

# BINDING DECISIONS: PREDICTION OF PROTEIN/PEPTIDE INTERACTIONS

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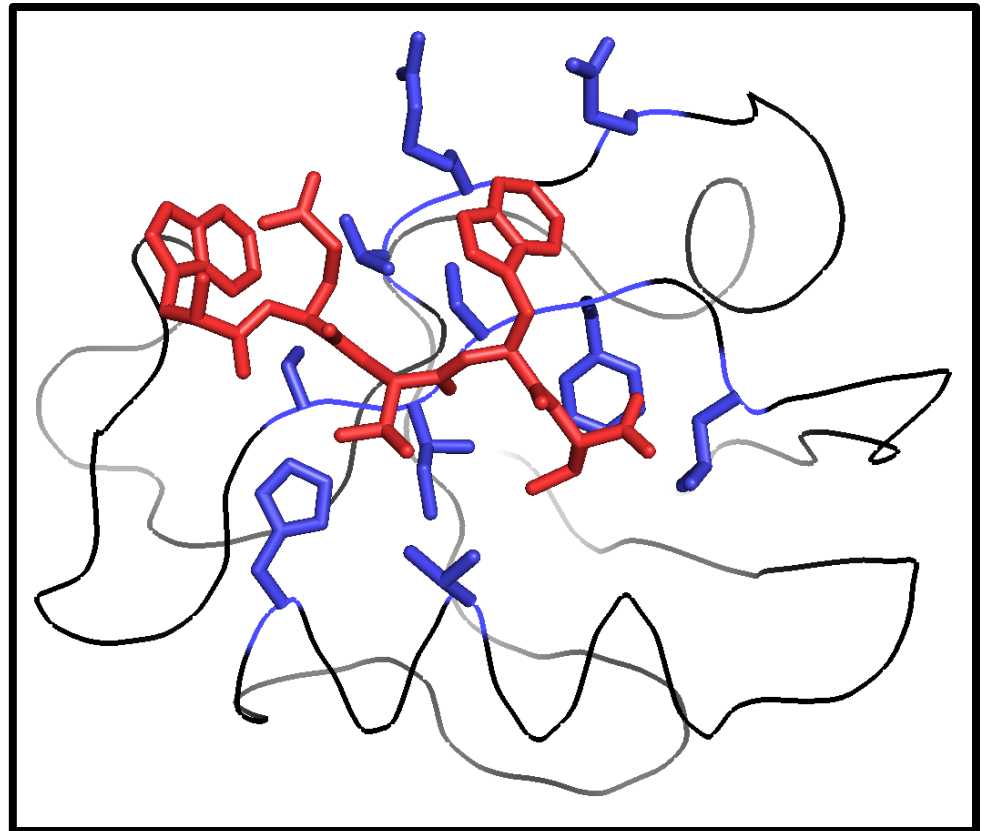
RosettaCon  
08/05/2010

# Objective

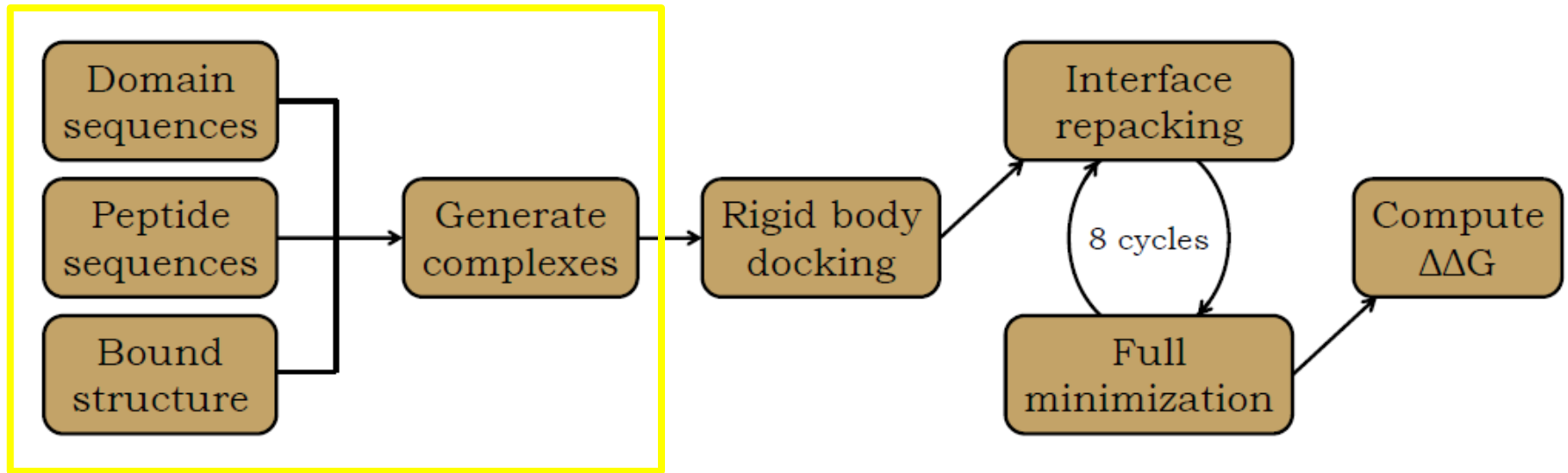
- Develop and test a protocol that accurately predicts
  - ▣ binding and non-binding events
  - ▣ binding preferences

