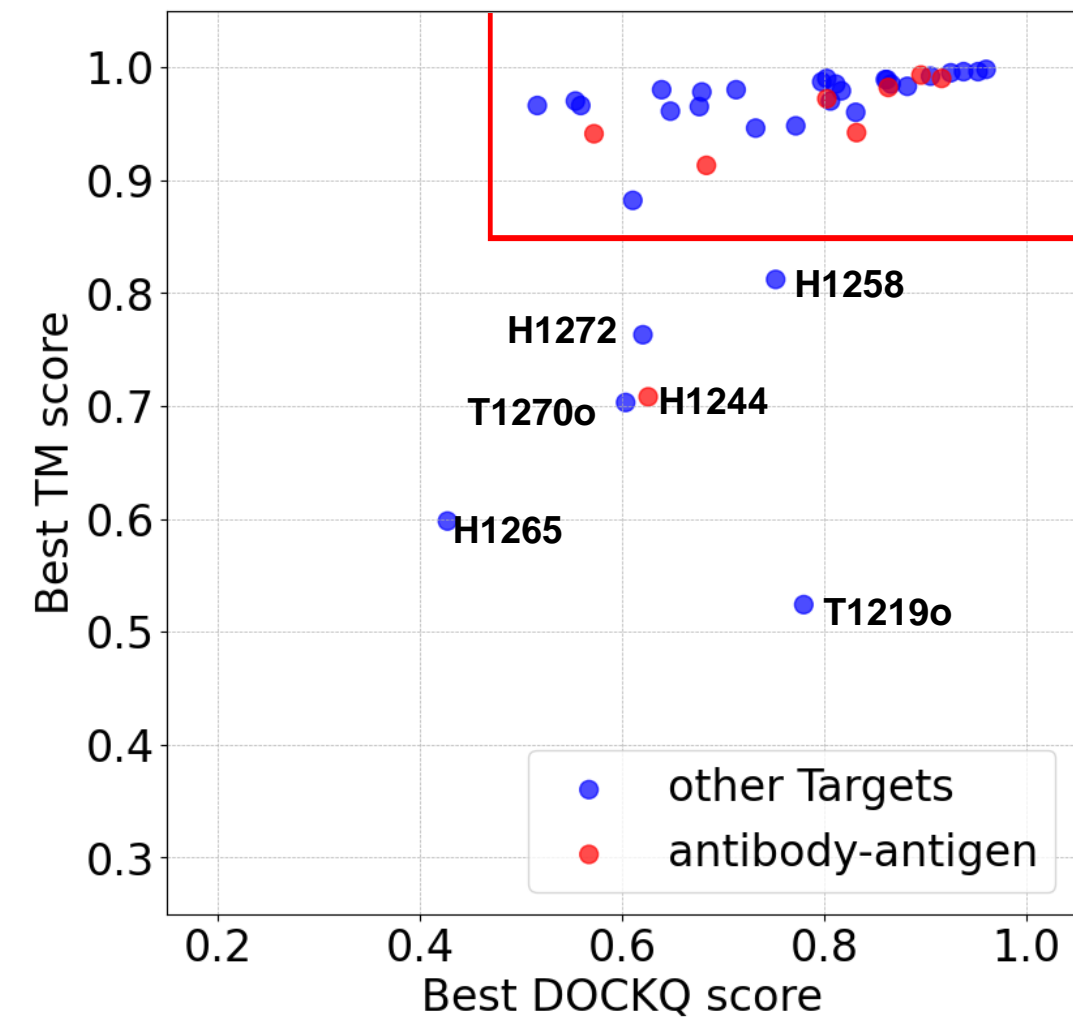
**H1272 target**



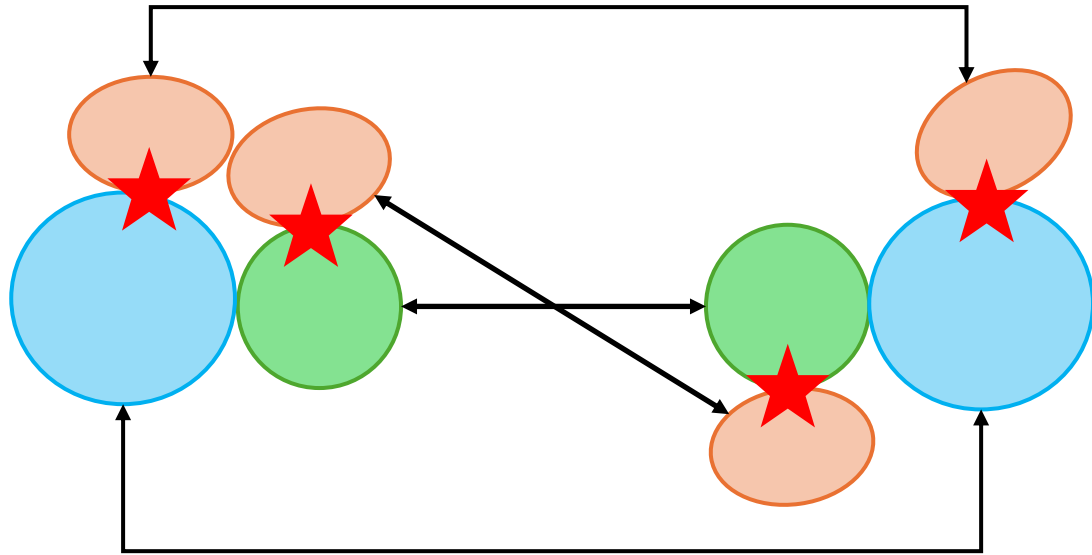
**T1270o target**

**Are we making progress?**

# What about antibody-antigen interactions ?



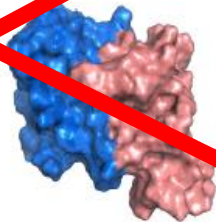
# A specialized scoring routine for antibody-antigen targets



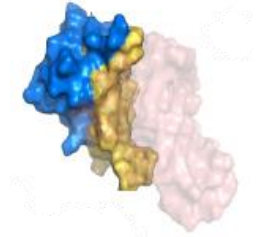
~~Assembly/Global:~~

~~IDDT~~

~~TM score~~



**Interface/Local:**



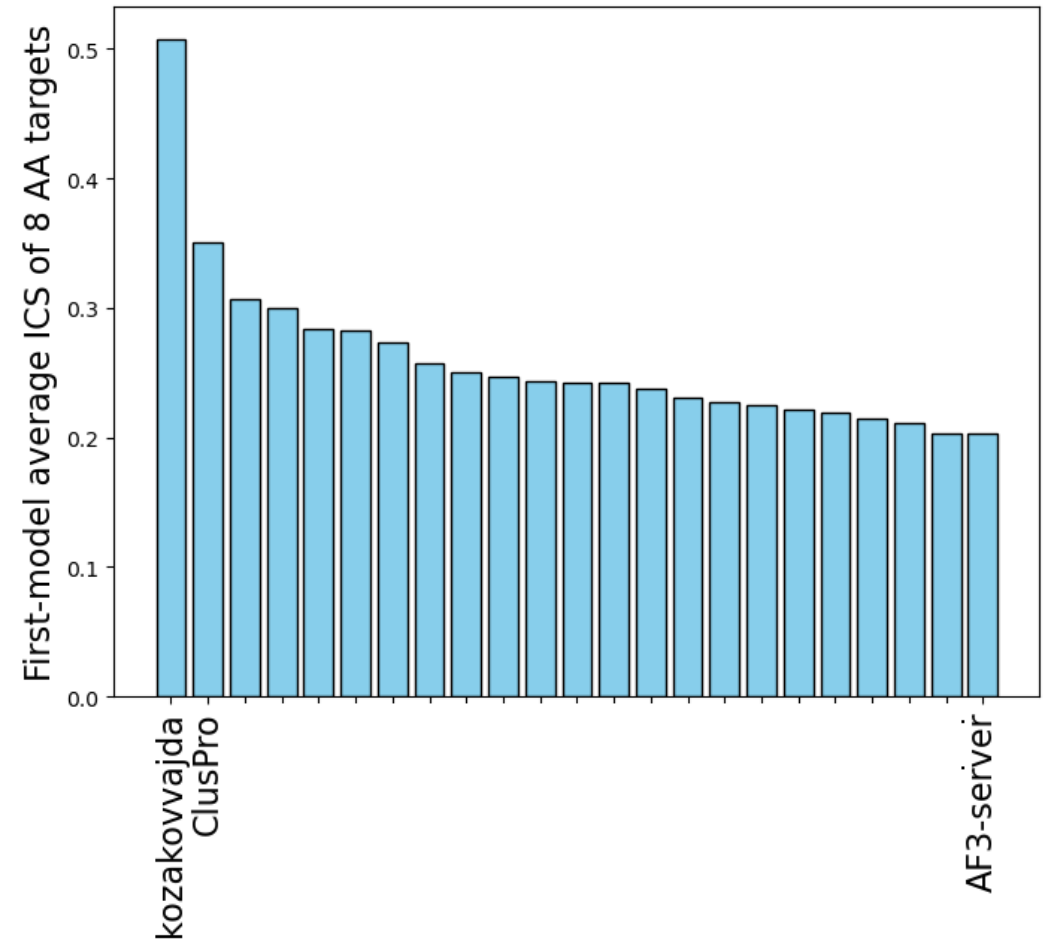
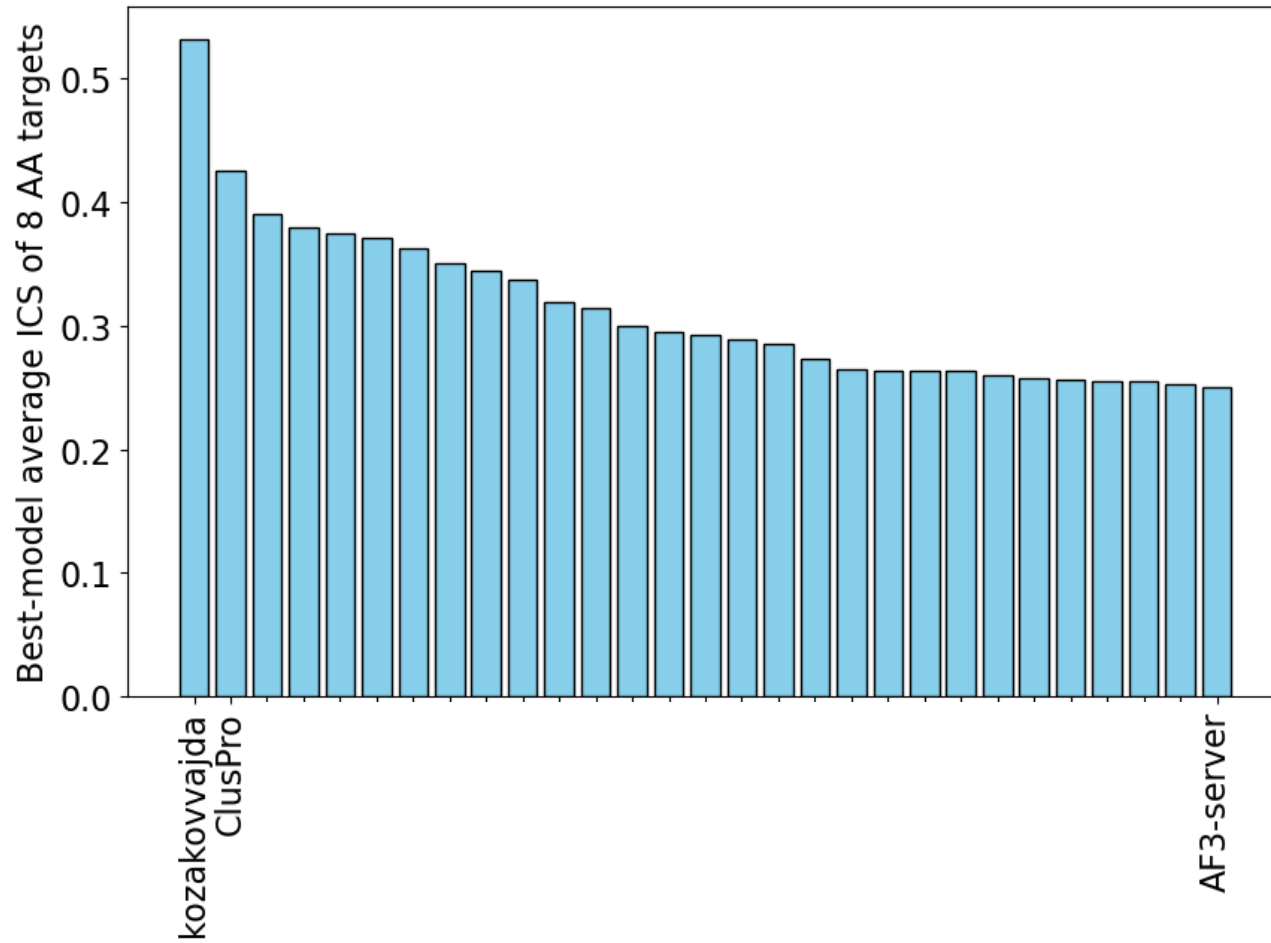
DockQ: interface size-weighted average

$$\text{IPS}(M, T) = J_C(M, T) = \frac{|M_{\text{i-Res}} \cap T_{\text{i-Res}}|}{|M_{\text{i-Res}} \cup T_{\text{i-Res}}|}$$

$$\text{ICS}(M, T) = 2 \cdot \frac{P(M_{\text{cnt}}, T_{\text{cnt}}) \times R(M_{\text{cnt}}, T_{\text{cnt}})}{P(M_{\text{cnt}}, T_{\text{cnt}}) + R(M_{\text{cnt}}, T_{\text{cnt}})}$$

