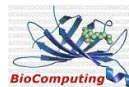


# Critical Assessment of protein Intrinsic Disorder prediction (CAID) - Results of round 3

**Silvio Tosatto**

*University of Padova*

CASP-16, 1-4 December 2024, Punta Cana



# People

## Organizers

Silvio CE Tosatto  
Damiano Piovesan



## Assessors

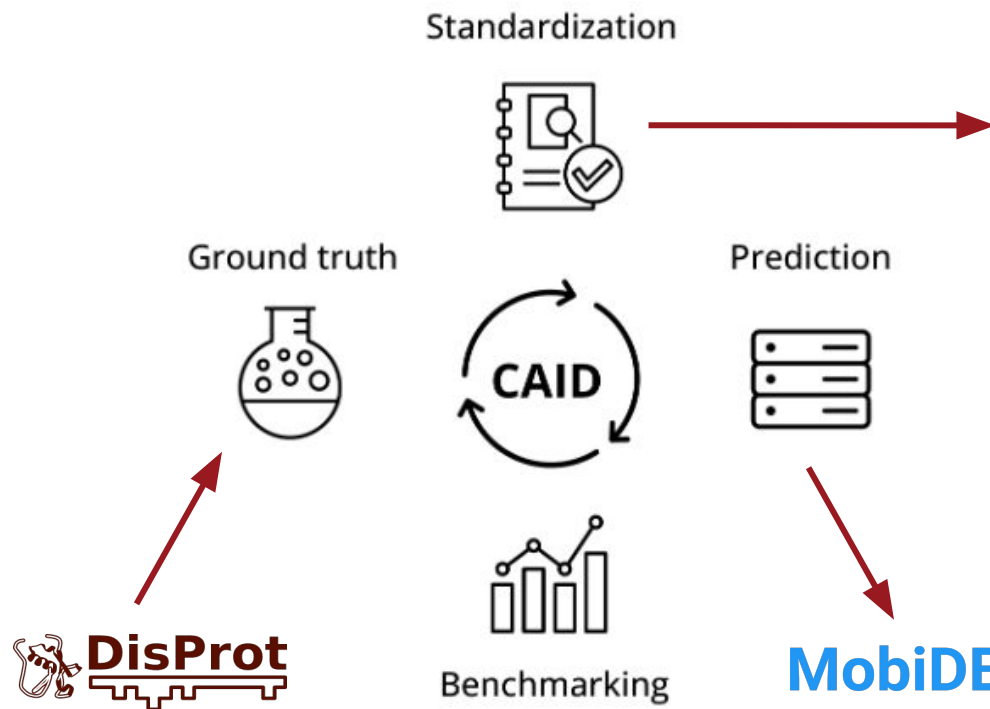
Alessio Del Conte  
Mahta Mehdiabadi

## DisProt Curators

Victoria Nugnes  
Federica Quaglia  
Maria Cristina Aspromonte



# The CAID cycle



**CAID Prediction Portal**

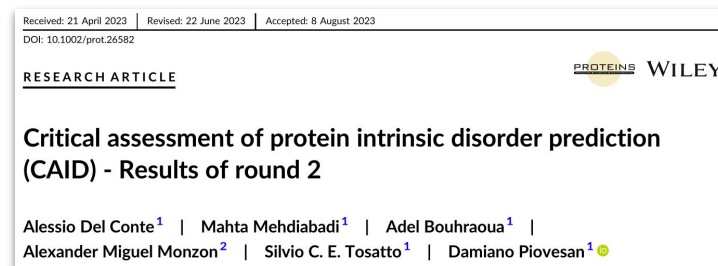
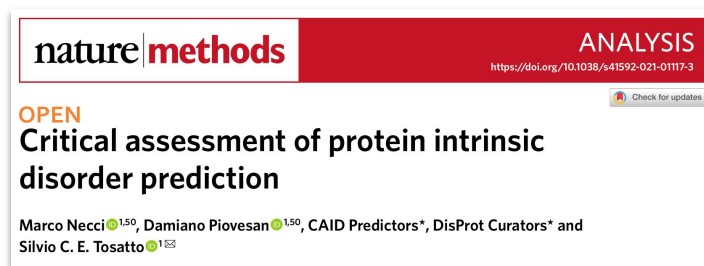
Sequence based prediction of **intrinsically disordered regions (IDRs)** and **binding regions** inside IDRs.

The server executes disorder prediction methods in parallel and applies optimized thresholds based on the results of the **Critical Assessment of Intrinsic protein Disorder (CAID)**. More info about the [CAID optimization strategy](#). Currently, the server can run **33** disorder and **13** binding methods - [Full list of methods](#)

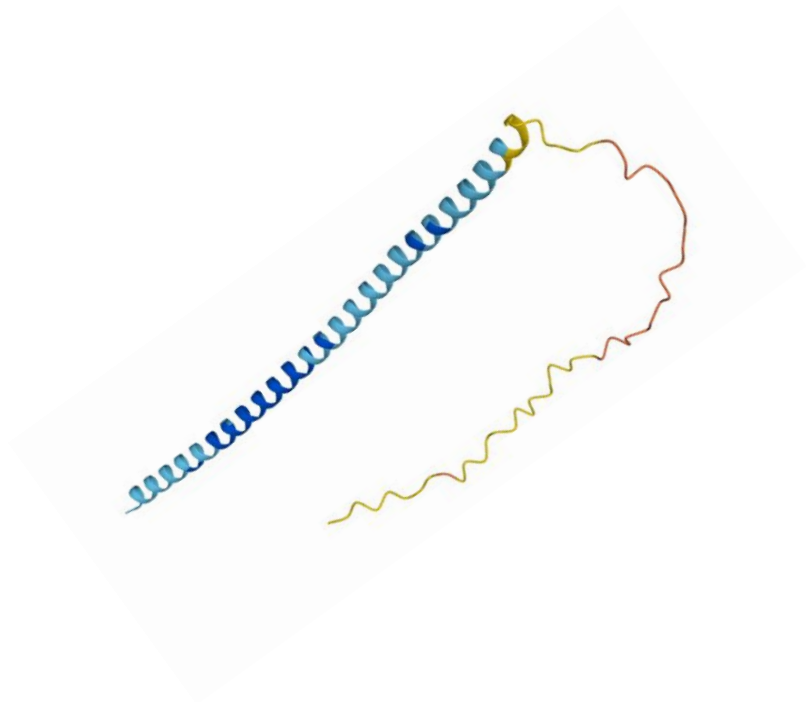
CAID Prediction Portal: A Comprehensive Service for Predicting Intrinsic Disorder and Binding Regions in Proteins  
*Del Conte et al. 2023 Nucl Acids Res (Web Server Issue)*

<https://caid.idpcentral.org/>

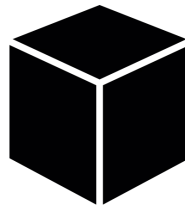
# CAID3 timeline



# The challenge



Sequence + Optional input



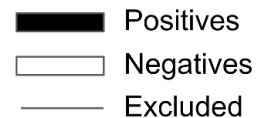
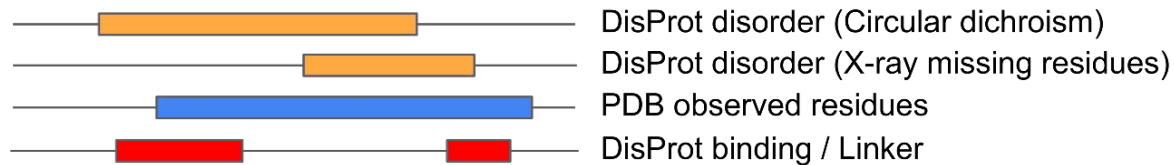
# Predictors

- **69 predictors**
  - 46 already in CAID2
  - **19 new predictors**
    - 15 submitted as Docker containers (DockerHub)
    - Only 2 predictors had problems with installation (solved)

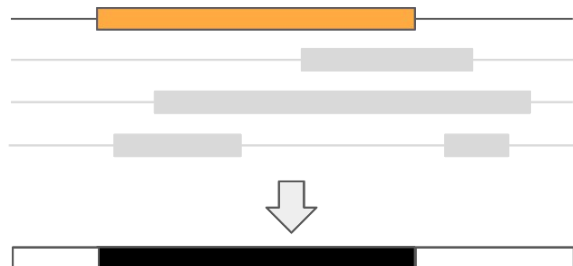
# Additional inputs

- **PSI-Blast** on Uniref90 → PSSM
  - **MMseqs2** on UniRef30 → MSA
  - **HHblits** on Uniclust30\_2017\_10 → HMM
  - **SPIDER2** → SS, ASA, torsion angles
  - **Embeddings**
- Rost lab embeddings
    - **Prot-t5-xl-uniref50** used by 8 methods
    - **ProstT5** used by 1 method
  - Facebook embeddings
    - **esm1b\_t33\_650M\_UR50S** used by 1 method
    - **esm2\_t33\_650M\_UR50D** used by 2 methods
    - **esm\_msa1b\_t12\_100M\_UR50S** used by 3 methods (embeddings from MSA)