# PDZ single point mutant dataset

- Tonikian et al., 2008 phage display data
- Human Erbin (ERBB2IP-1) PDZ
- 91 mutations at 10 interface positions
- Unique phage derived peptides:
  - 2975 heptapeptides
  - 2156 hexapeptides
  - 934 pentapeptides
  - 328 tetrapeptides

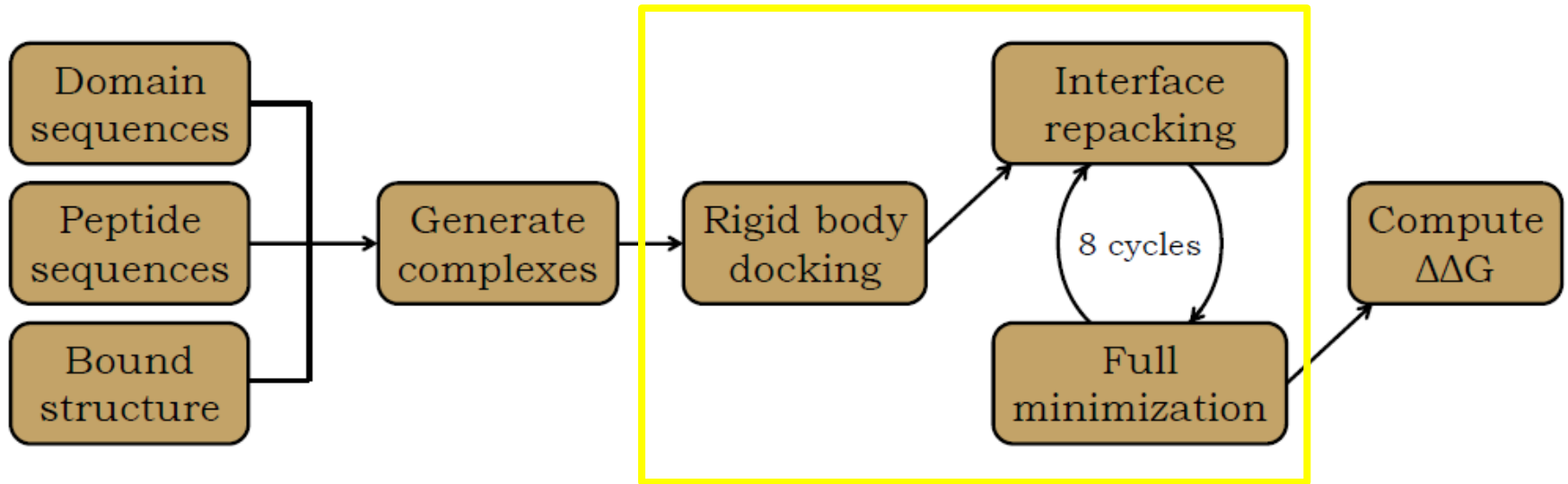


# Protocol overview



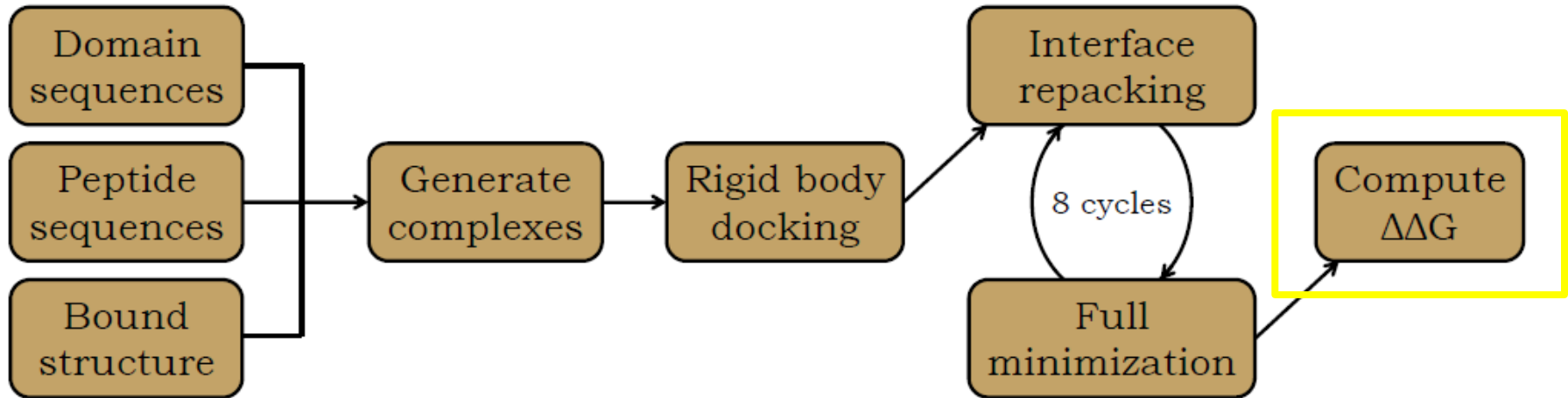
- Generated 29,900 complexes from 92 domain and 325 tetrapeptide sequences
- Threaded sequences onto relaxed Erbin PDZ crystal holo structure template (1.25 Å)