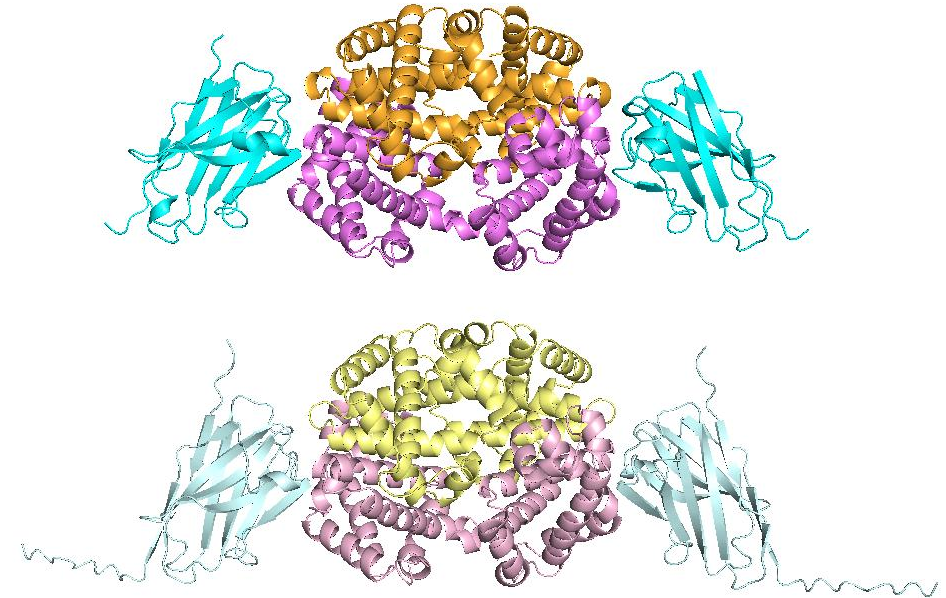
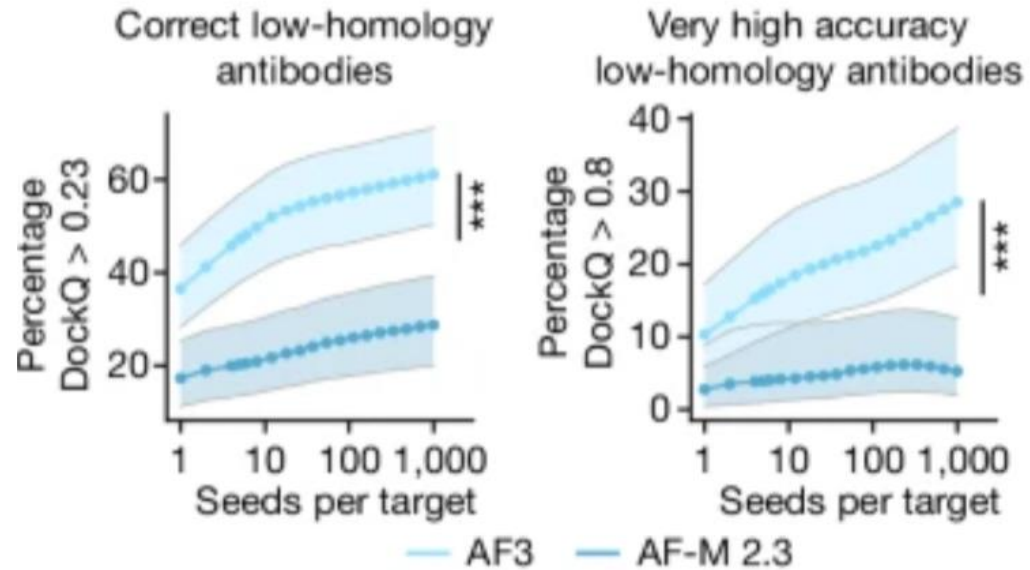
$$\text{QS-best}(M, T) = \frac{|M_{\text{cnt}} \cap T_{\text{cnt}}|}{\max(M_{\text{cnt}}, T_{\text{cnt}})}$$

# The Kozakov group is outstanding in antibody-antigen (AA) targets





# Can people remarkably outperform AF3?

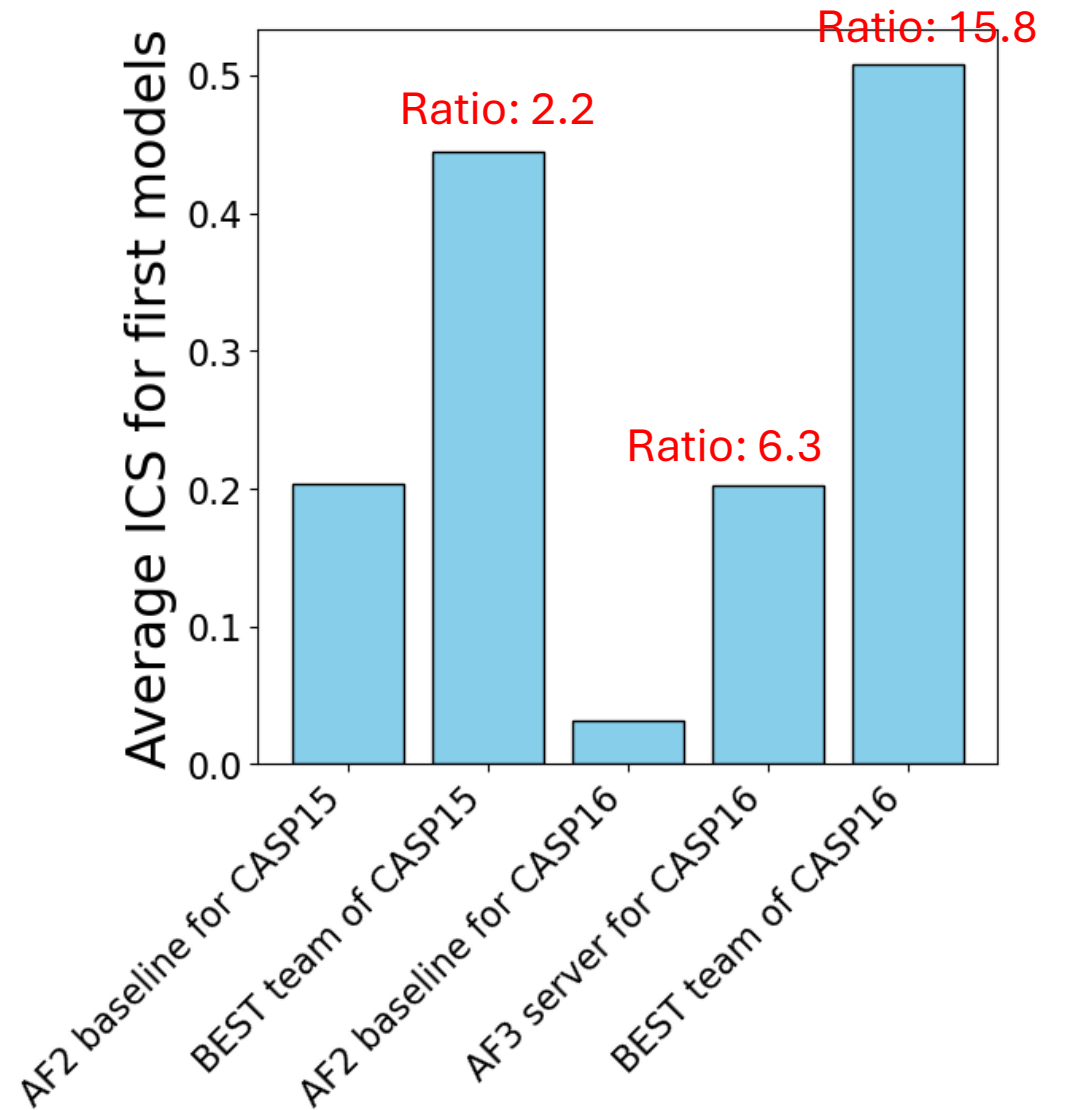
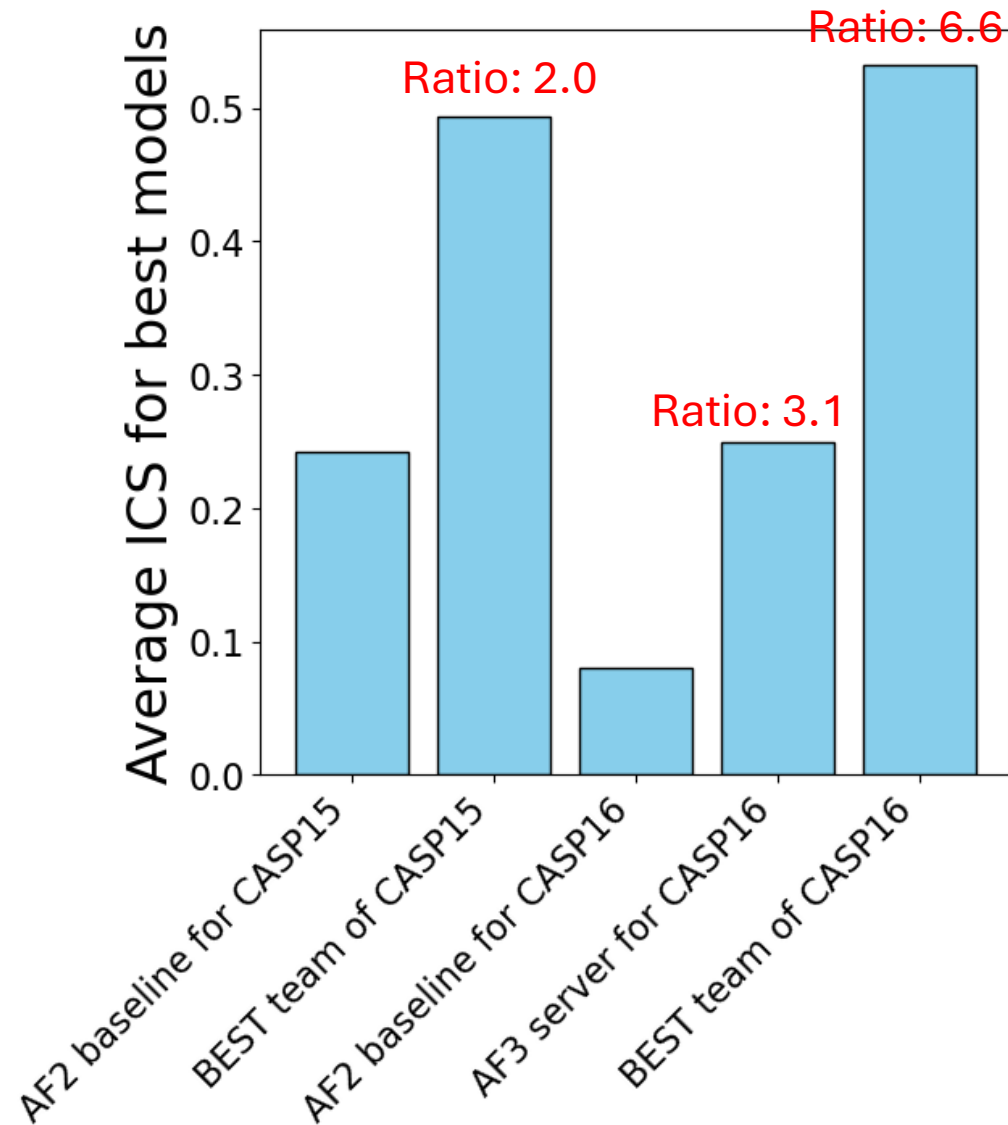


H1204 and a winning model from the Kozakov group

	H1204	H1215	H1222	H1223	H1225	H1232	H1233	H1244	DockQ > 0.23	DockQ > 0.8
<b>Kozakov</b>	0.8755	0.88	0.334	0.7575	0.158	0.0485	0.8995	0.0048	62.5%	37.5%
<b>AF3</b>	0.0192	0.195	0.503	0.1	0.098	0.0245	0.8845	0.0172	25%	12.5%