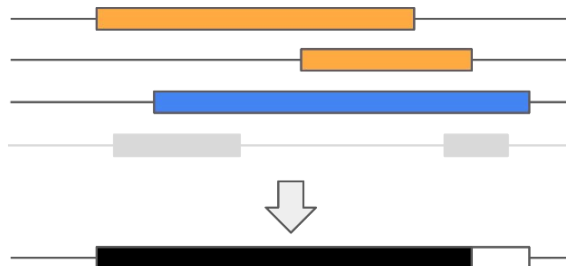
# Ground truth



Disorder-NOX



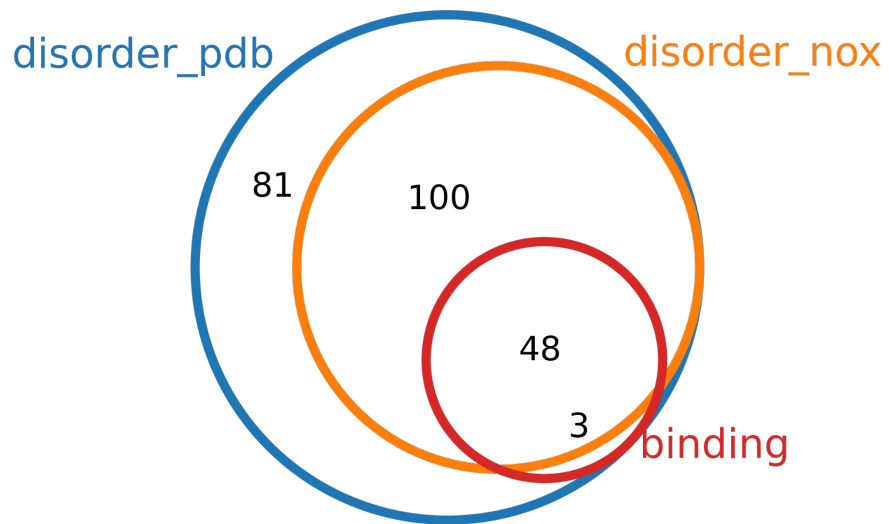
Disorder-PDB



Binding / Linker

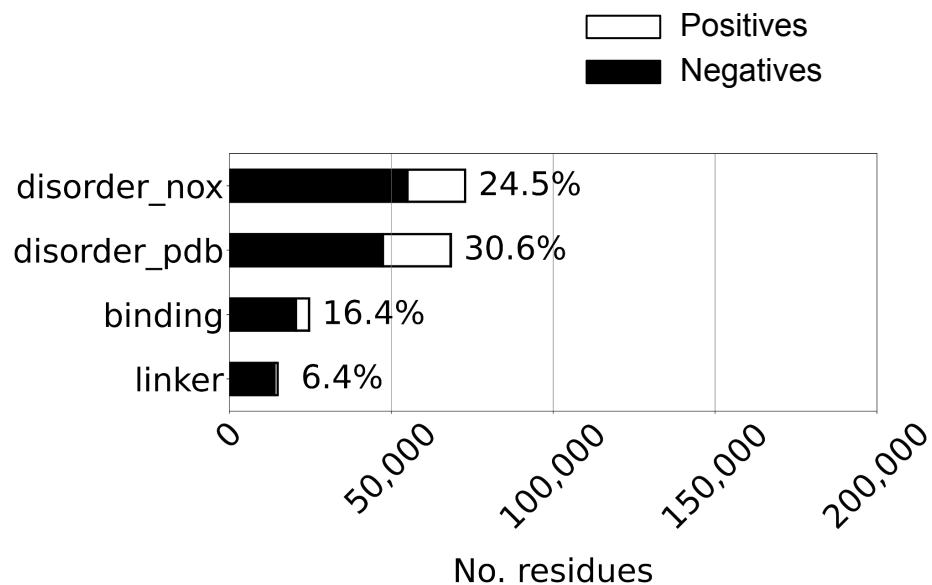






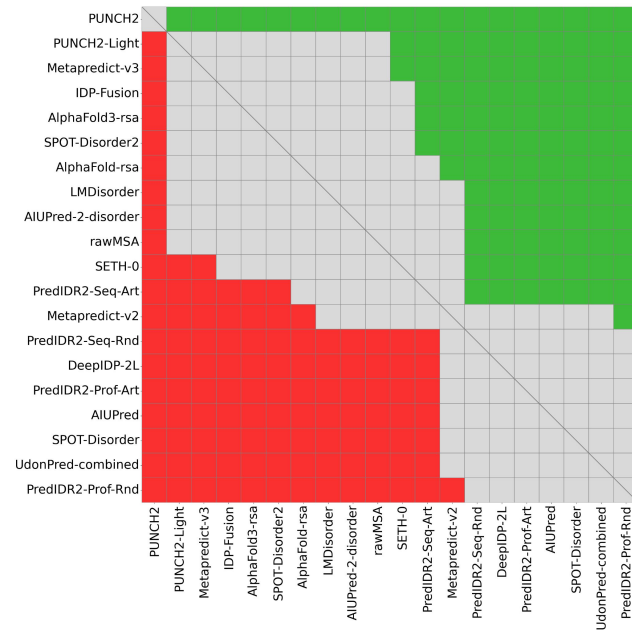
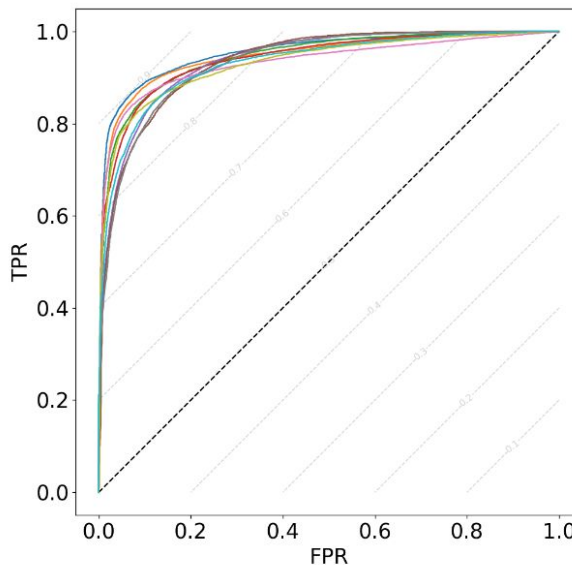
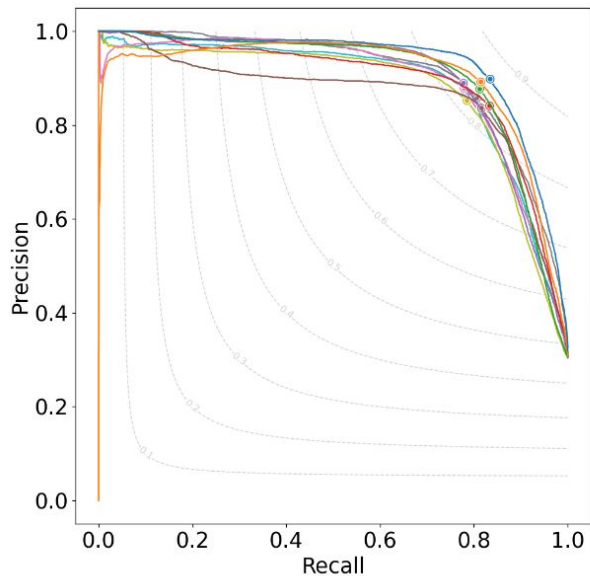
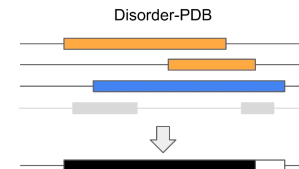
Disorder-PDB	232
Disorder-NOX	148
Binding	51
Linkers	20

7 isoforms!