# Protocol overview



- Small dock moves (S.D. 0.3 Å, 3.0°)
- Repulsive weight increased from 12.5% to 100% Score12 value during iterative repack/minimize

# Protocol overview



- $\Delta\Delta G = \Delta G_{bound} - \Delta G_{unbound}$
- Interface residues repacked in the unbound state before scoring

# Optimization of the $\Delta\Delta G$ function

$$\Delta\Delta G_{total} = w_{atr}\Delta\Delta G_{atr} + w_{rep}\Delta\Delta G_{rep} + w_{sol}\Delta\Delta G_{sol} + w_{hbond\_bb\_bb}\Delta\Delta G_{hbond\_bb\_bb} + w_{hbond\_bb\_sc}\Delta\Delta G_{hbond\_bb\_sc} + w_{hbond\_sc\_sc}\Delta\Delta G_{hbond\_sc\_sc}$$

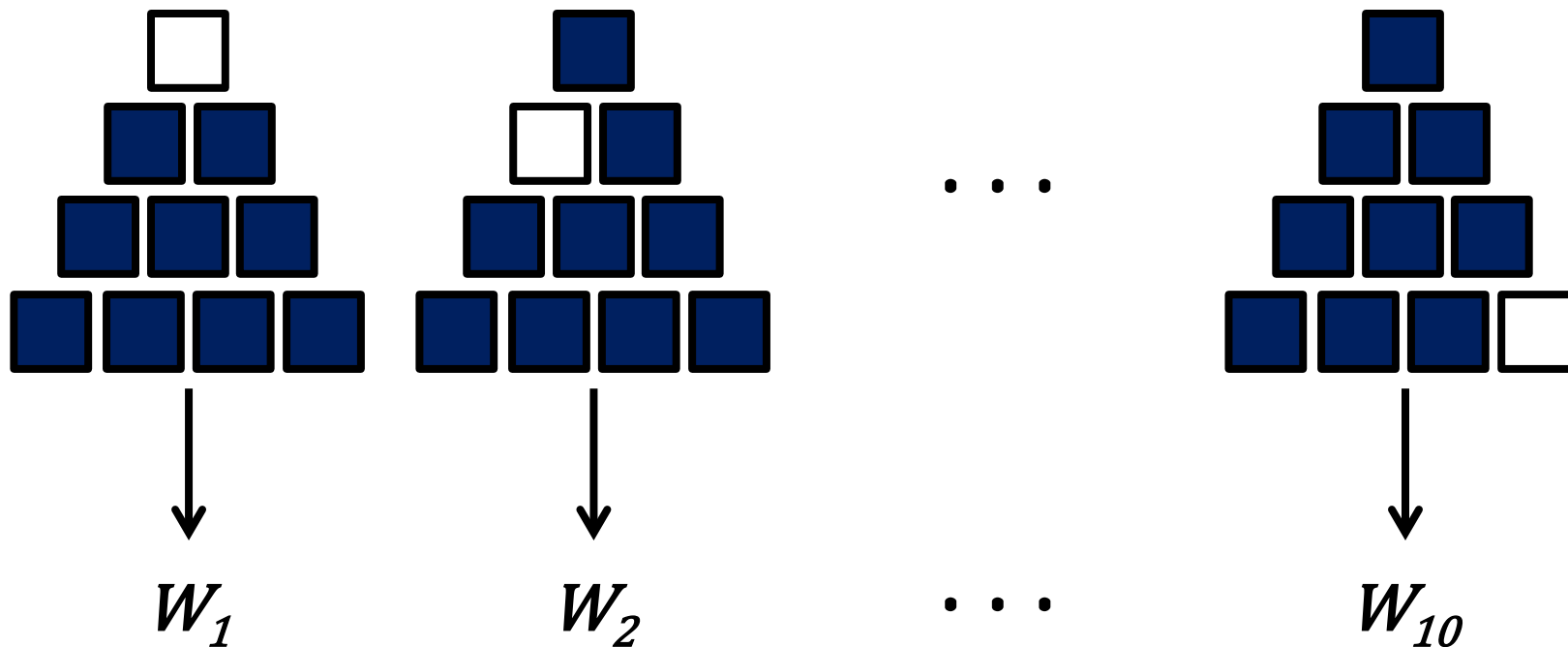
Complex	$\Delta\Delta G_{atr}$	$\Delta\Delta G_{rep}$	$\Delta\Delta G_{total}$	Binds?
A	-60	12	-48	0
B	-60	13	-47	0
C	-44	7	-37	1
D	-42	7	-35	1