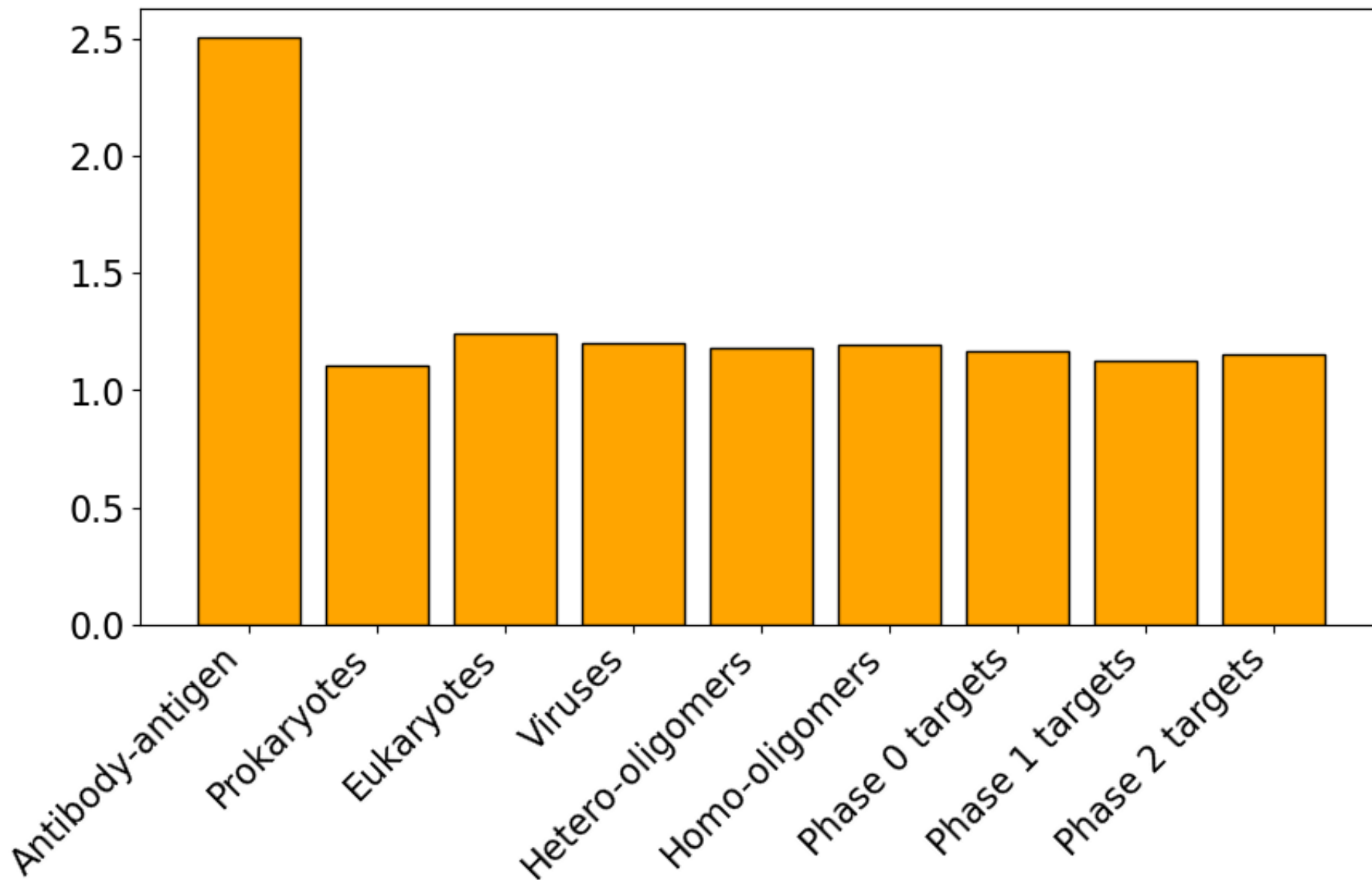


# Are we making any progress in antibody targets?

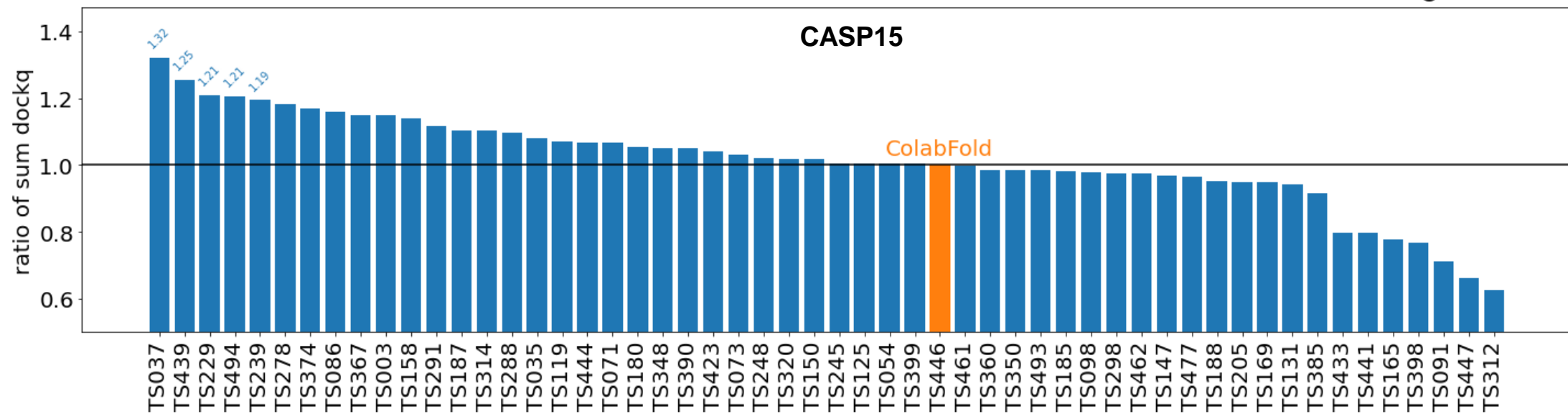
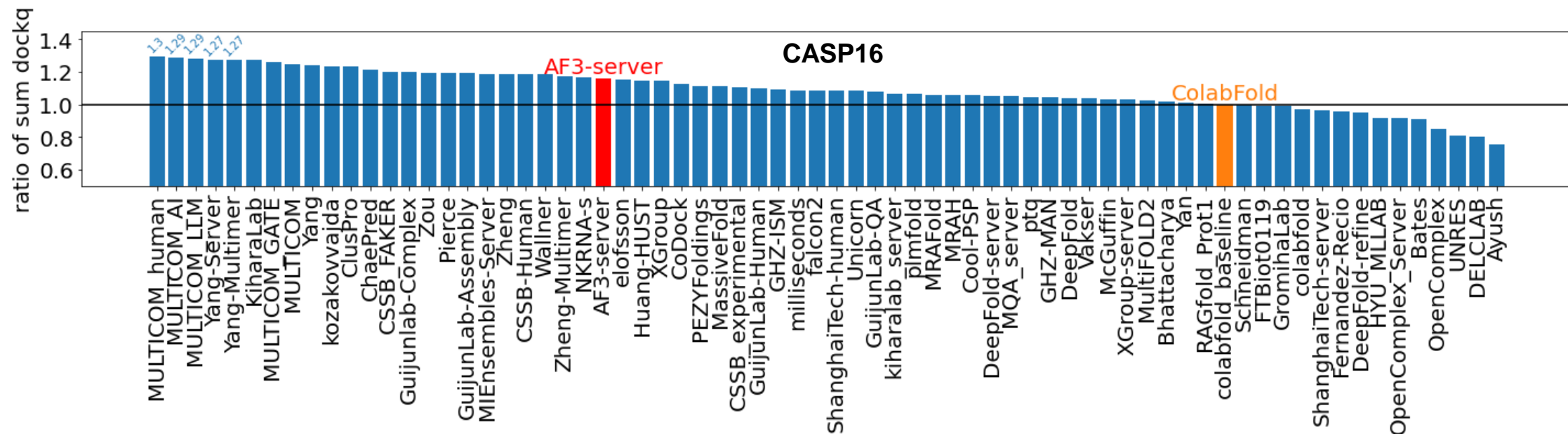


# In what other aspects do people outperform AF3?

Average ICS of the first model for the best group divided by average ICS of the first model for AF3



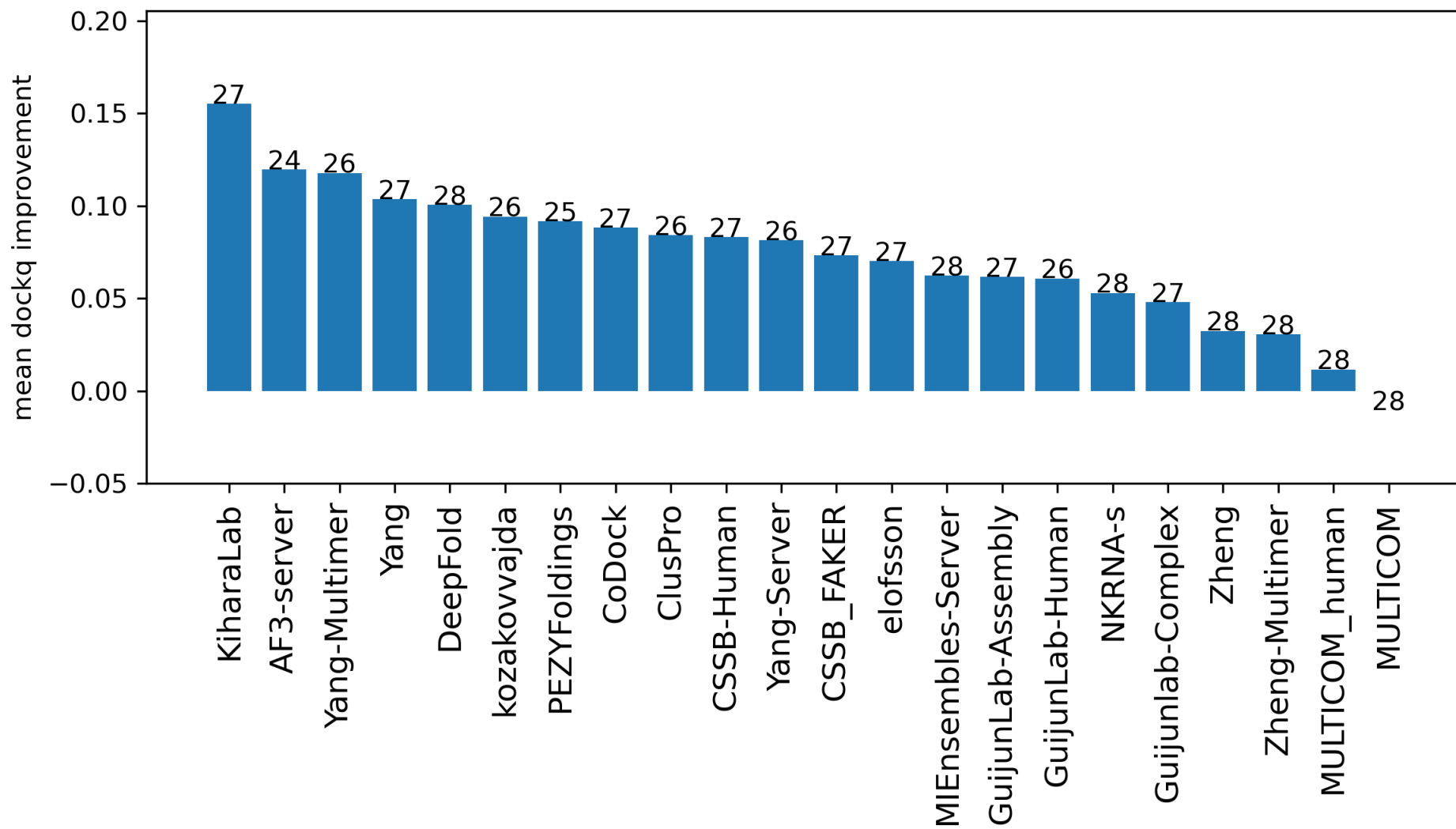
# There is no visible progress in other targets