# Results

# Disorder PDB - top 10 predictors



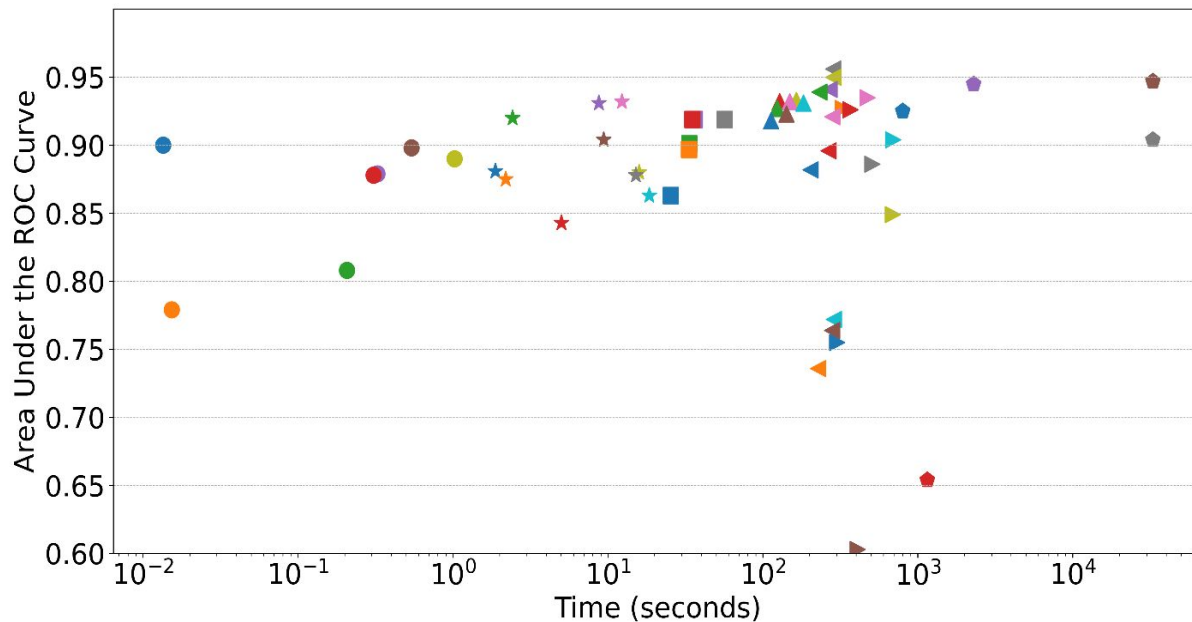
PUNCH2 - F-MAX: 0.86, C: 0.97  
 AlphaFold-rsa - F-MAX: 0.85, C: 0.93  
 SETH-0 - F-MAX: 0.84, C: 1.00  
 ESMDISPred-2PDB - F-MAX: 0.84, C: 0.85  
 Metapredict-v3 - F-MAX: 0.83, C: 1.00

UdonPred-combined - F-MAX: 0.83, C: 1.00  
 AIUPred-2-disorder - F-MAX: 0.83, C: 1.00  
 SPOT-Disorder2 - F-MAX: 0.83, C: 0.94  
 SETH-1 - F-MAX: 0.82, C: 1.00  
 IDP-Fusion - F-MAX: 0.82, C: 0.97

PUNCH2 - AUC: 0.956  
 AlphaFold-rsa - AUC: 0.947  
 SPOT-Disorder2 - AUC: 0.945  
 LMDisorder - AUC: 0.941  
 PredIDR2-Seq-Art - AUC: 0.939

PredIDR2-Prof-Art - AUC: 0.935  
 SETH-0 - AUC: 0.933  
 PredIDR2-Seq-Rnd - AUC: 0.933  
 AIUPred-2-disorder - AUC: 0.932  
 rawMSA - AUC: 0.932

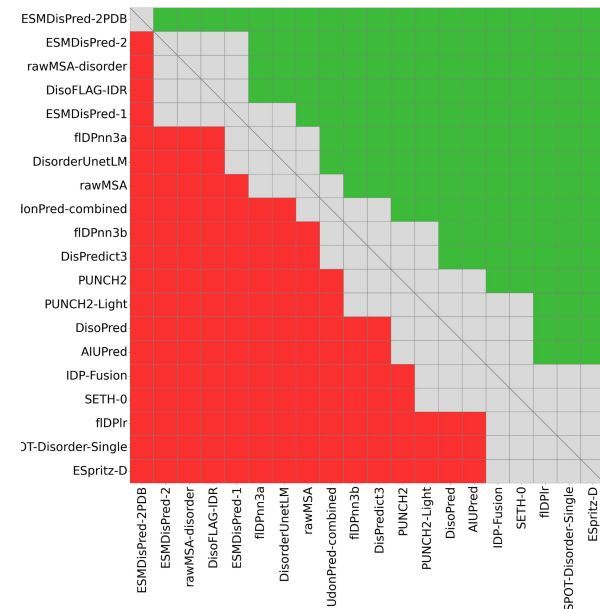
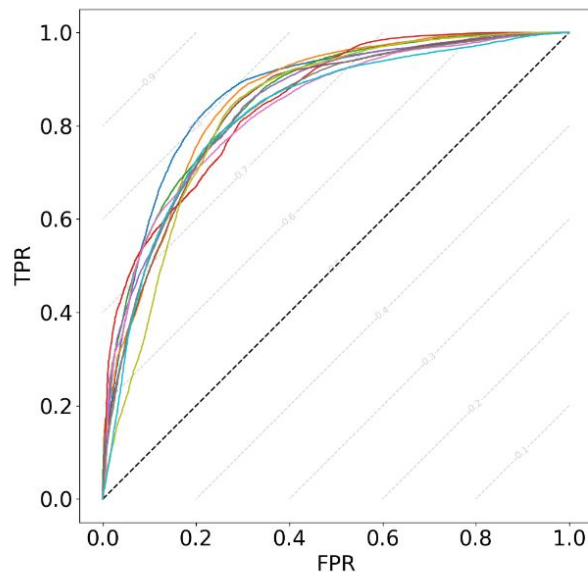
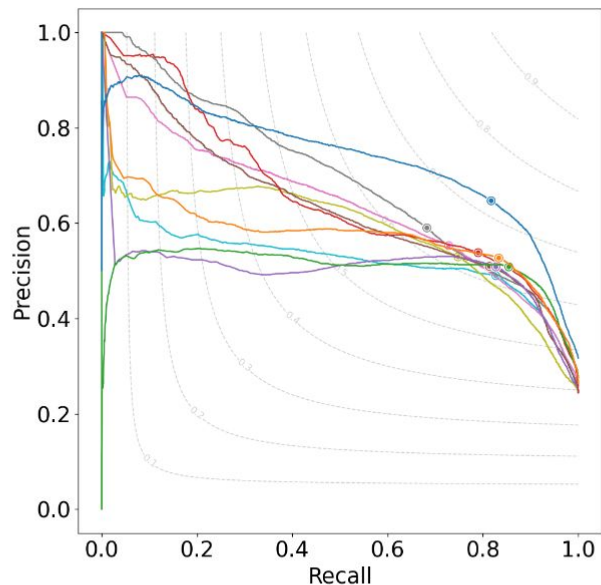
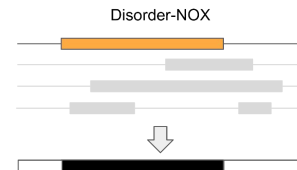
# Time vs AUC of methods - Disorder PDB



## Top 25 by ROC AUC

◀	PUNCH2 - AUC: 0.956, 4.7m	←
◀	PUNCH2-Light - AUC: 0.950, 4.7m	←
◀	AlphaFold-disorder - AUC: 0.947, 9.1h	
◀	SPOT-Disorder2 - AUC: 0.945, 38.1m	
◀	LMDisorder - AUC: 0.941, 4.5m	←
◀	PredIDR2-Seq - AUC: 0.939, 3.9m	←
◀	PredIDR2-Prof - AUC: 0.935, 7.9m	←
◀	SETH-0 - AUC: 0.933, 2.7m	←
◀	AIUPred-2 - AUC: 0.932, 12.3s	←
◀	rawMSA - AUC: 0.932, 2.1m	←
◀	ESMDisPred - AUC: 0.932, 2.5m	←
◀	IDP-Fusion - AUC: 0.931, 3.0m	
◀	Metapredict - AUC: 0.931, 8.7s	←
◀	DisorderUnetLM - AUC: 0.927, 5.5m	←
◀	UdonPred - AUC: 0.927, 2.1m	←
◀	PredIDR - AUC: 0.926, 6.1m	
◀	SPOT-Disorder - AUC: 0.925, 13.3m	
◀	DisoPred - AUC: 0.923, 2.4m	
◀	DisoFLAG - AUC: 0.921, 4.7m	←
◀	DARUMA-beta - AUC: 0.920, 2.4s	←
◀	SPOT-Disorder-Single - AUC: 0.919, 36.4s	
◀	DeepIDP-2L - AUC: 0.919, 56.8s	
◀	SETH-1 - AUC: 0.919, 35.1s	←
◀	AUCpred - AUC: 0.918, 1.9m	
◀	NeProc2-beta - AUC: 0.904, 11.5m	←