Complex	$\Delta\Delta G_{atr}$	$\Delta\Delta G_{rep}$	$\Delta\Delta G_{total}$	Binds?
C	-22	14	-8	1
D	-21	14	-7	1
A	-30	24	-6	0
B	-30	26	-4	0

# 10-fold cross-validation analysis

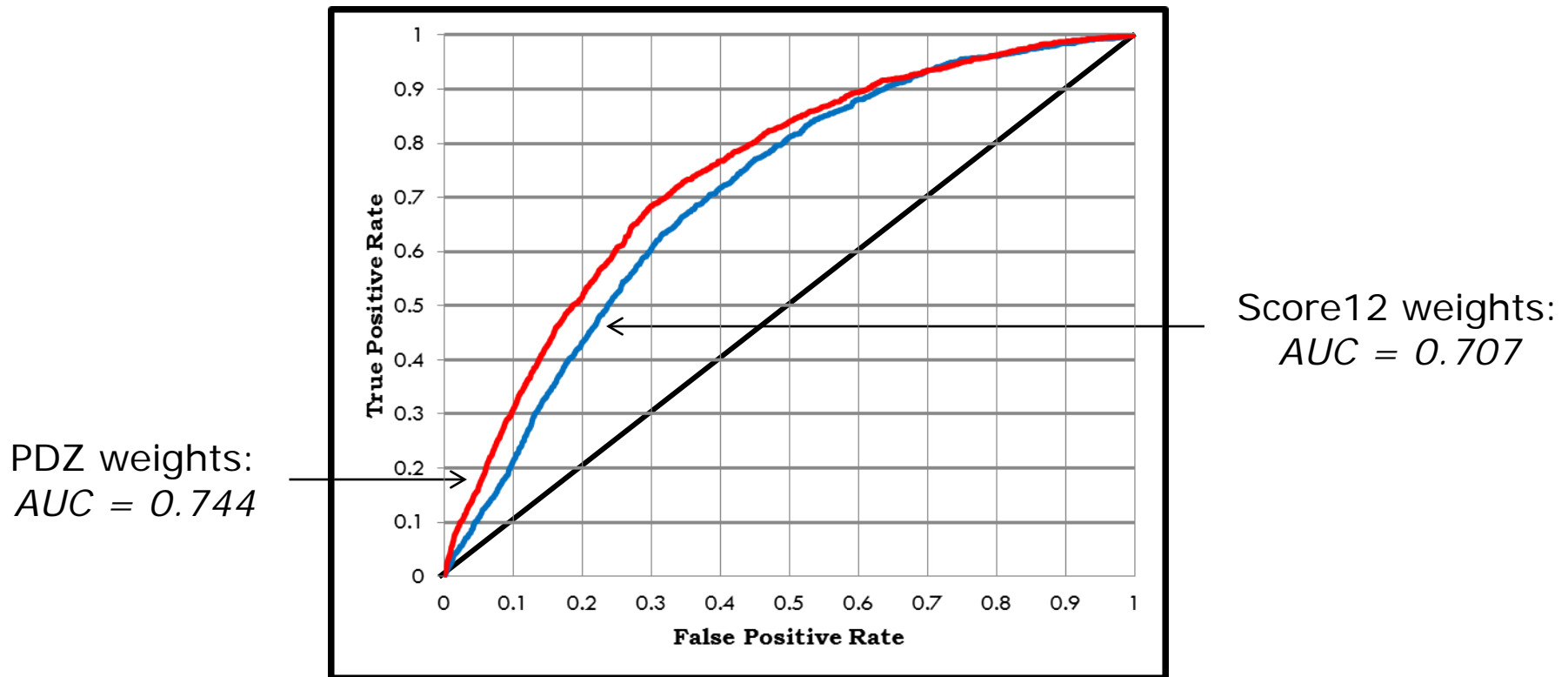
- Partitioned set of 92 domains into 10 subsets
- $\Delta\Delta G$  function weights are optimized based on 9 of 10 subsets in a round-robin setup
- Weights are averaged over all 10 steps