**Additional experiments of this CASP**

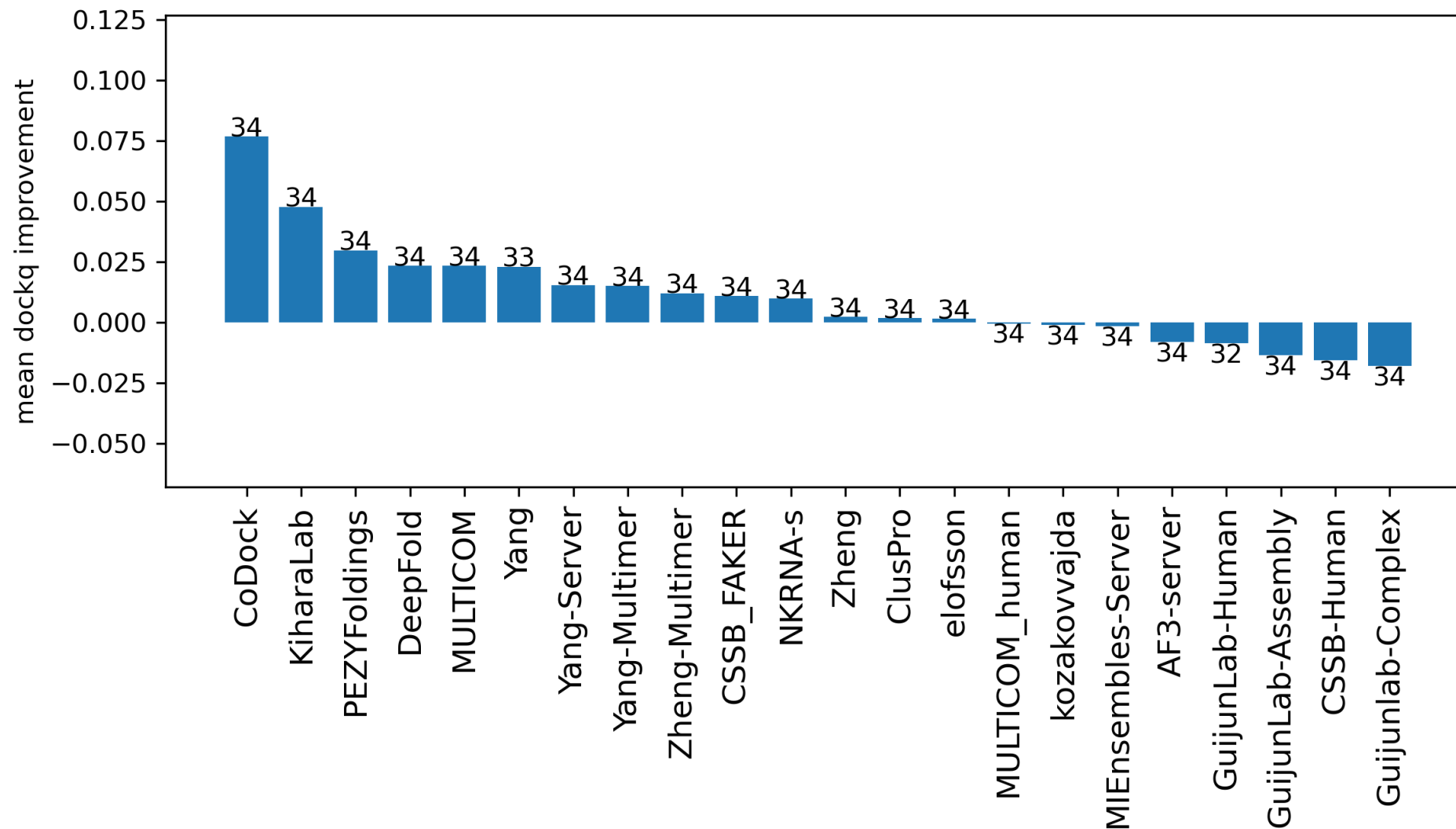
# T1 vs T0: knowing the stoichiometry help all top 25% groups in predicting oligomer structures

mean dockq improvement from T0 to T1, using first model



# T2 vs T1: massive models are helpful for most of top 25% groups in predicting oligomer structures

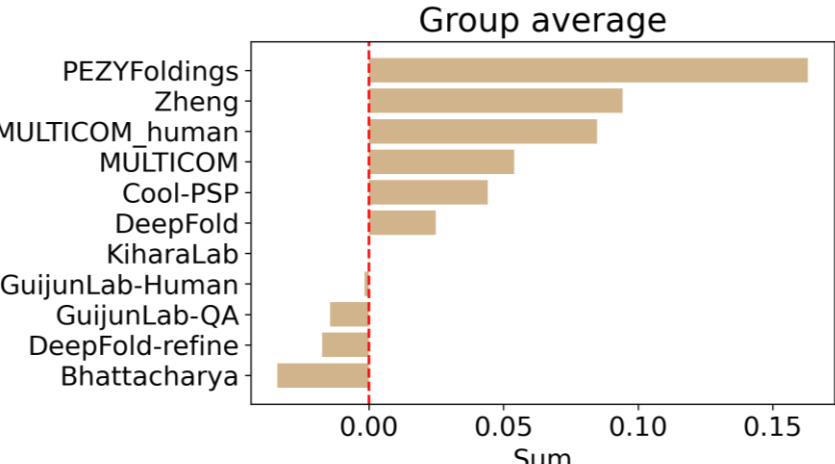
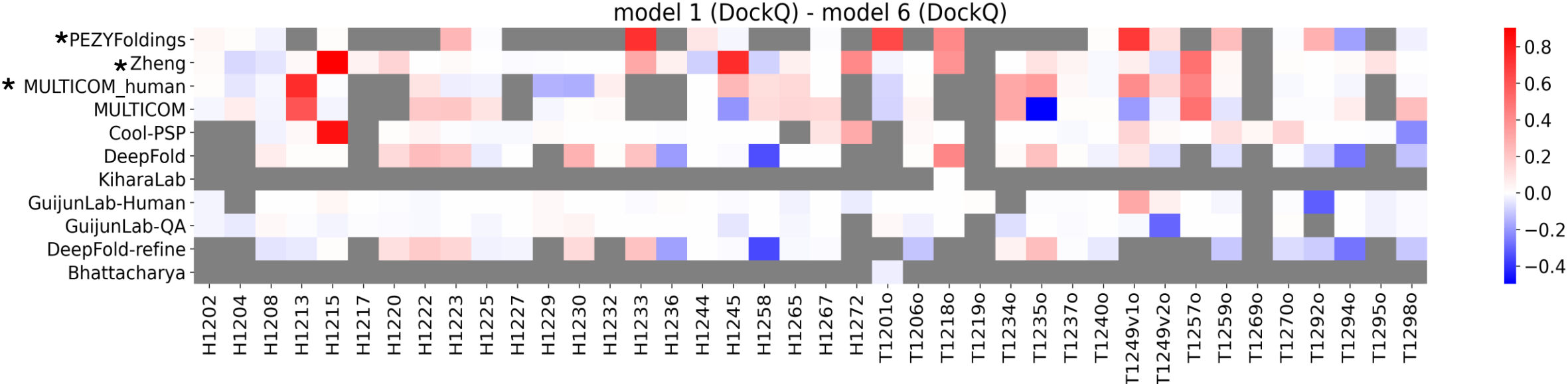
mean dockq improvement from T1 to T2, using best model





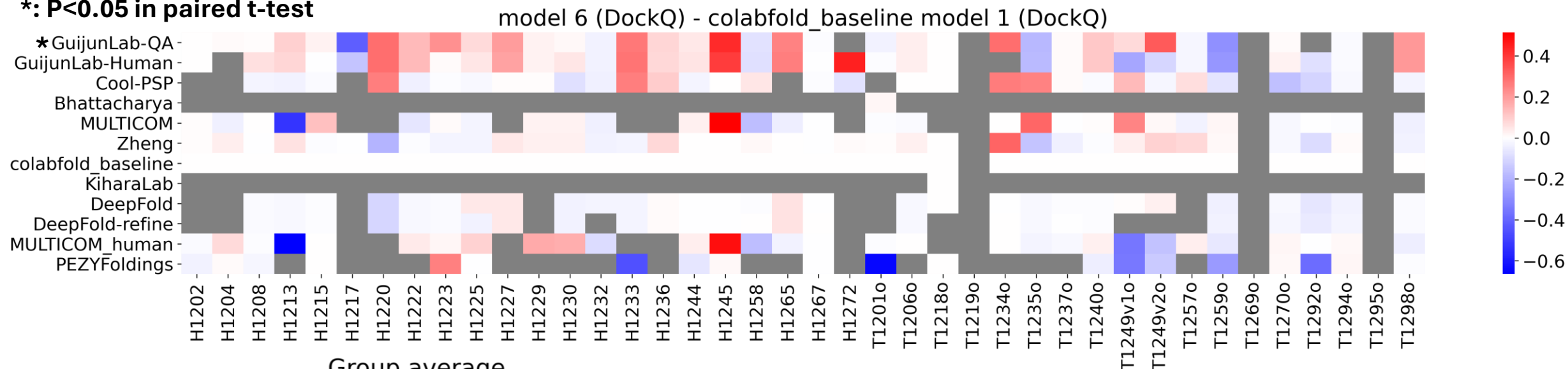
# Comparison of model 1 with model 6 of the same group reveals MSA-building ability