# Disorder NOX - top 10 predictors



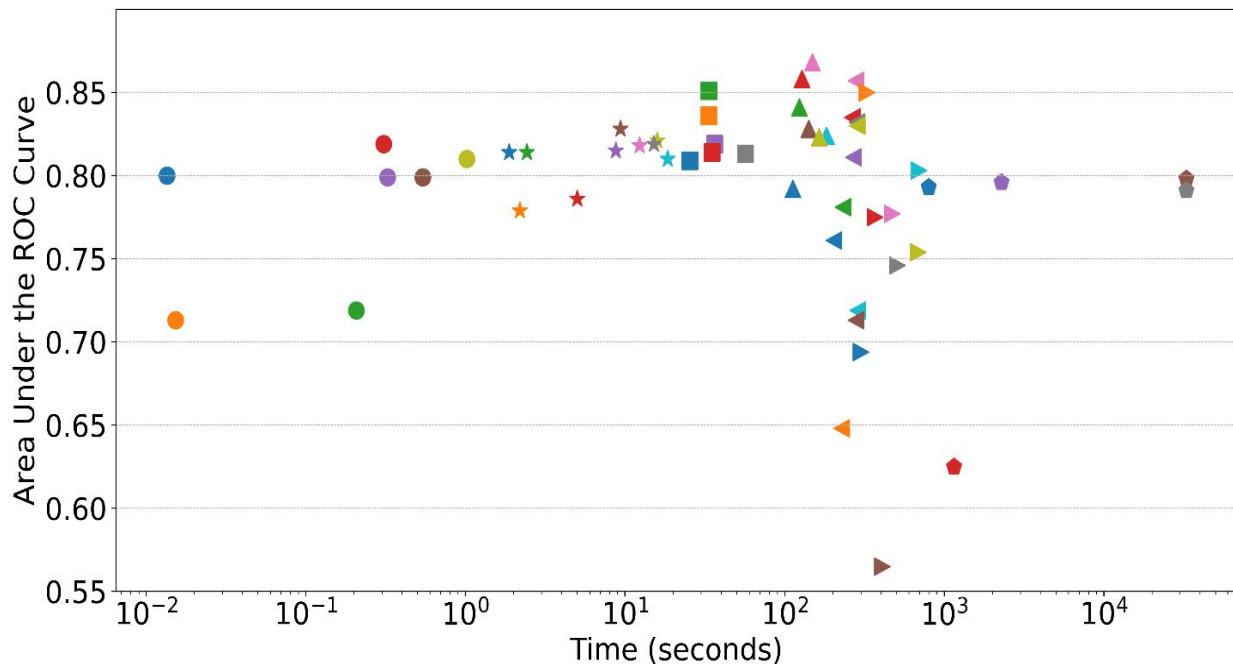
ESMDisPred-2PDB - F-MAX: 0.72, C: 0.86  
 PUNCH2 - F-MAX: 0.65, C: 0.98  
 AlphaFold-rsa - F-MAX: 0.64, C: 0.91  
 rawMSA-disorder - F-MAX: 0.64, C: 0.99  
 Metapredict-v3 - F-MAX: 0.63, C: 1.00

UdonPred-combined - F-MAX: 0.63, C: 0.99  
 DisPredict3 - F-MAX: 0.63, C: 0.96  
 DisoFLAG-IDR - F-MAX: 0.63, C: 0.97  
 AIUPred - F-MAX: 0.62, C: 0.99  
 AIUPred-2-disorder - F-MAX: 0.62, C: 1.00

ESMDisPred-2PDB - AUC: 0.868  
 rawMSA-disorder - AUC: 0.858  
 DisoFLAG-IDR - AUC: 0.857  
 DisorderUnetLM - AUC: 0.85  
 rawMSA - AUC: 0.847

UdonPred-combined - AUC: 0.841  
 fIDPnn3b - AUC: 0.836  
 DisPredict3 - AUC: 0.835  
 PUNCH2 - AUC: 0.832  
 AIUPred - AUC: 0.828

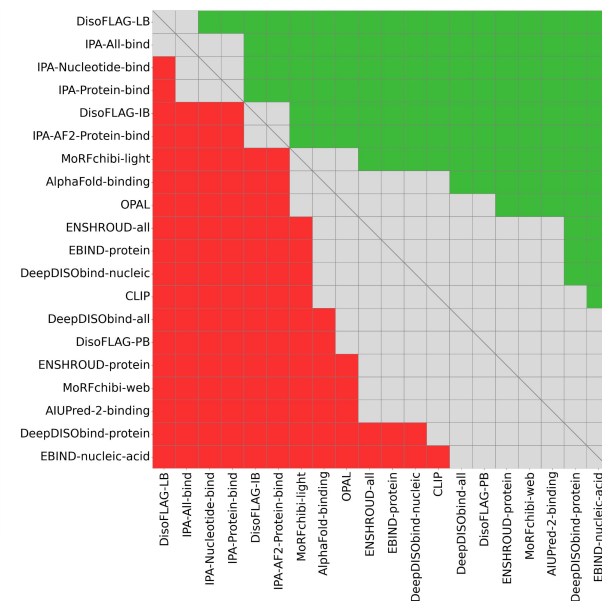
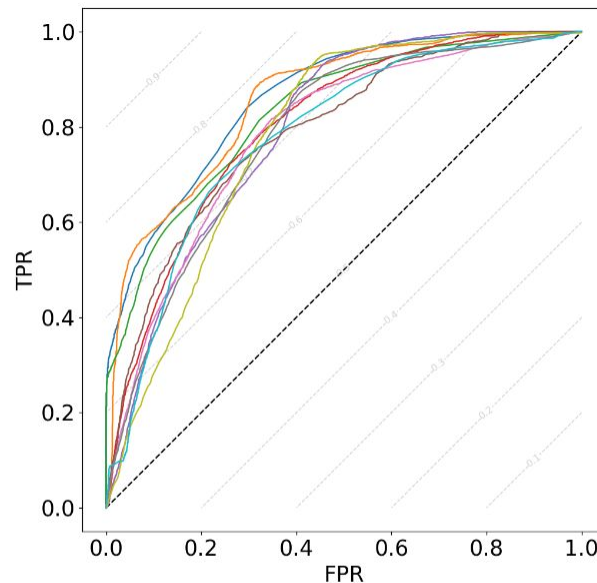
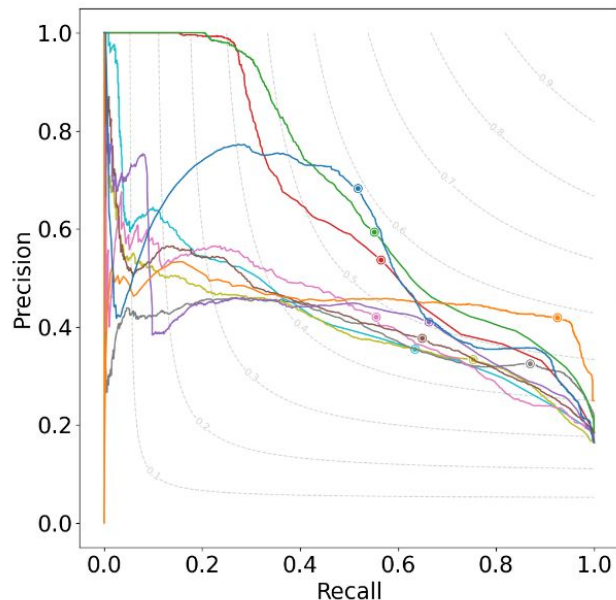
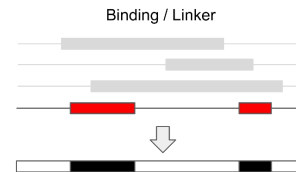
# Time vs AUC of methods - Disorder NOX



## Top 25 by ROC AUC

ESMDisPred	- AUC: 0.868, 2.5m	←
rawMSA	- AUC: 0.858, 2.1m	←
DisoFLAG	- AUC: 0.857, 4.7m	←
fIDPnn3a	- AUC: 0.851, 33.5s	←
DisorderUnetLM	- AUC: 0.850, 5.5m	←
UdonPred	- AUC: 0.841, 2.1m	←
fIDPnn3b	- AUC: 0.836, 33.3s	←
DisPredict3	- AUC: 0.835, 4.4m	←
PUNCH2	- AUC: 0.832, 4.7m	←
PUNCH2-Light	- AUC: 0.830, 4.7m	←
AIUPred	- AUC: 0.828, 9.4s	←
DisoPred	- AUC: 0.828, 2.4m	←
IDP-Fusion	- AUC: 0.824, 3.0m	←
SETH-0	- AUC: 0.823, 2.7m	←
fIDPIr	- AUC: 0.821, 15.9s	←
SPOT-Disorder-Single	- AUC: 0.819, 36.4s	←
ESpritz	- AUC: 0.819, 307.7ms	←
fIDPnn2	- AUC: 0.819, 15.2s	←
AIUPred-2	- AUC: 0.818, 12.3s	←
Metapredict	- AUC: 0.815, 8.7s	←
SETH-1	- AUC: 0.814, 35.1s	←
DARUMA-beta	- AUC: 0.814, 2.4s	←
pyHCA	- AUC: 0.814, 1.9s	←
DeepIDP-2L	- AUC: 0.813, 56.8s	←
LMDisorder	- AUC: 0.811, 4.5m	←