## Results

Interaction prediction is 24% better than random



# Optimized $\Delta\Delta G$ weights are stable

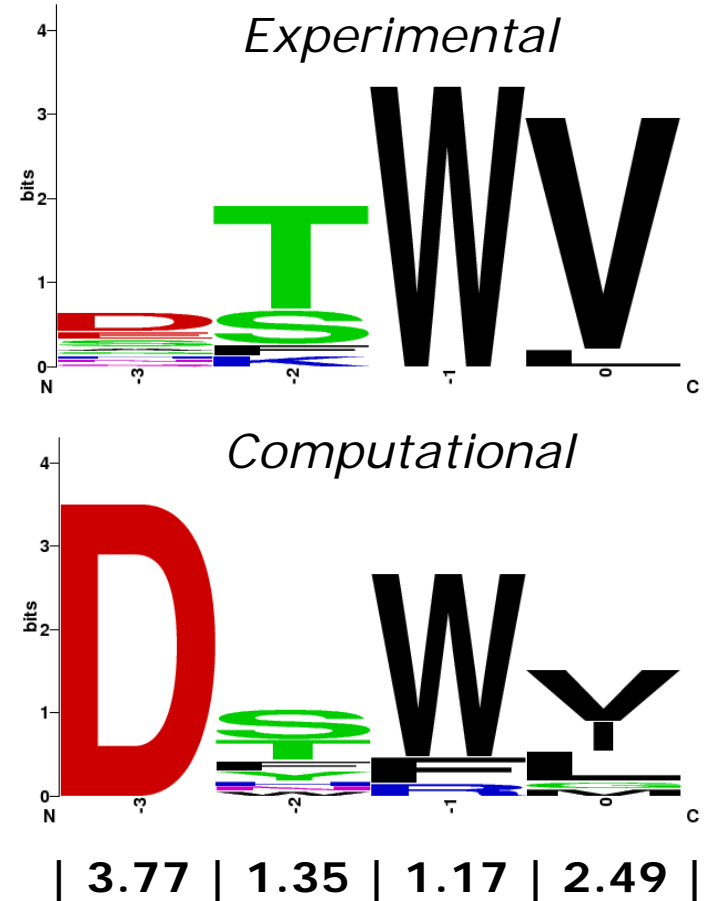
Scoring term	PDZ weight	Score12 weight
Lennard-Jones:		
attraction	0.228 $\pm$ 0.006	0.684
repulsion	0.125 $\pm$ 0.004	0.376
Solvation	0.294 $\pm$ 0.011	0.556
Hydrogen bonding:		
backbone-backbone	0.559 $\pm$ 0.034	1.000
backbone-side chain	0.258 $\pm$ 0.038	1.000
side chain-side chain	1.000 $\pm$ 0.031	0.940

\*All weights are normalized

# Comparing binding profiles

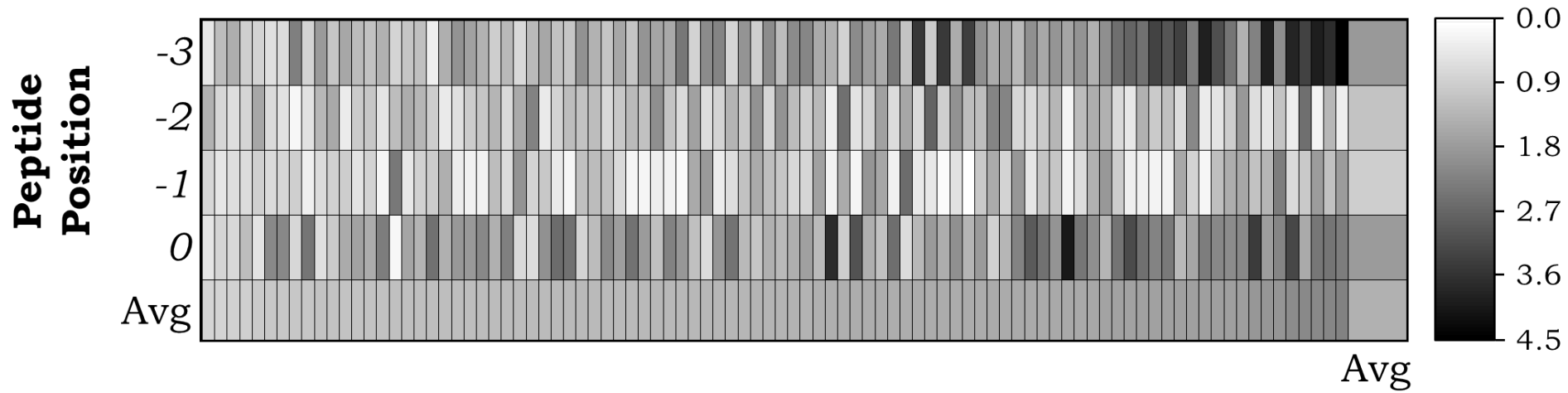
At peptide position  $k$ , given the number of bits of information  $b_k$  and a vector of amino acid frequencies  $v_k$ , the distance between an experimental and a computational profile is