\*: P<0.05 in paired t-test

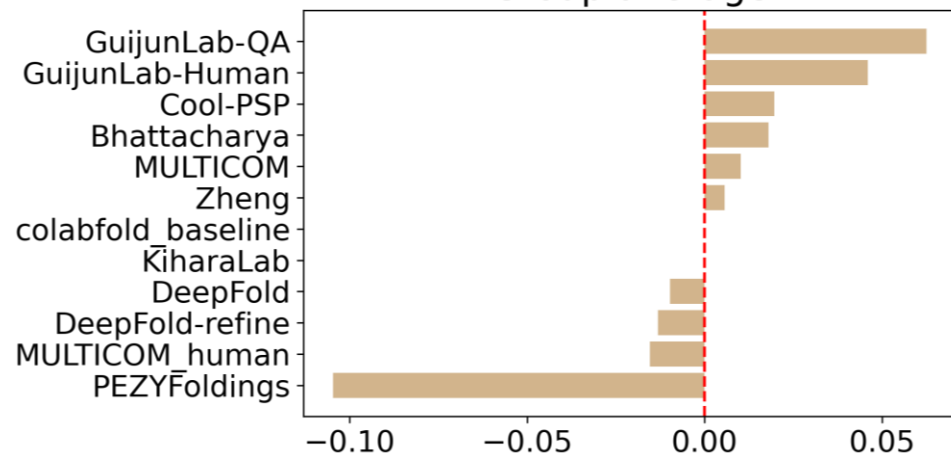


# Comparison of model 6 with ColabFold model 1 reveals modeling ability

**\*: P<0.05 in paired t-test**

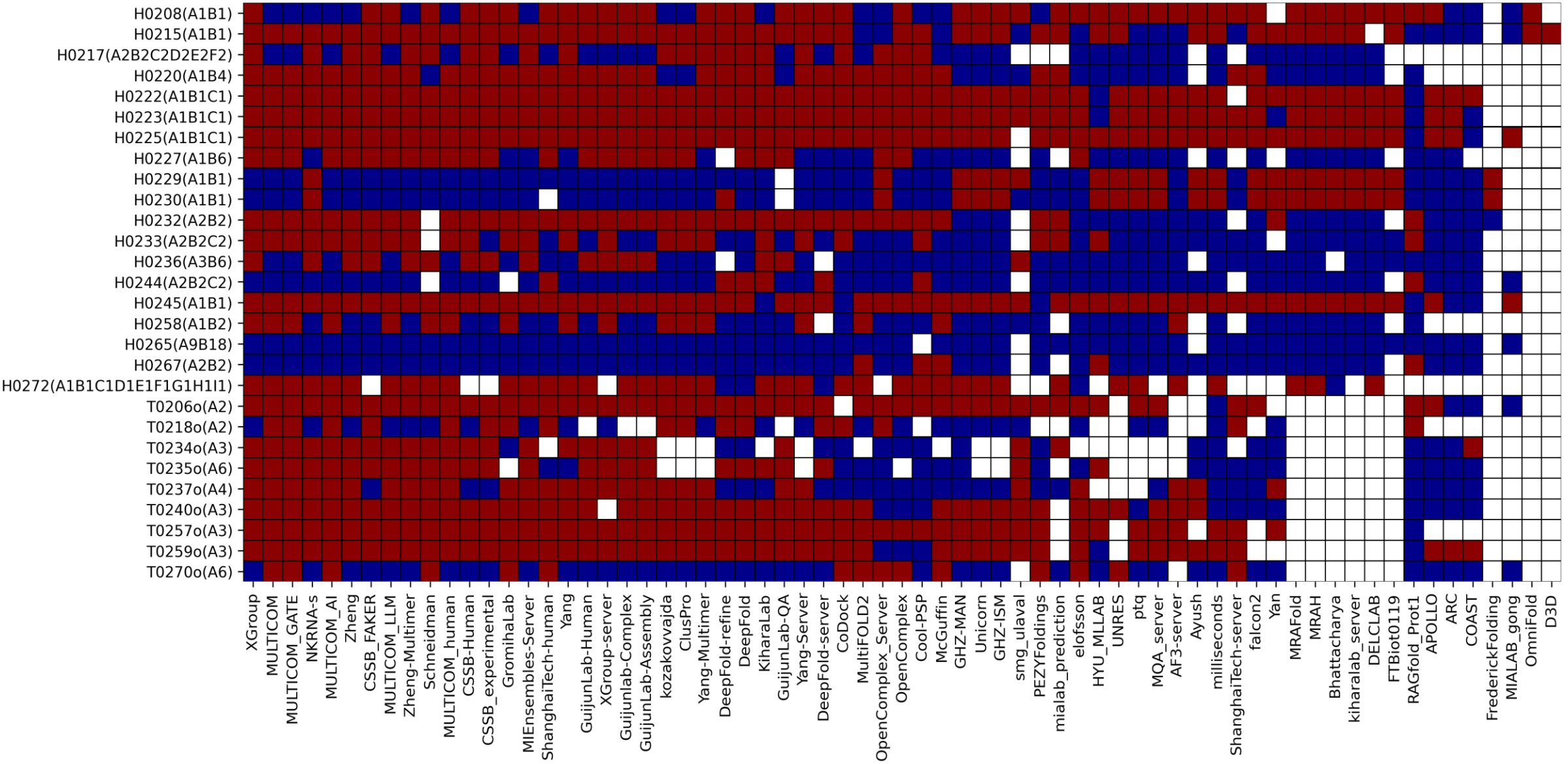


Group average



# Phase 0 test people's ability to predict stoichiometry

## Binary Score Heatmap



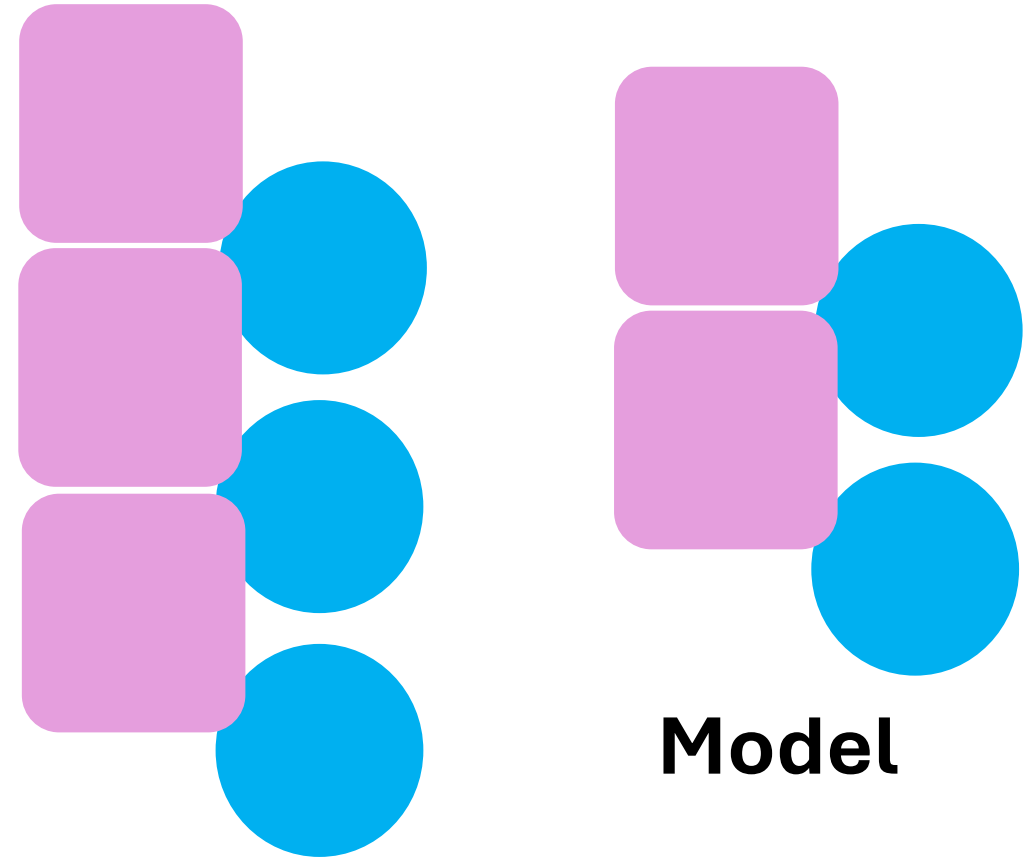
# Phase 0, as well as filament targets, challenge our ability to evaluate models



**Target**

**Model**

**Bias towards**



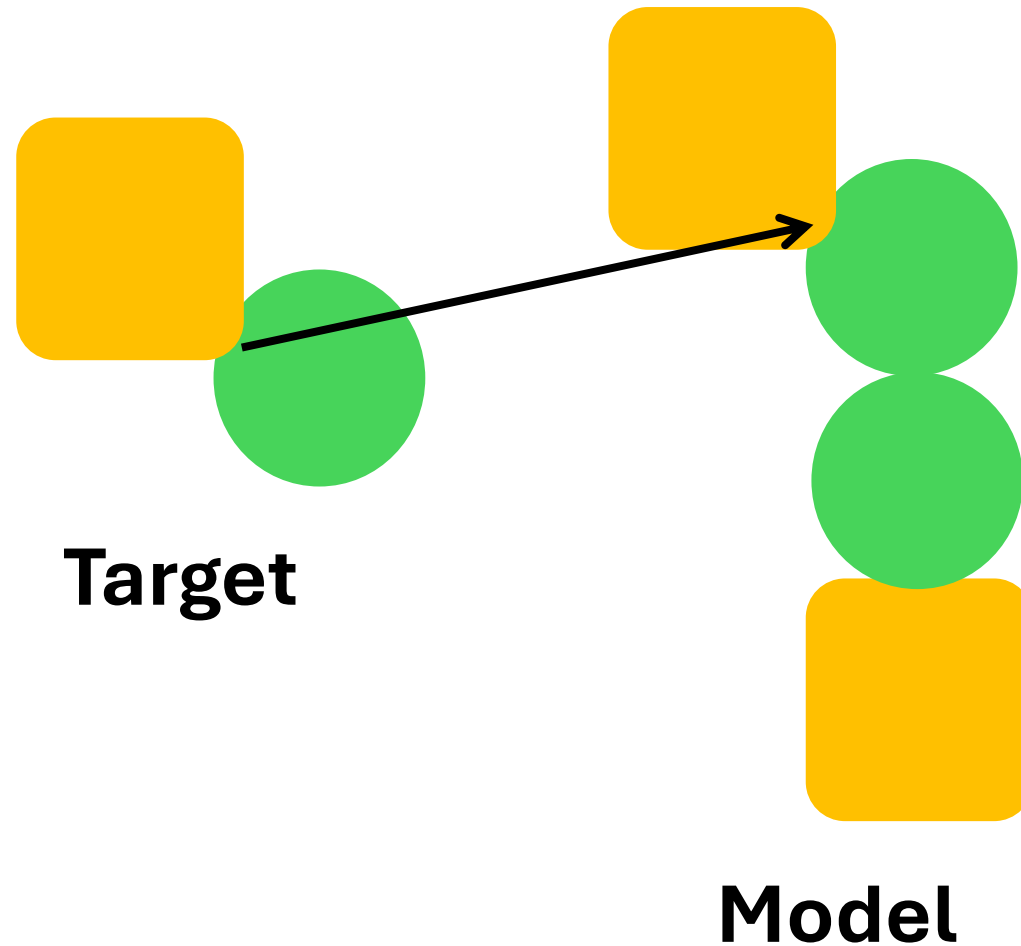
**Target**

**Model**

**Bias against**

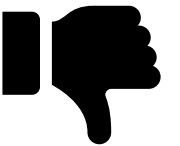
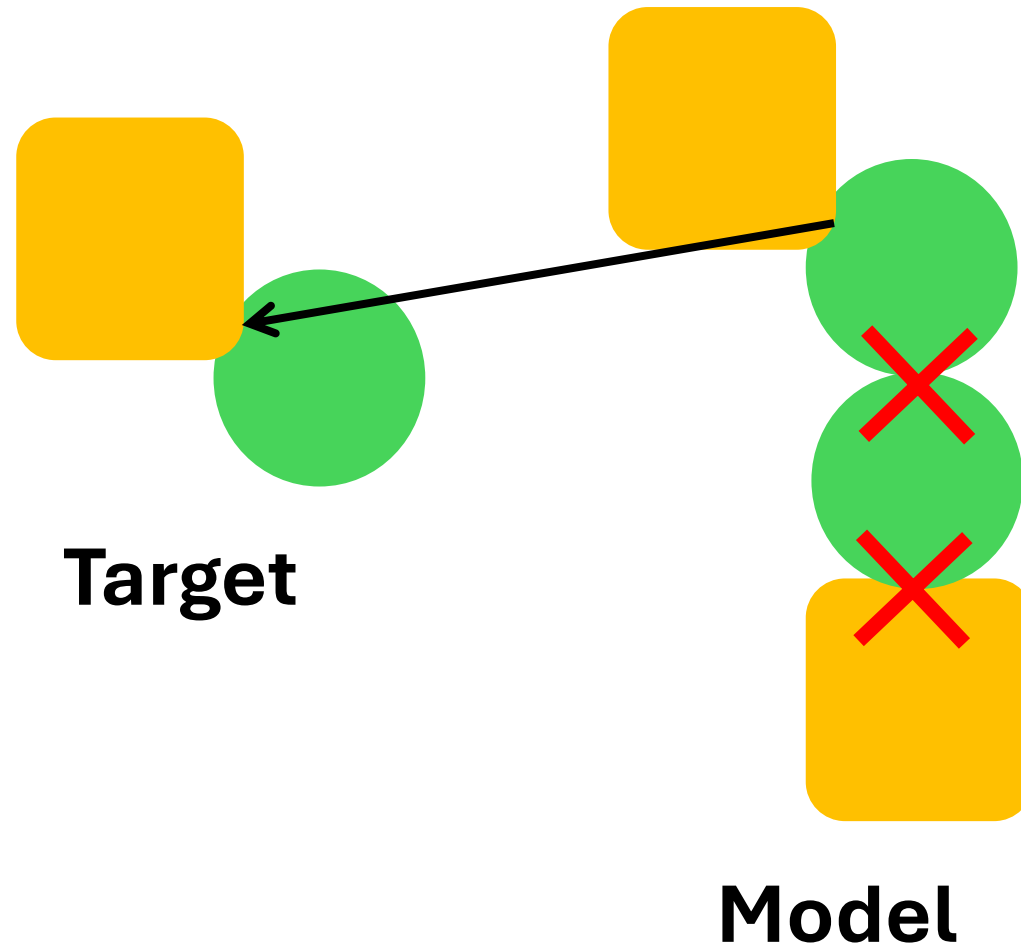
# New evaluation routine for targets of unknown stoichiometry

Reciprocal  
Best Match  
pair-wise  
scoring



# New evaluation routine for targets of unknown stoichiometry

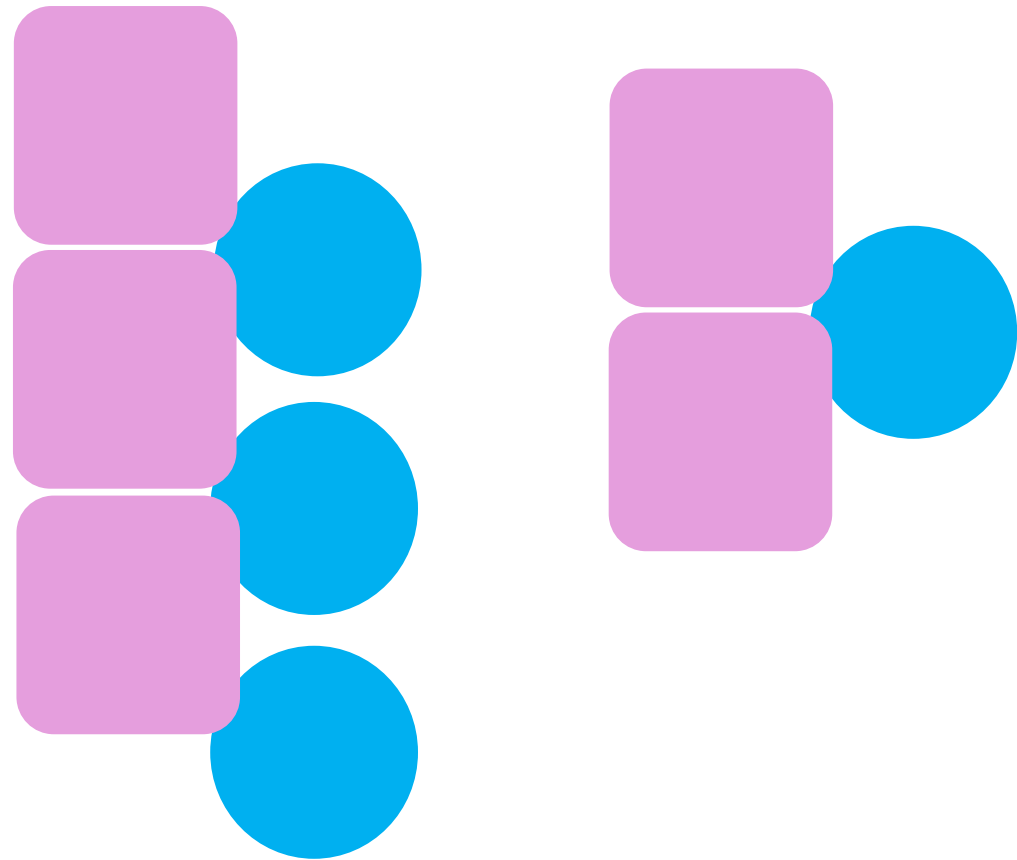
Reciprocal  
Best Match  
pair-wise  
scoring