# Binding - top 10 predictors



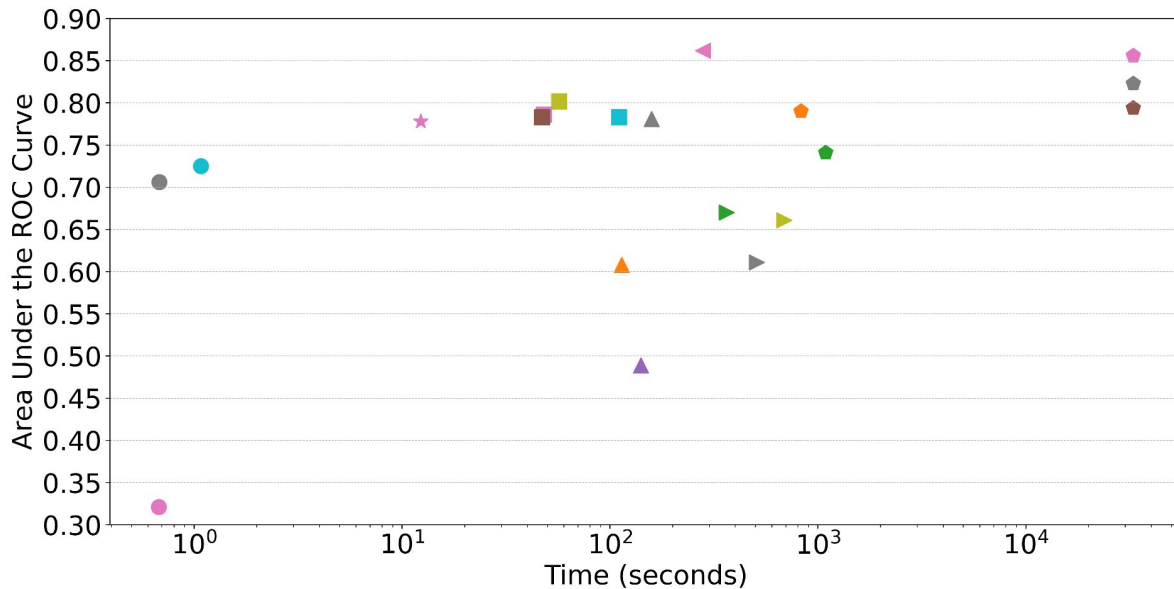
IPA-All-bind - F-MAX: 0.59, C: 1.00  
EBIND-protein - F-MAX: 0.58, C: 0.88  
DisoFLAG-LB - F-MAX: 0.57, C: 0.98  
DisoFLAG-IB - F-MAX: 0.55, C: 0.98  
CLIP - F-MAX: 0.51, C: 0.98

MoRFchibi-light - F-MAX: 0.48, C: 0.98  
OPAL - F-MAX: 0.48, C: 0.98  
AlphaFold-binding - F-MAX: 0.47, C: 0.88  
ENSHROUD-all - F-MAX: 0.46, C: 0.98  
DisoFLAG-RB - F-MAX: 0.46, C: 0.98

DisoFLAG-LB - AUC: 0.862  
IPA-All-bind - AUC: 0.856  
DisoFLAG-IB - AUC: 0.832  
MoRFchibi-light - AUC: 0.802  
AlphaFold-binding - AUC: 0.794

OPAL - AUC: 0.79  
ENSHROUD-all - AUC: 0.786  
DeepDISObind-nucleic - AUC: 0.783  
EBIND-protein - AUC: 0.783  
CLIP - AUC: 0.781

# Time vs AUC of methods - Binding

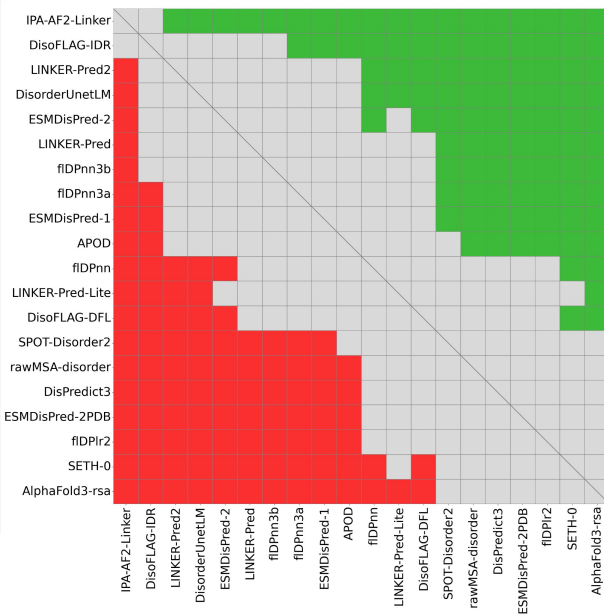
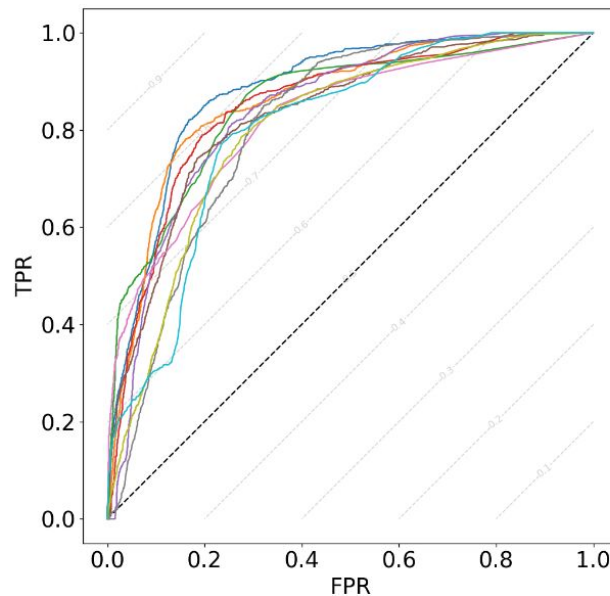
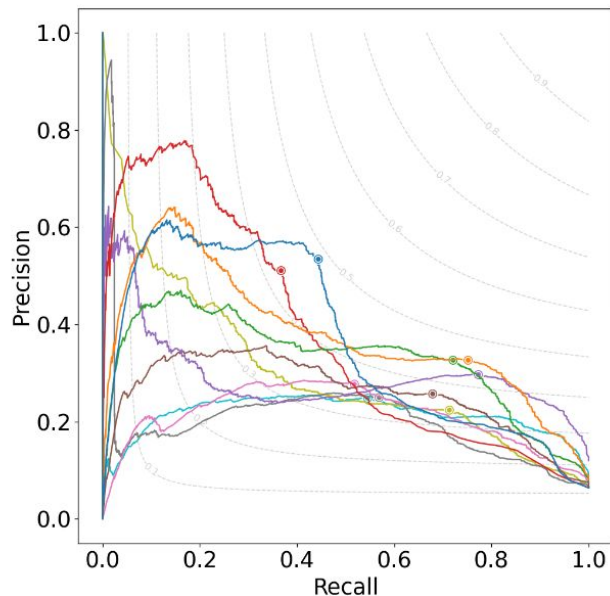
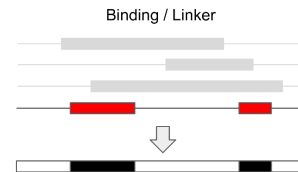


All methods by ROC AUC

- DisoFLAG - AUC: 0.862, 4.7m
- IPA - AUC: 0.856, 9.1h
- IPA-AF2 - AUC: 0.823, 9.1h
- MoRFchibi - AUC: 0.802, 57.0s
- AlphaFold-disorder - AUC: 0.794, 9.1h
- OPAL - AUC: 0.790, 13.8m
- ENSHROUD - AUC: 0.786, 48.0s
- EBIND - AUC: 0.783, 1.8m
- DeepDISObind - AUC: 0.783, 47.0s
- CLIP - AUC: 0.781, 2.6m
- AIUPred-2 - AUC: 0.778, 12.3s
- DRPBind - AUC: 0.741, 18.1m
- ANCHOR2 - AUC: 0.725, 1.1s
- DisoRDPbind - AUC: 0.706, 680.3ms
- LIPNet - AUC: 0.670, 6.1m
- NeProc - AUC: 0.661, 11.5m
- DISOPRED3 - AUC: 0.611, 8.5m
- ProBiPred - AUC: 0.608, 1.9m
- bindEmbed21IDR - AUC: 0.489, 2.3m
- DFLpred - AUC: 0.321, 676.2ms