$$D_k := \left\| b_k^{exp} v_k^{exp} - b_k^{comp} v_k^{comp} \right\|_2.$$



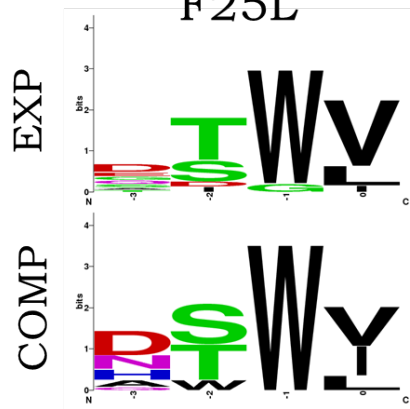
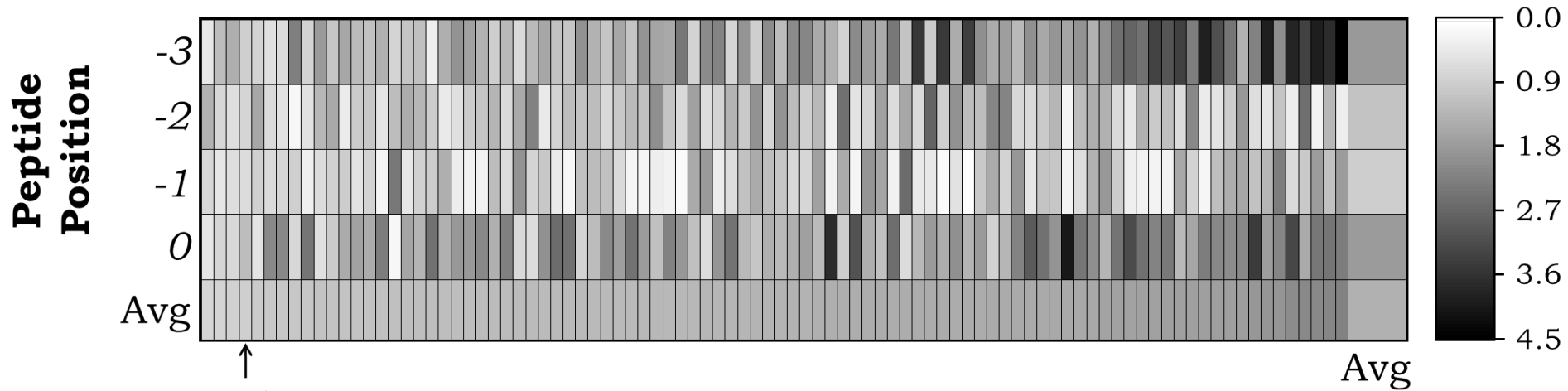
## Results

-1 & -2 positions are most accurately predicted



# Results

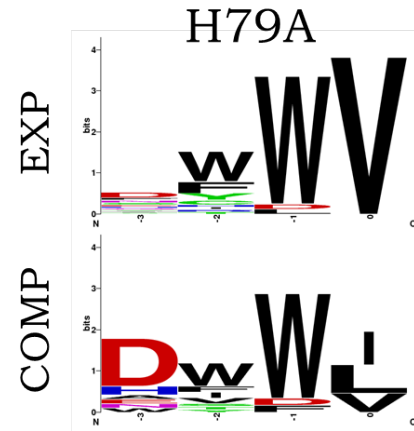
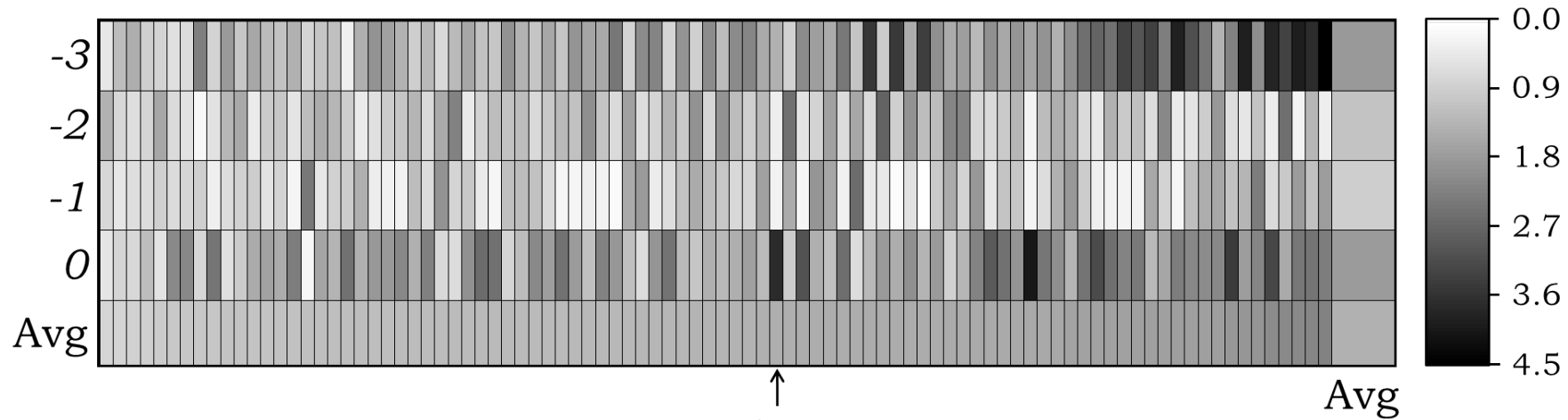
## Best case scenario