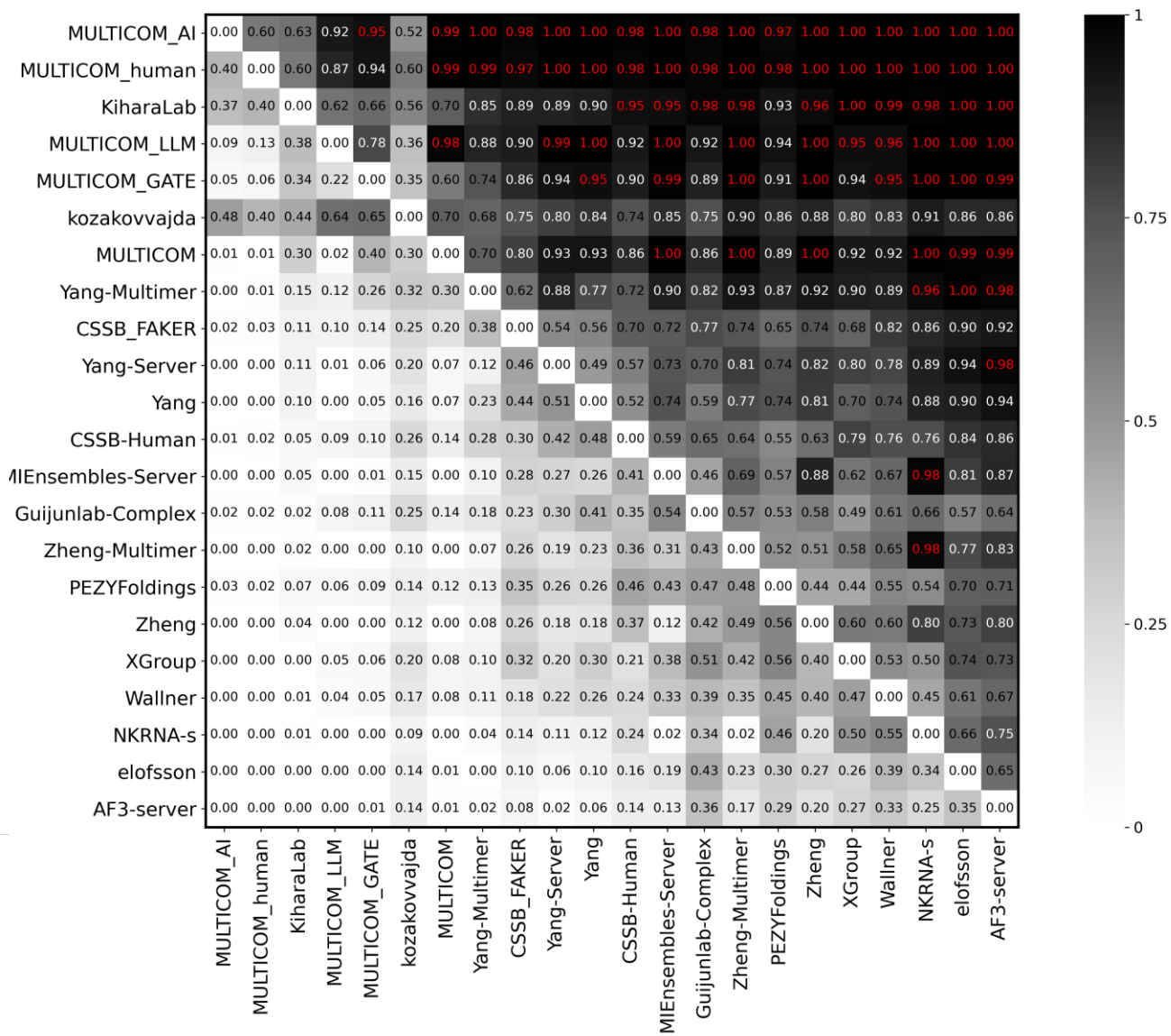
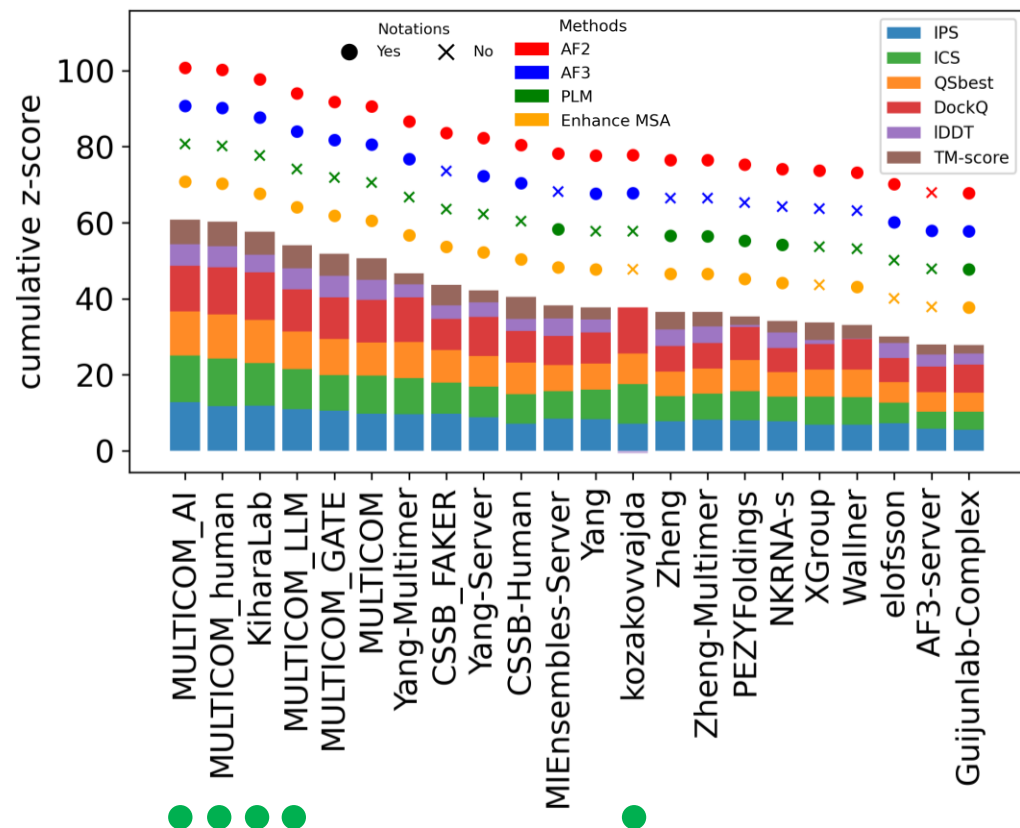
# New evaluation routine for targets of unknown stoichiometry

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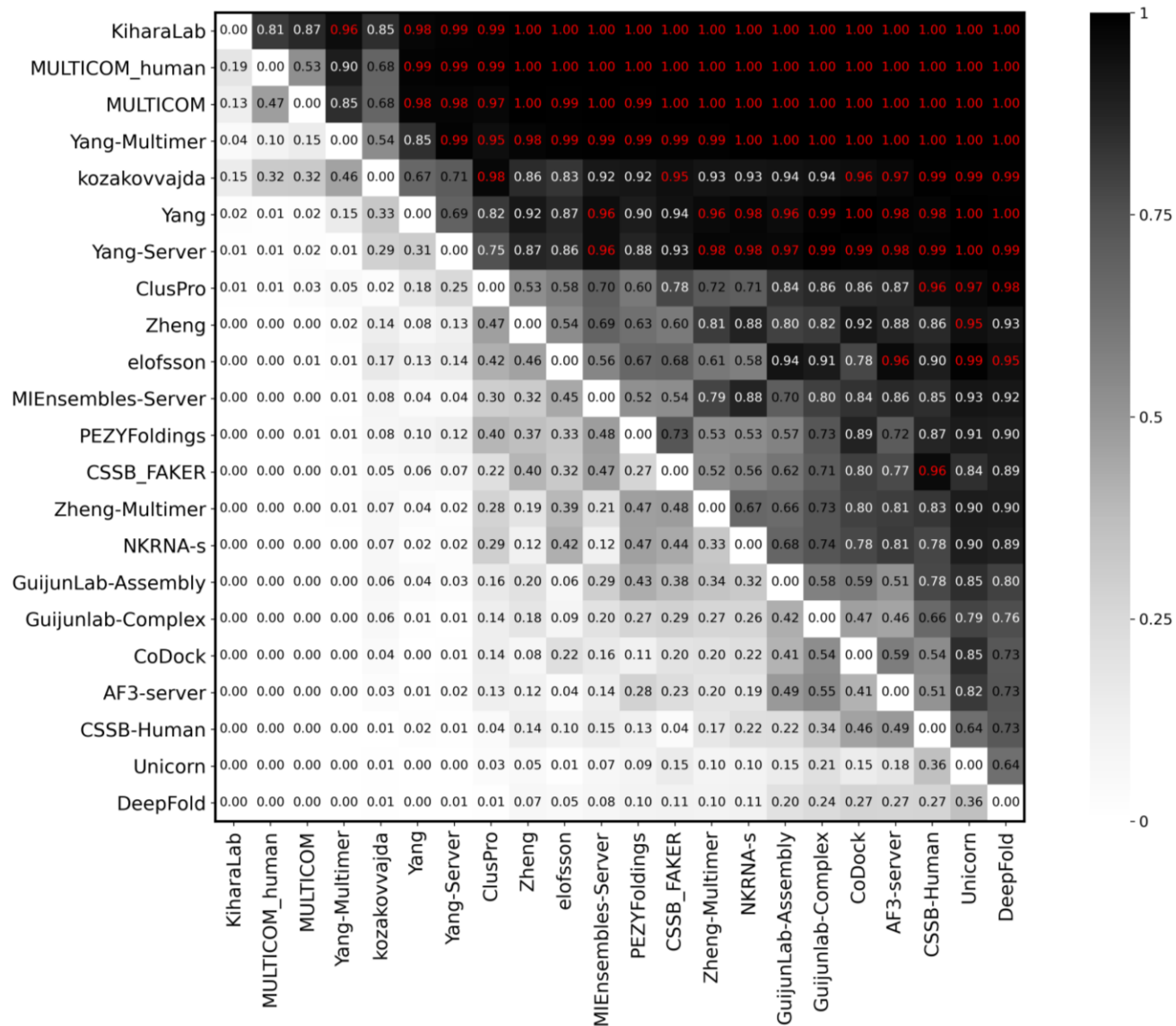
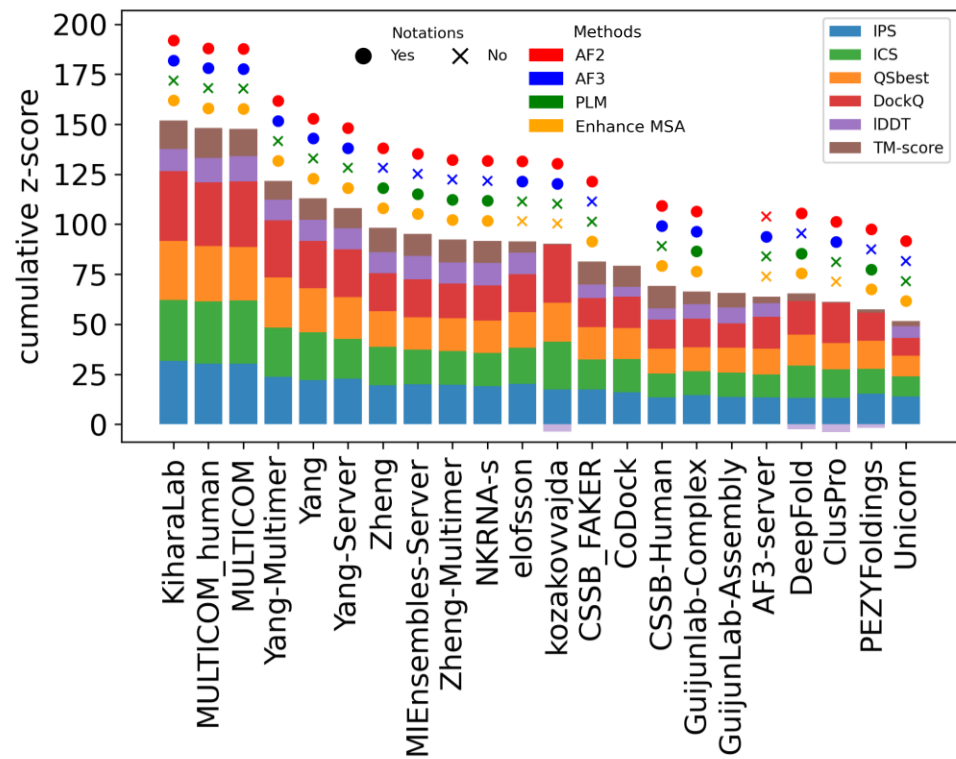