# Linker - top 10 predictors



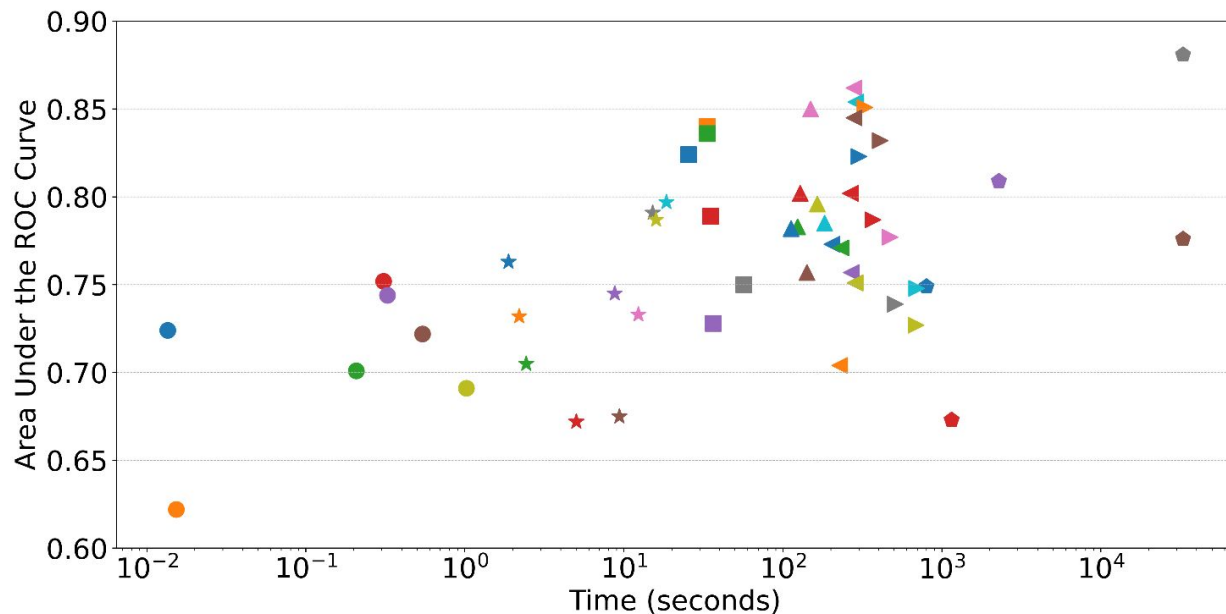
LINKER-Pred2 - F-MAX: 0.48, C: 1.00  
 IPA-AF2-Linker - F-MAX: 0.46, C: 0.95  
 DisoFLAG-IDR - F-MAX: 0.45, C: 0.95  
 LINKER-Pred-Lite - F-MAX: 0.43, C: 1.00  
 ESMDISPred-2PDB - F-MAX: 0.43, C: 0.75

DisorderUnetLM - F-MAX: 0.37, C: 1.00  
 fIDPnn3b - F-MAX: 0.36, C: 1.00  
 fIDPIr2 - F-MAX: 0.35, C: 1.00  
 APOD - F-MAX: 0.34, C: 1.00  
 SPOT-Disorder2 - F-MAX: 0.34, C: 0.90

IPA-AF2-Linker - AUC: 0.881  
 DisoFLAG-IDR - AUC: 0.862  
 LINKER-Pred2 - AUC: 0.854  
 DisorderUnetLM - AUC: 0.851  
 fIDPnn3b - AUC: 0.84

APOD - AUC: 0.832  
 LINKER-Pred-Lite - AUC: 0.823  
 SPOT-Disorder2 - AUC: 0.809  
 DisPredict3 - AUC: 0.802  
 rawMSA-disorder - AUC: 0.802

# Time vs AUC of methods - Linkers

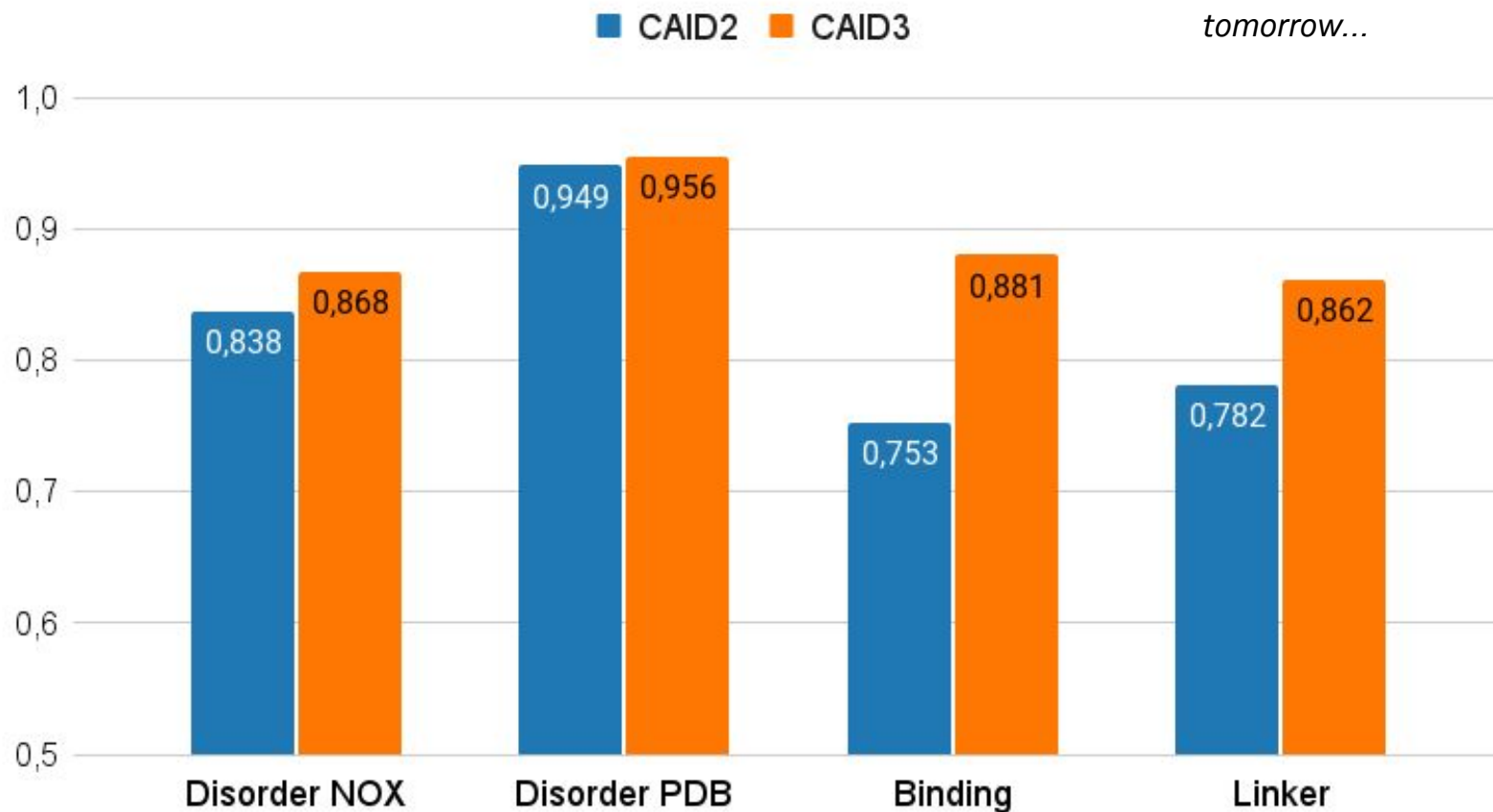


## Top 25 methods by ROC AUC

IPA-AF2 - AUC: 0.881, 9.1h	←
DisoFLAG - AUC: 0.862, 4.7m	←
LINKER-Pred2 - AUC: 0.854, 4.8m	←
DisorderUnetLM - AUC: 0.851, 5.5m	←
ESMDisPred - AUC: 0.850, 2.5m	←
LINKER-Pred - AUC: 0.845, 4.7m	←
fIDPnn3b - AUC: 0.840, 33.3s	←
fIDPnn3a - AUC: 0.836, 33.5s	←
APOD - AUC: 0.832, 6.8m	←
fIDPnn - AUC: 0.824, 25.5s	←
LINKER-Pred-Lite - AUC: 0.823, 5.0m	←
SPOT-Disorder2 - AUC: 0.809, 38.1m	←
rawMSA - AUC: 0.802, 2.1m	←
DisPredict3 - AUC: 0.802, 4.4m	←
fIDPIr2 - AUC: 0.797, 18.5s	←
SETH-0 - AUC: 0.796, 2.7m	←
fIDPnn2 - AUC: 0.791, 15.2s	←
SETH-1 - AUC: 0.789, 35.1s	←
fIDPIr - AUC: 0.787, 15.9s	←
PredIDR - AUC: 0.787, 6.1m	←
IDP-Fusion - AUC: 0.785, 3.0m	←
UdonPred - AUC: 0.783, 2.1m	←
AUCpred - AUC: 0.782, 1.9m	←
PredIDR2-Prof - AUC: 0.777, 7.9m	←
AlphaFold-disorder - AUC: 0.776, 9.1h	←

## CAID2 vs CAID3 max ROC AUC

More CAID-3 results  
on Damiano's poster  
tomorrow...