# Results

## Hydrophobes at 0 are often incorrectly predicted

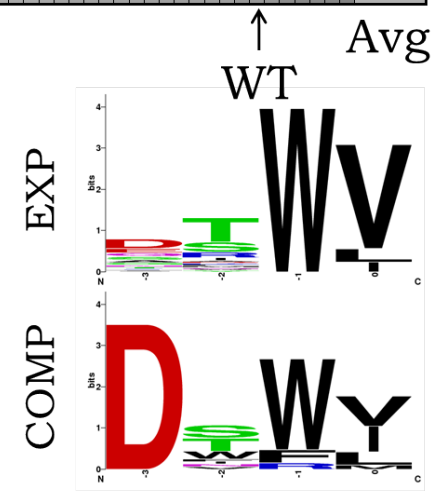
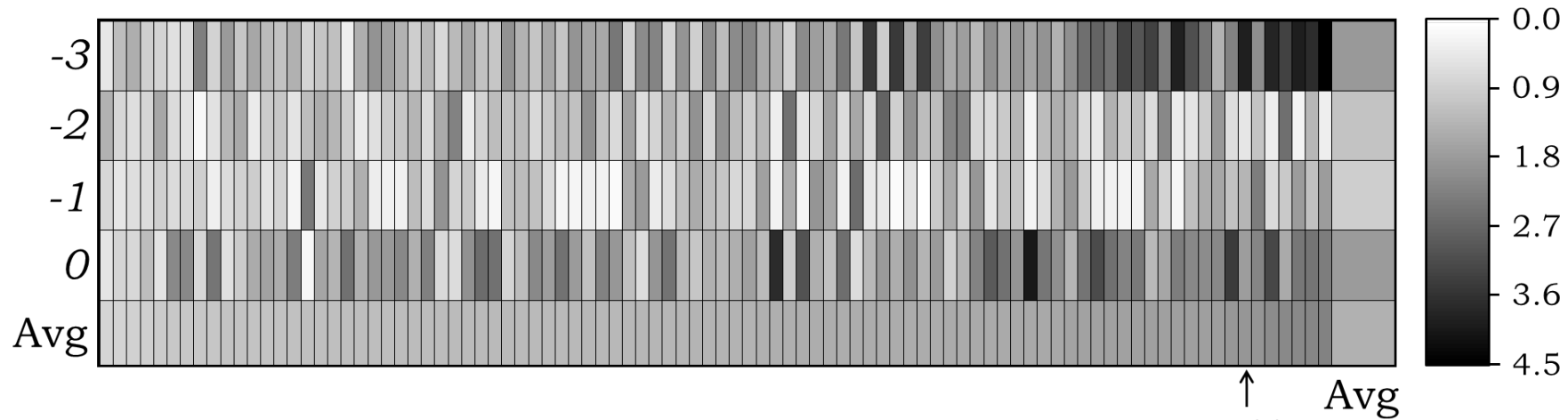
Peptide  
Position



Results

For WT, promiscuity at -3 unclear

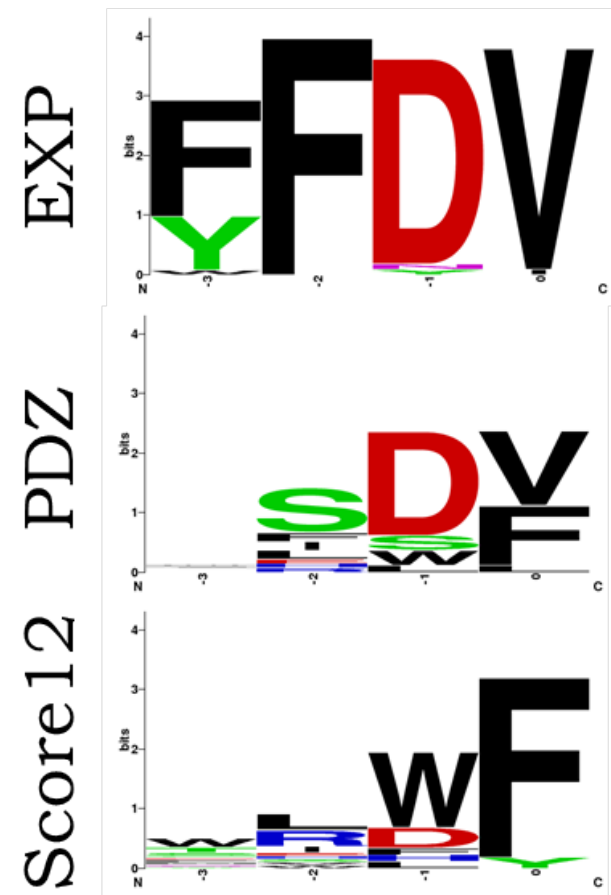
Peptide  
Position



## Results

# Independent test on a homologous domain

- Tonikian et al. (2008) phage display experiment on 54 wild type human PDZ domains
- Computational test case: CASK-1 PDZ
- Performed the interaction prediction protocol for 760 CASK PDZ protein/peptide complexes



