

## Evaluation Overview of Grand Challenges

Pat Walters

# Safe Harbor Statement

- I've spent a lot of time working with the D3R submissions
- I'll let you know I've learned so far
- I still have a lot to do with/learn from this data

Spearman

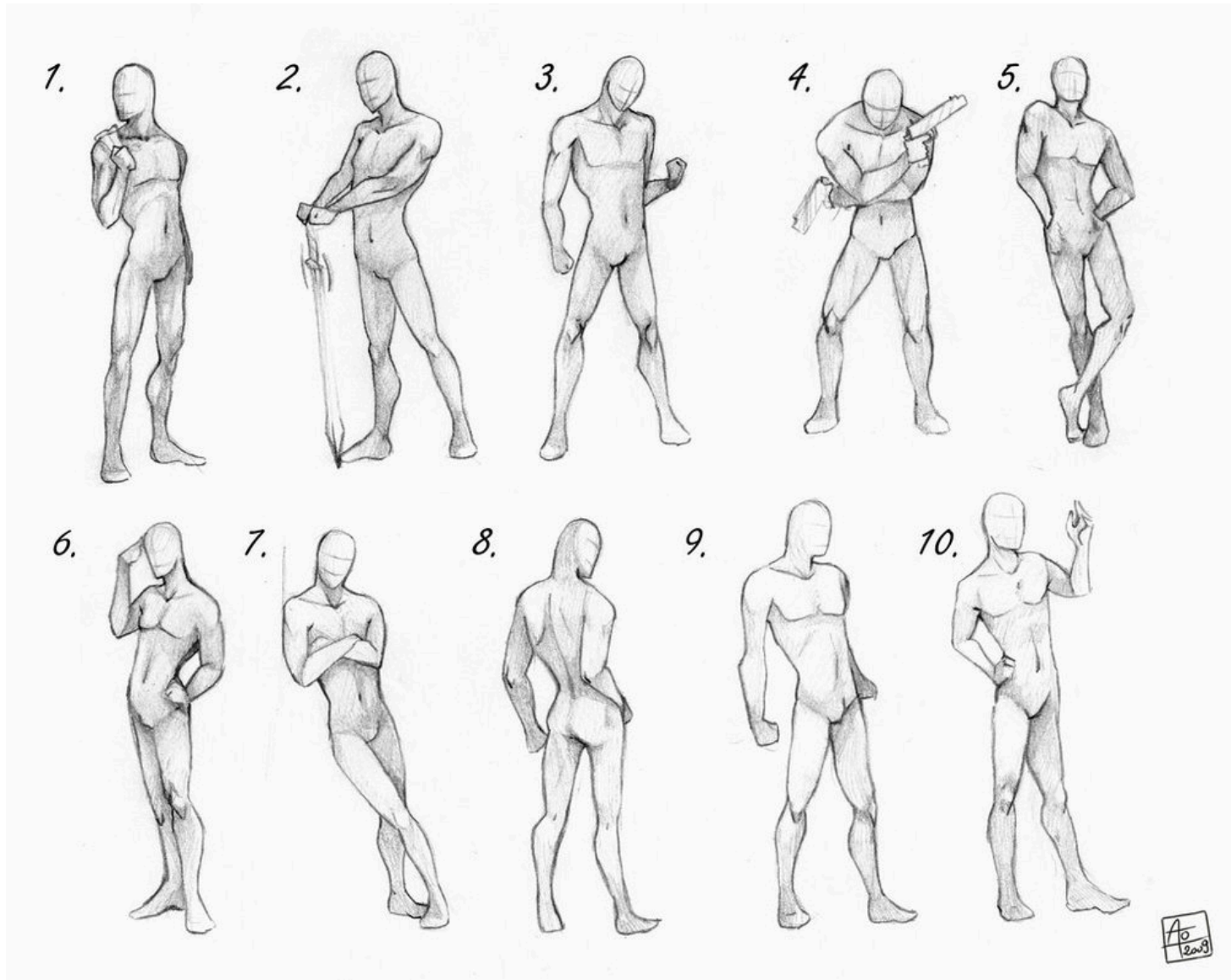
	A	B	C	D	E	F	G	H	I	J
1	challenge	directory	submitter	type	file_name	num_scored	num_matches	pearson	kendall	
2	map4k4-stage2-29	56afd328093	56afd328093	Score	LigandScores	18	18	0.55446574	0.38032991	
3	map4k4-stage2-29	56af837a90e	56af837a90e	Score	LigandScores	30	20	0.45112782	0.33684211	
4	map4k4-stage2-29	56b13f9f863	56b13f9f863	Score	LigandScores	18	18	0.42414861	0.33333333	
5	map4k4-stage2-29	56a9fdfe645	56a9fdfe645	Score	LigandScores	18	18	0.40557276	0.32026144	
6	map4k4-stage2-29	56aa7b452b	56aa7b452b	Score	LigandScores	18	18	0.3993808	0.28104575	
7	map4k4-stage2-29	56b13f9f863	56b13f9f863	Score	LigandScores	18	18	0.39318885	0.28104575	
8	map4k4-stage2-29	56b1499e7d	56b1499e7d	Score	LigandScores	18	18	0.39318885	0.28104575	
9	map4k4-stage2-29	56a9fdfe645	56a9fdfe645	Score	LigandScores	18	18	0.3869969	0.30718954	
10	map4k4-stage2-29	56a9fdfe645	56a9fdfe645	Score	LigandScores	18	18	0.37874097	0.28104575	
11	map4k4-stage2-29	56aa7b452b	56aa7b452b	Score	LigandScores	18	18	0.35603715	0.25490196	
12	map4k4-stage2-29	56b133c241	56b133c241	Score	LigandScores	18	18	0.35190918	0.24183007	
13	map4k4-stage2-29	56af936e211	56af936e211	Score	LigandScores	18	18	0.34571723	0.26797386	
14	map4k4-stage2-29	56b133c241	56b133c241	Score	LigandScores	18	18	0.34571723	0.22875817	
15	map4k4-stage2-29	56b133c241	56b133c241	Score	LigandScores	18	18	0.34571723	0.22875817	