# Acknowledgements



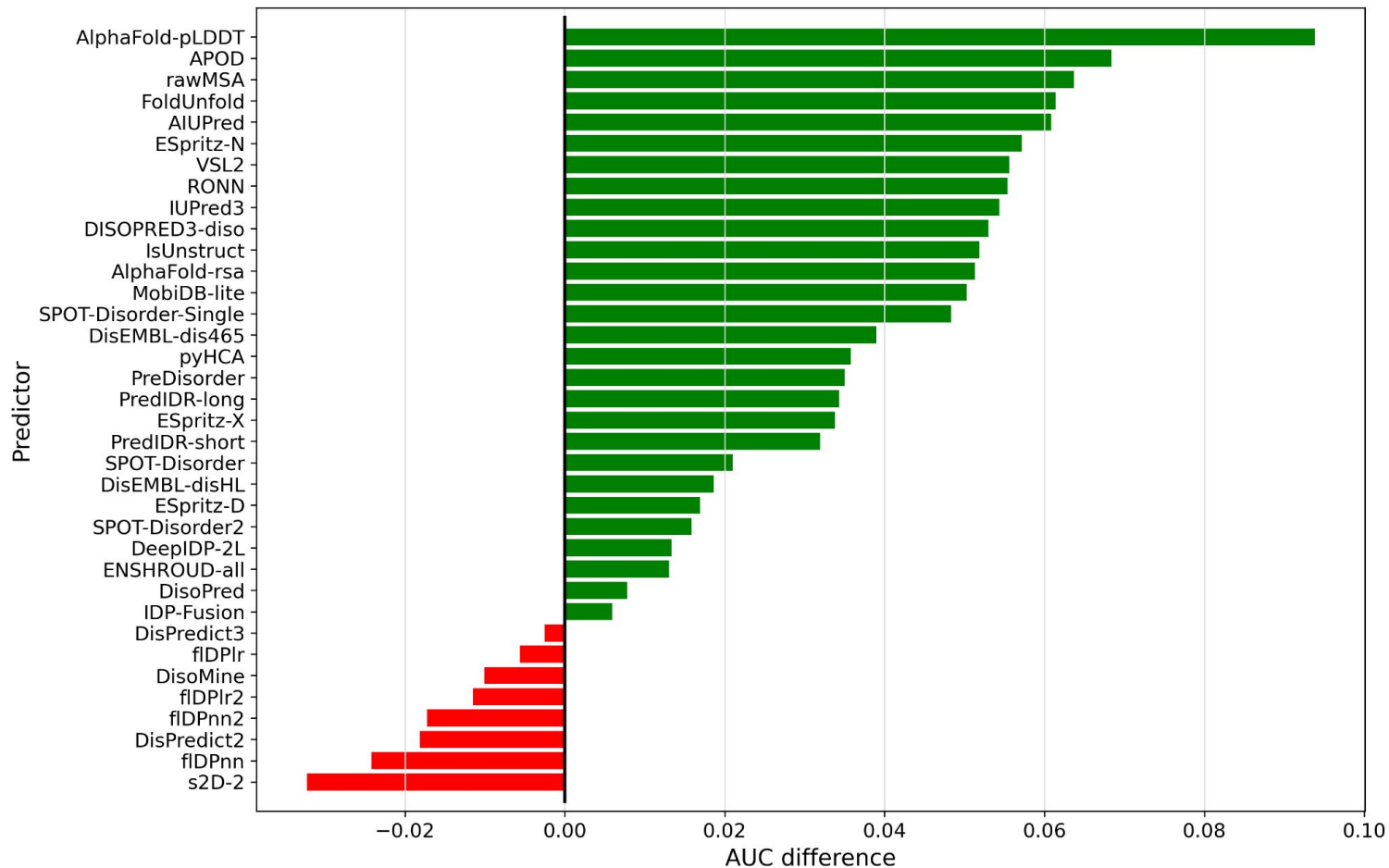
**BioComputing UP**  
University of Padova  
Dept. of Biomedical Sciences

<https://biocomputingup.it>

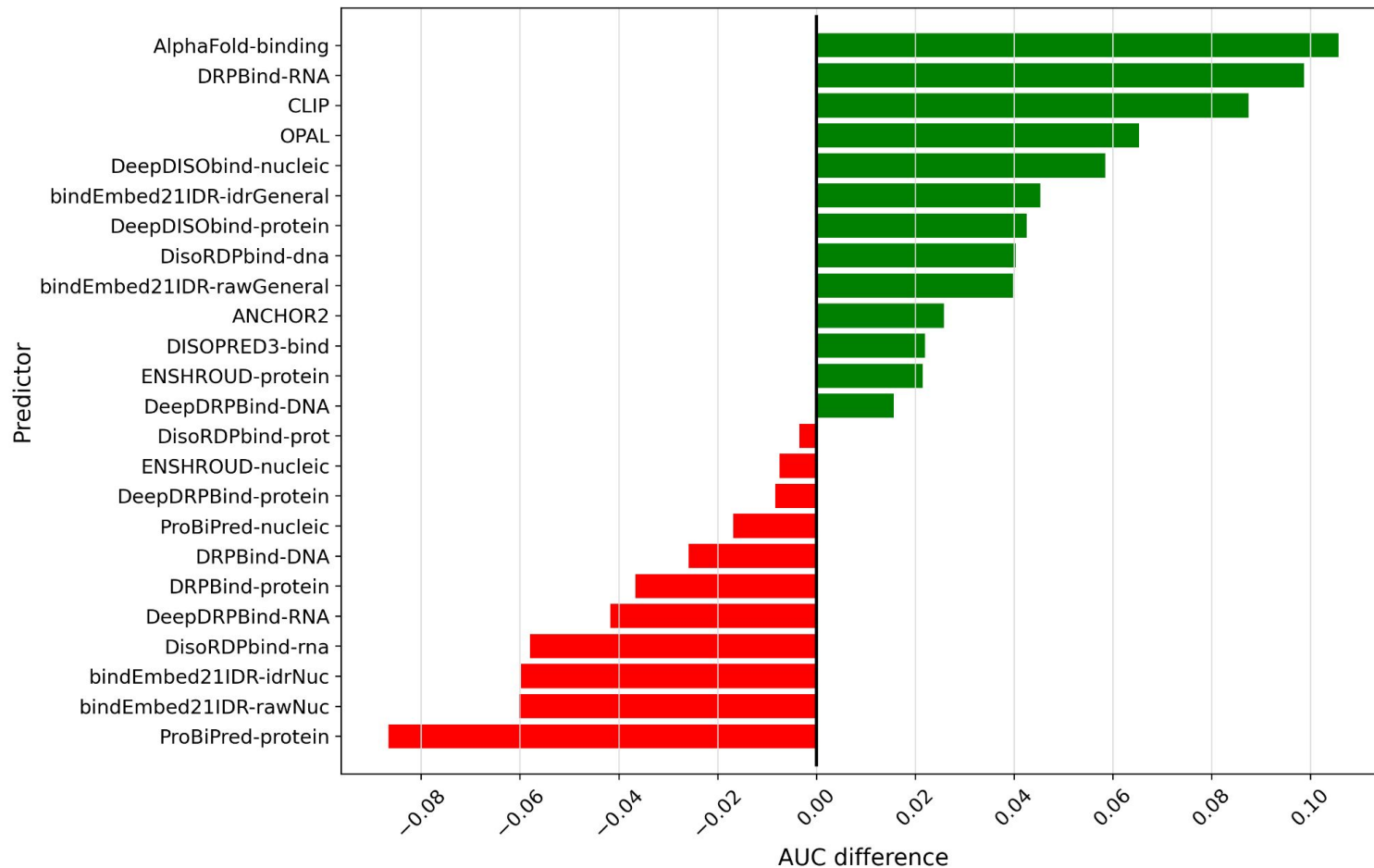
X @BioComputingUP



Difference in AUC between CAID3 and CAID2 predictors (CAID3 - CAID2) on Disorder NOX reference