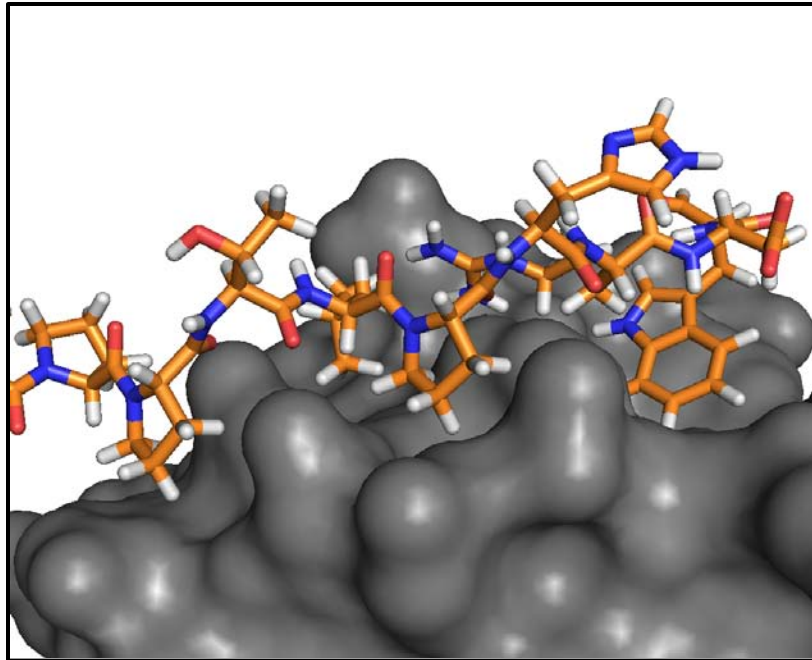


## Expand & fine-tune the PDZ protocol

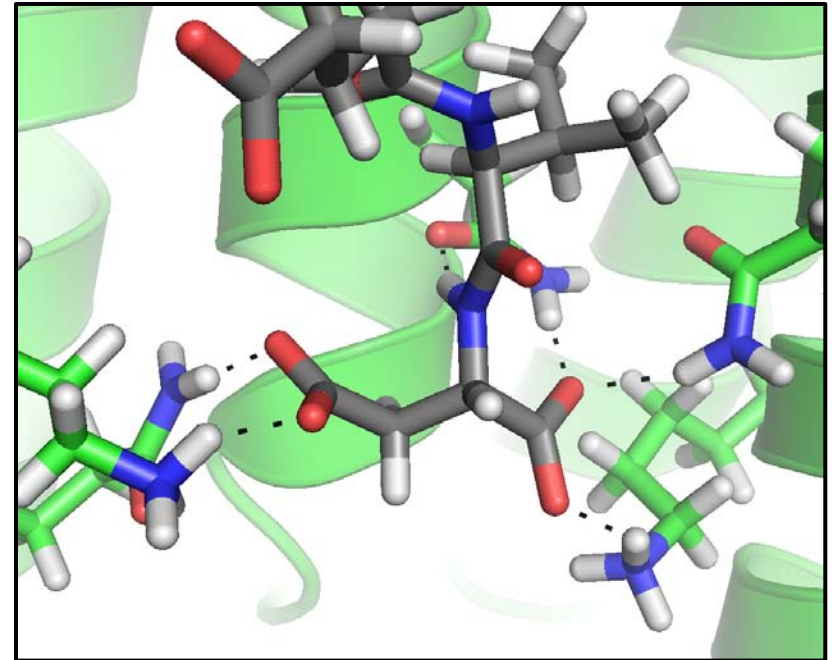
- Will repeat all experiments for 5, 6 and 7 amino acid peptide ligands
- Include peptide backbone flexibility while docking (FlexPepDock)
- Measure the impact of individual ROSETTA refinement steps (docking, repacking, minimization)
- Find the correlation between experimental and computational  $\Delta\Delta G$  values

*Future directions*

## Other systems with canonical binding modes

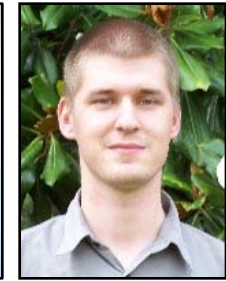
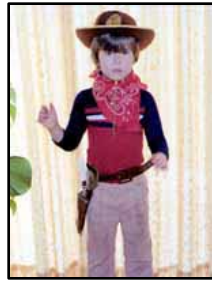


SH3-domain/PP1I-helix



TPR-domain/peptide

# Acknowledgements



Arnold and Mabel  
**BECKMAN**

F O U N D A T I O N