# **The ranking**

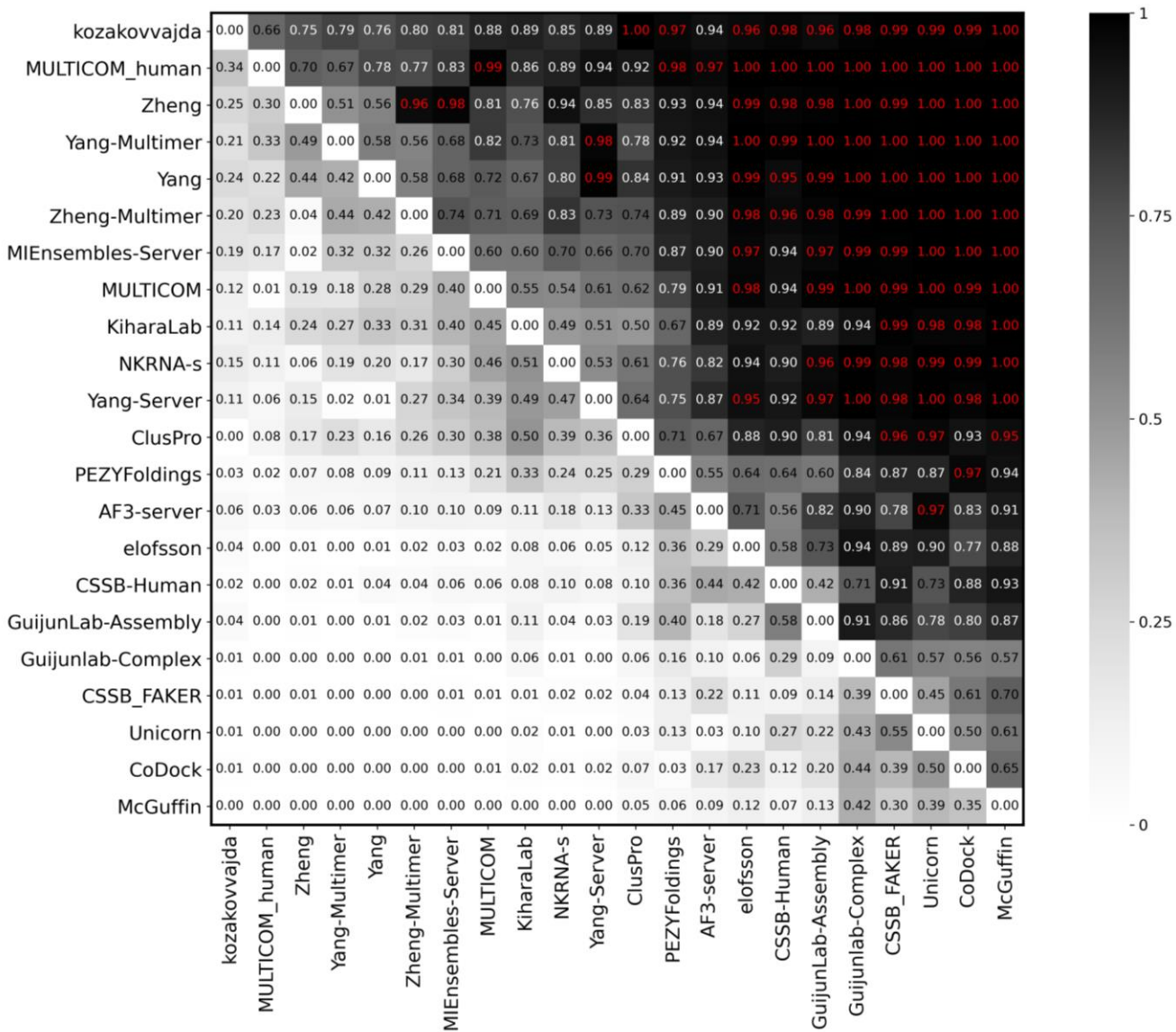
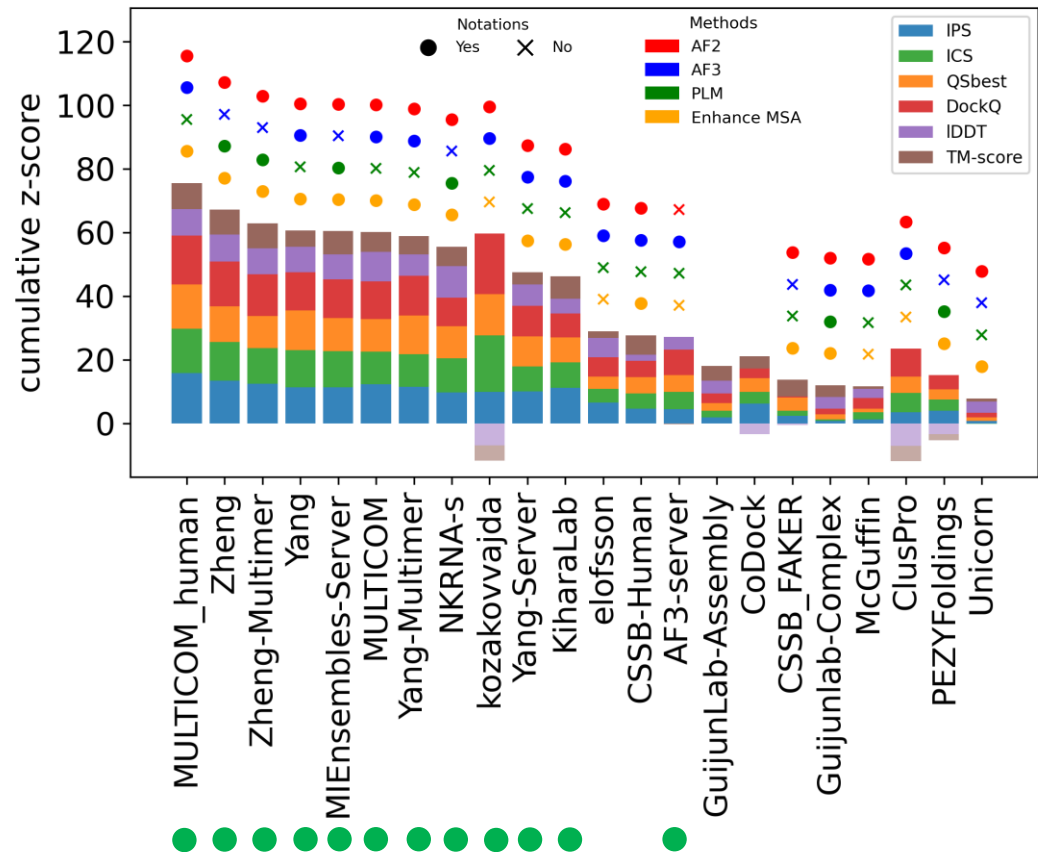
# Ranking on Phase 1 best models



# Ranking on best models for targets from all phases



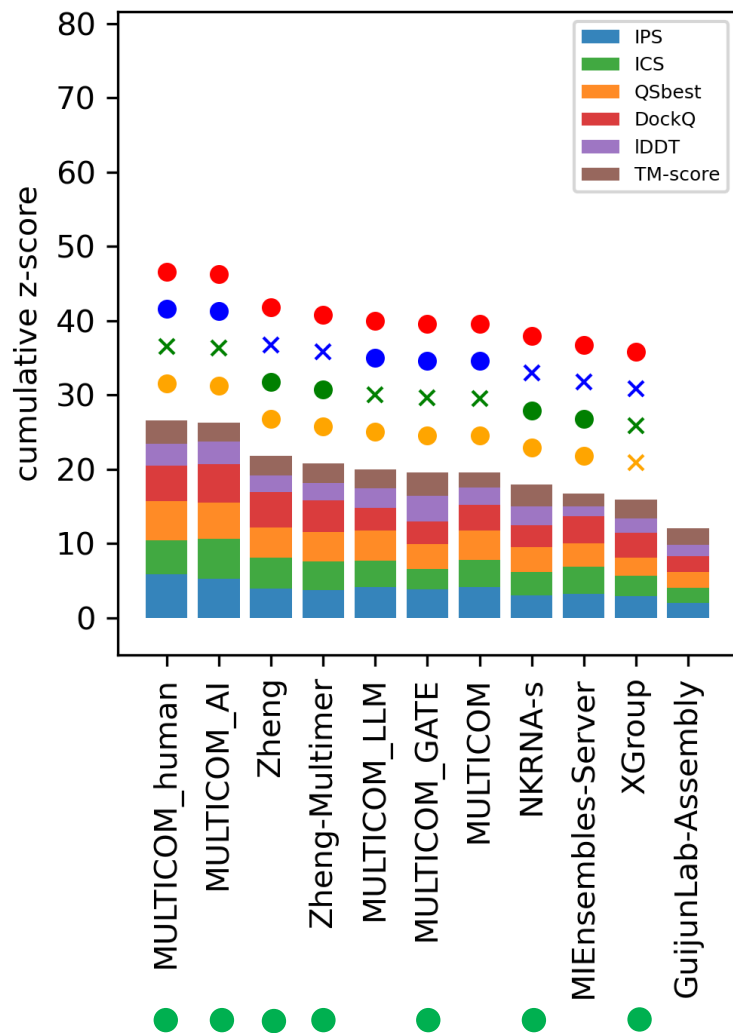
# Ranking on first models for targets from all phases



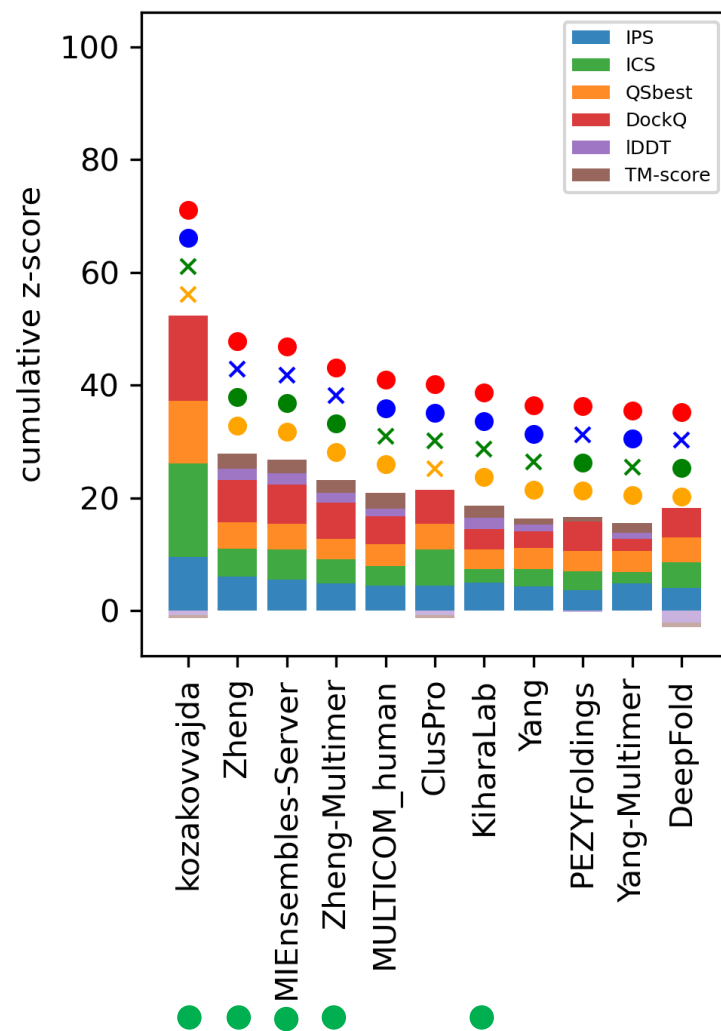
# Additional rankings reveal interest aspects of groups