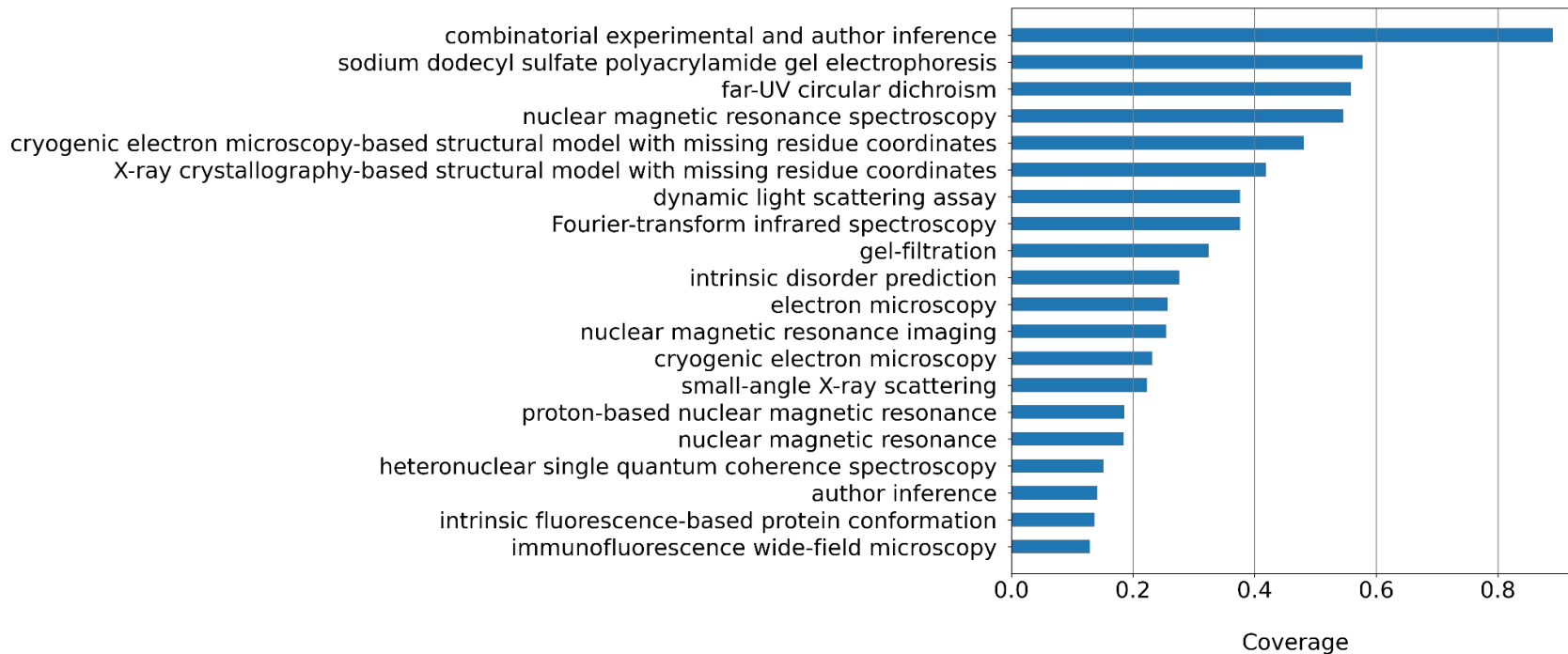


Difference in AUC between CAID3 and CAID2 predictors (CAID3 - CAID2) on Binding reference

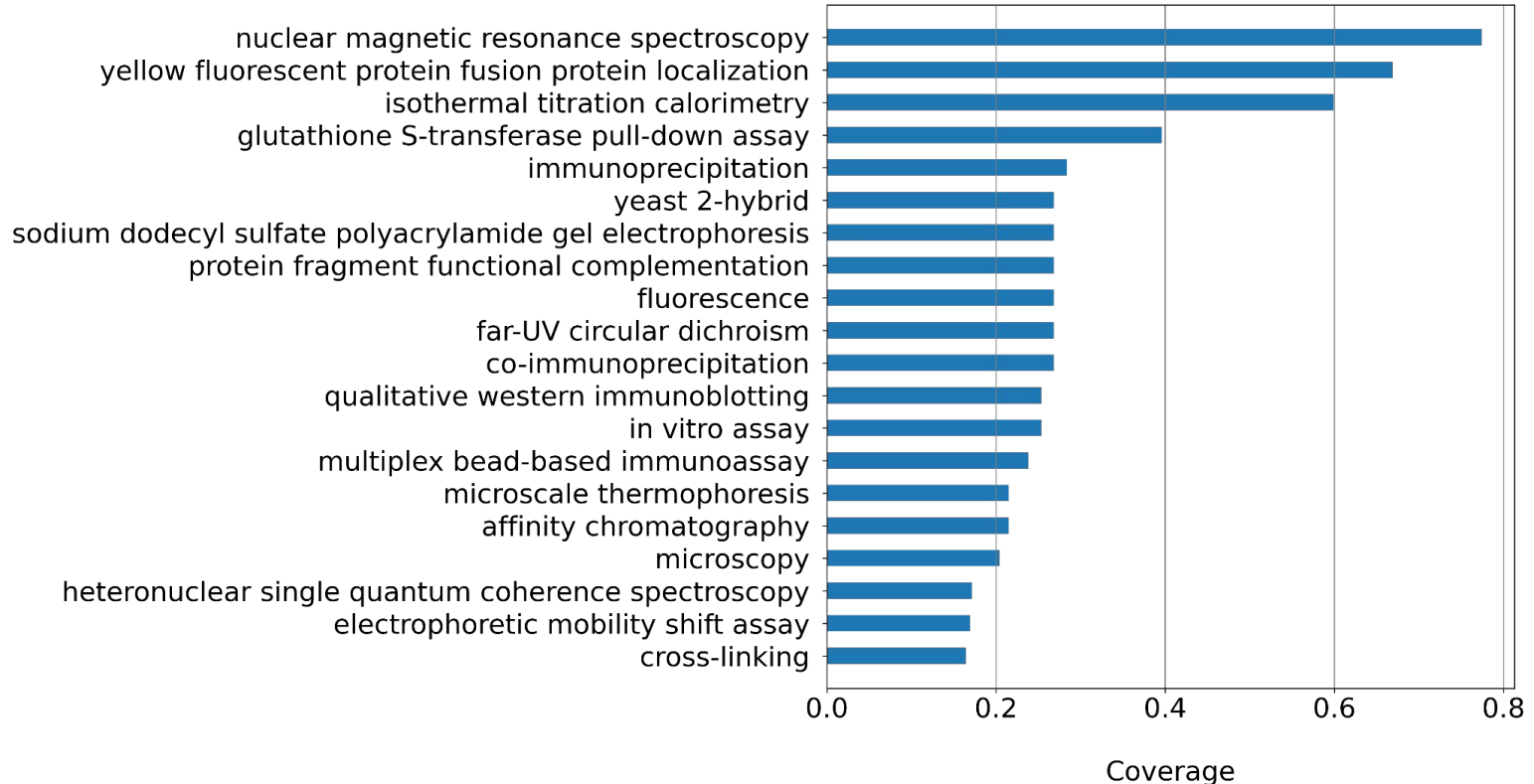




# Disorder evidence



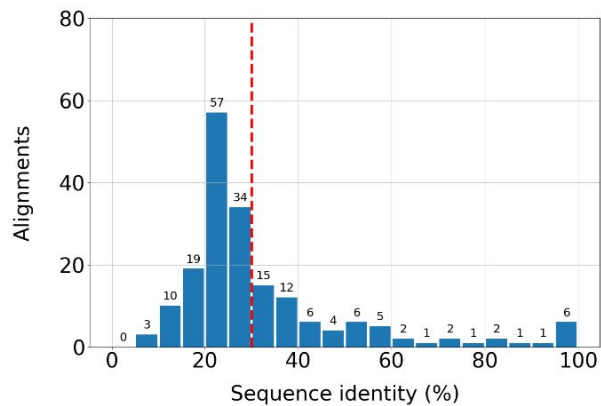
# Binding evidence





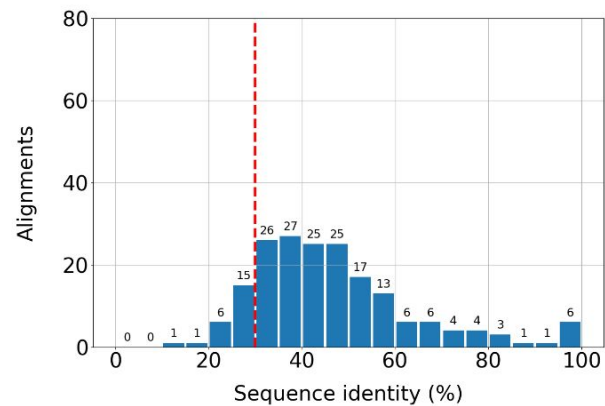
## Smith–Waterman

CAID3 Vs. DisProt-Old - Local

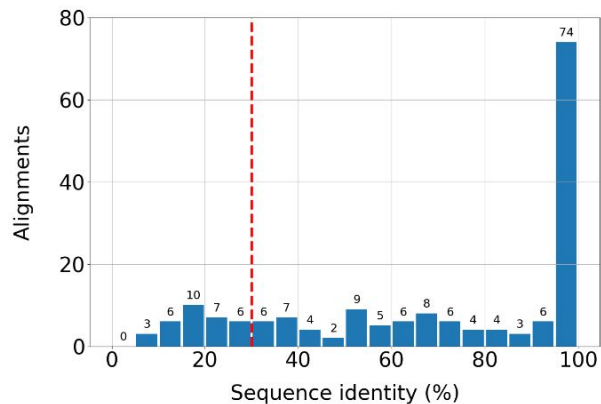


## Needleman–Wunsch

CAID3 Vs. DisProt-Old - Global



CAID3 Vs. PDB-Seqres - Local



CAID3 Vs. PDB-Seqres - Global