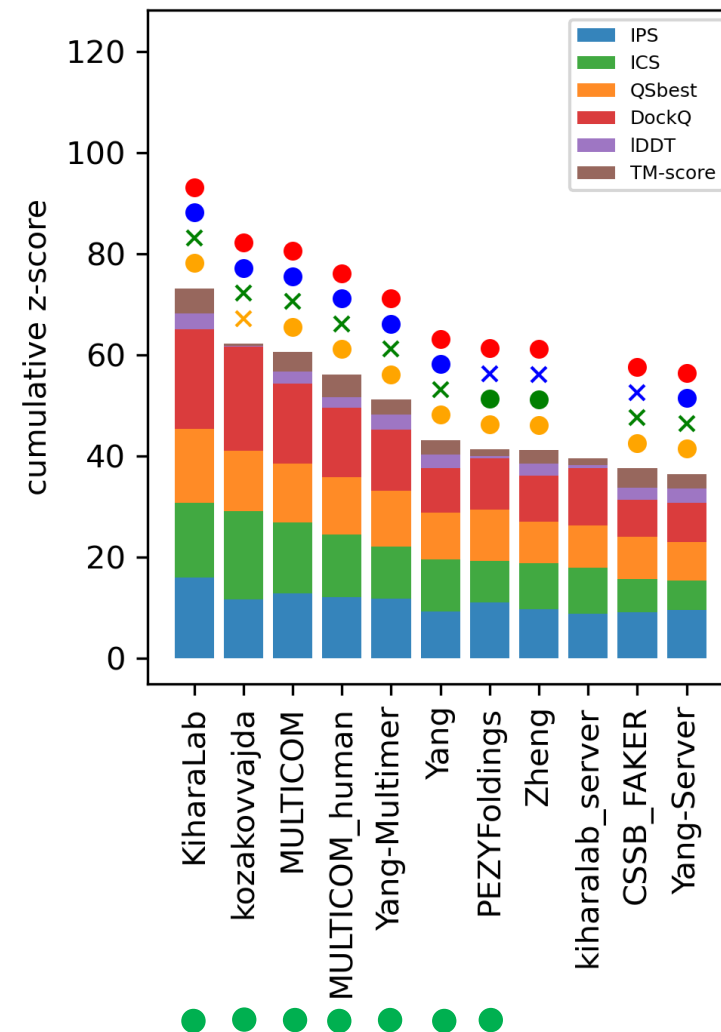
## Phase 0 targets, first models



## Hard targets, first models



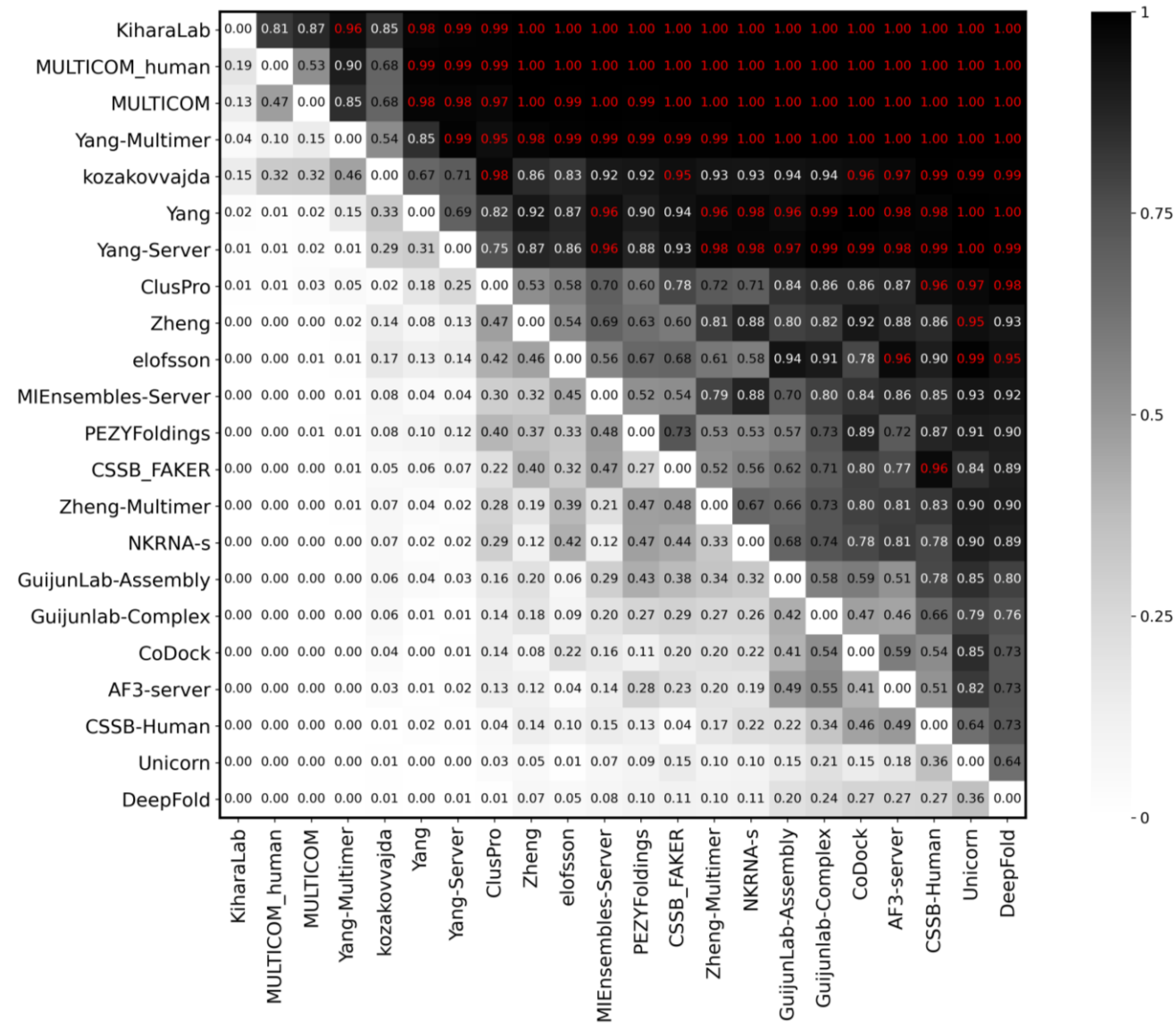
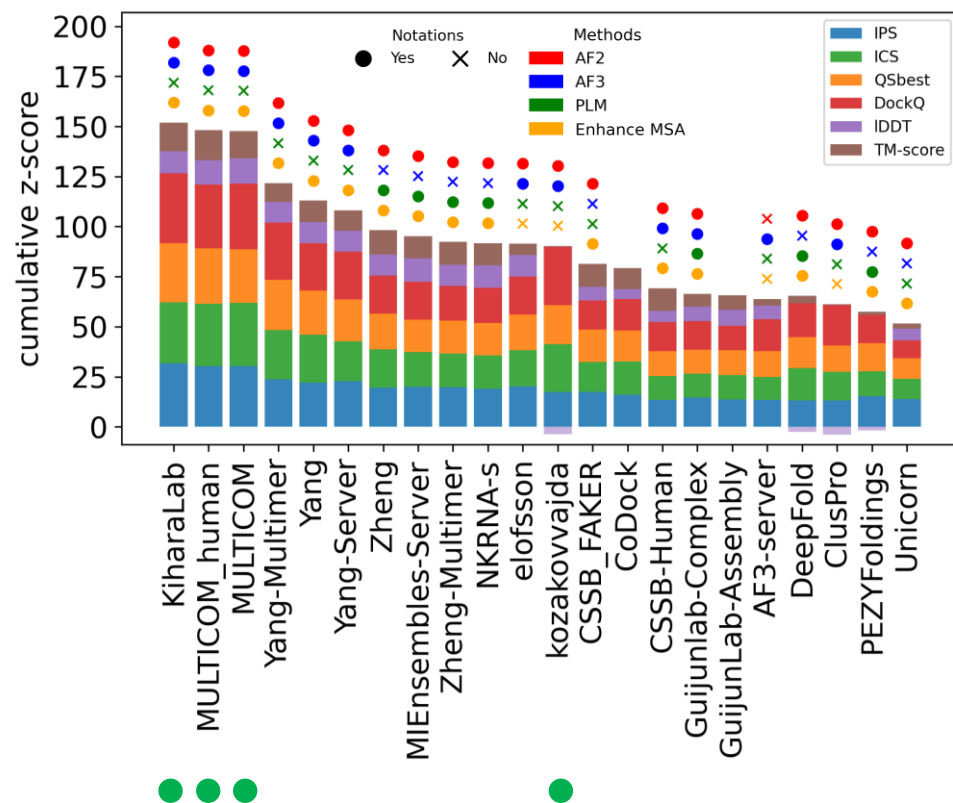
## Hard targets, best models



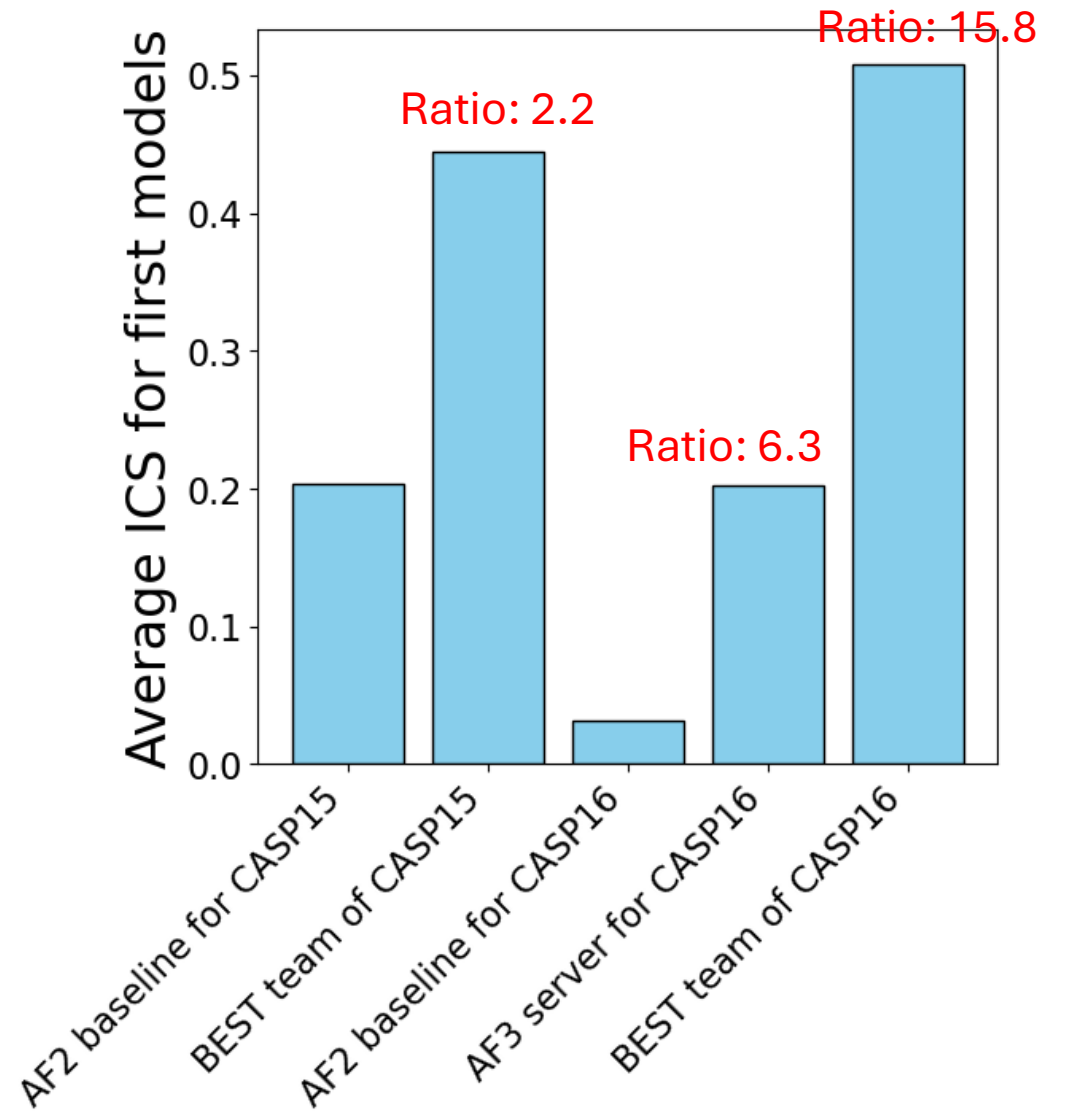
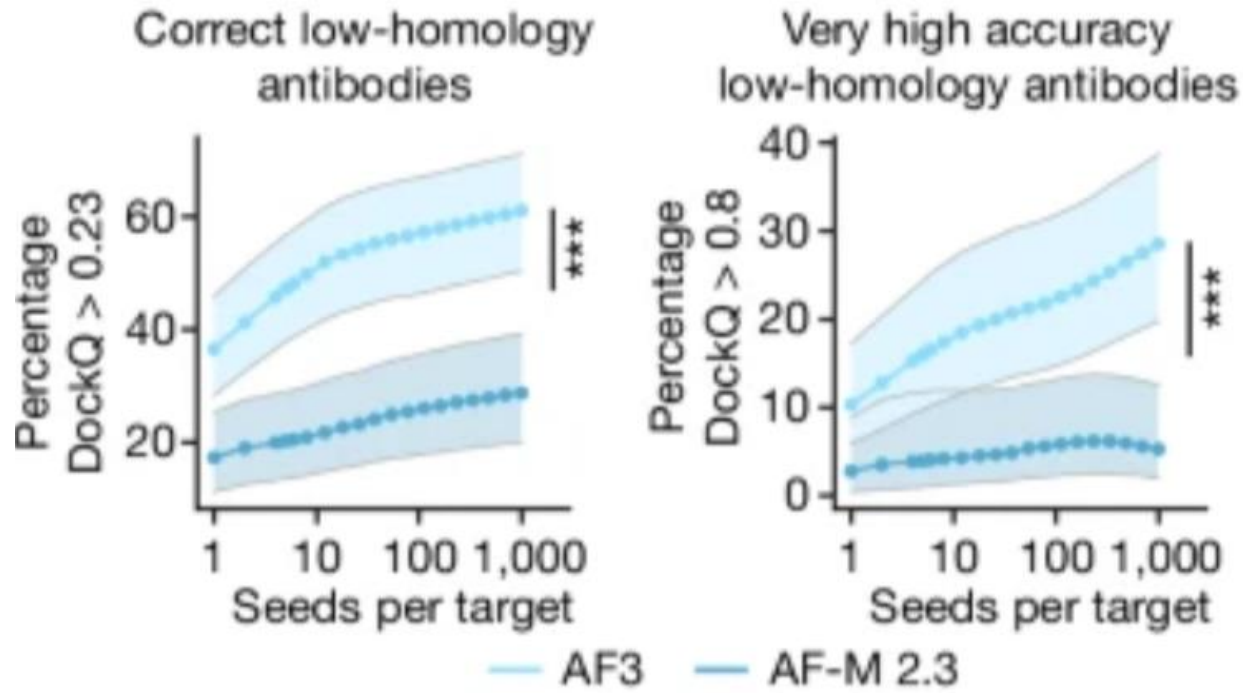


# Final “ranking”(with ties) for oligomers

## Best models over all phases



# Huge progress in antibody-antigen interactions



# Final thoughts on oligomer prediction

0. Exciting progress in antigen-antibody interactions. We may want more antibody targets in the future to more robustly evaluate the progress.
1. Protein complex modeling is not “**solved**”: each group gets a subset correctly.
2. We think Phase 0 should be the future of oligomer prediction.
3. Evaluating targets with **unknown stoichiometry** needs better tools and we provided a start.
4. **Weak interactions** and **multiple alternative interfaces** are hard to predict.
5. Unseen flexibility in **experimental structures** could be an **issue**.