# Outline

- Pose Prediction
  - HSP90
  - MAP4K4
- Ranking
  - HSP90
  - MAP4K4
- Free Energy
  - HSP90
  - MAP4K
- Closing thoughts

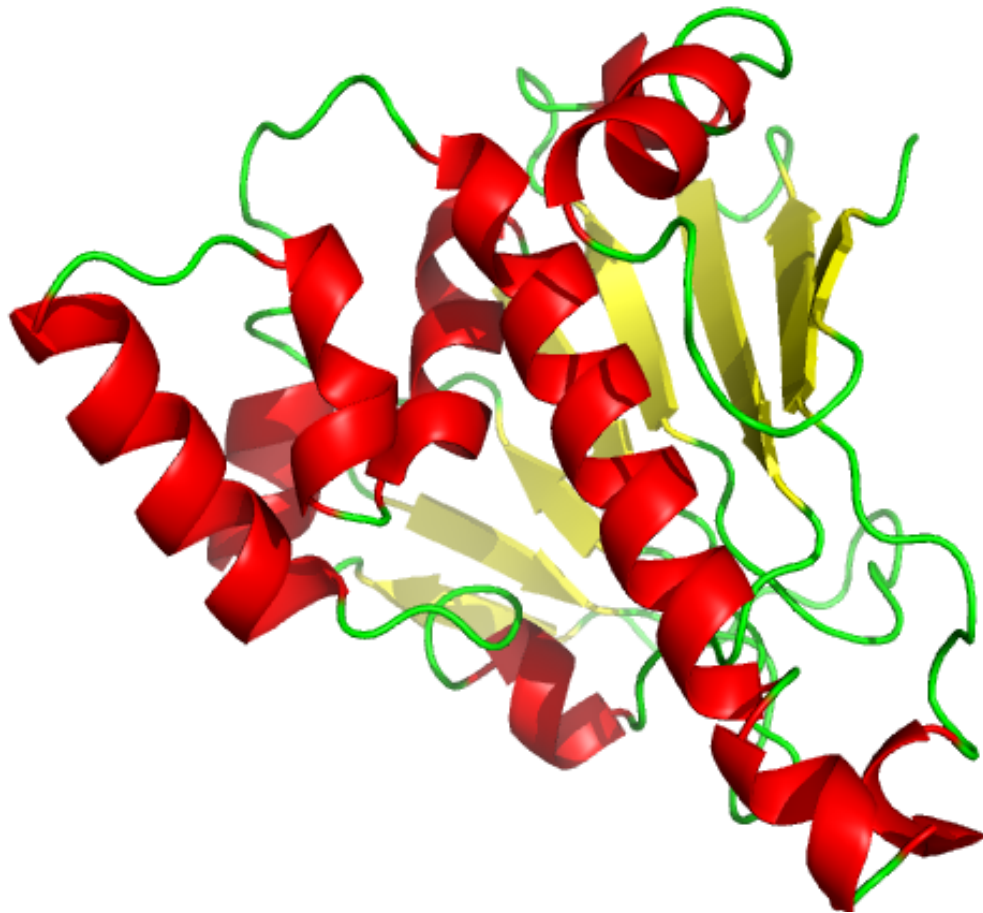
# Pose Prediction



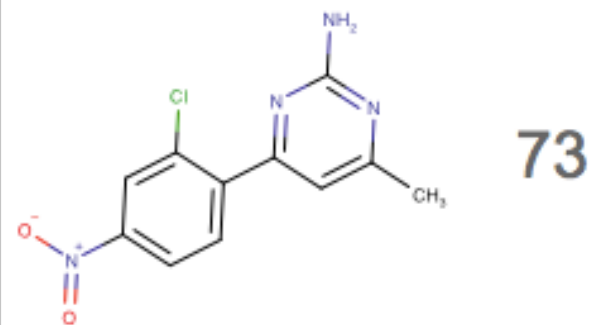
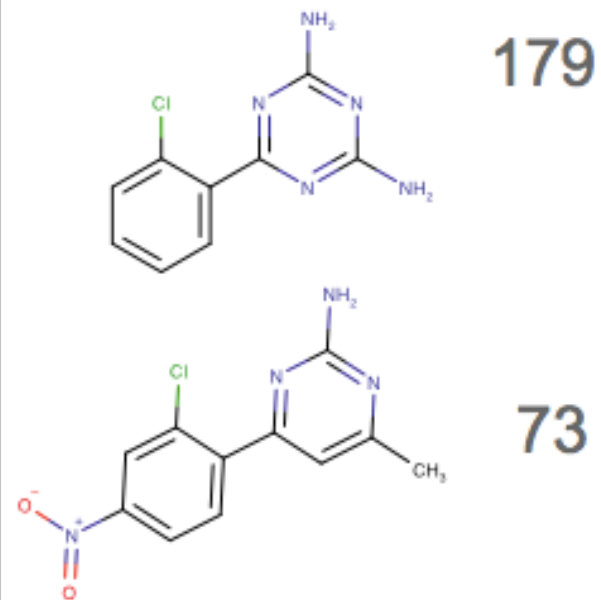
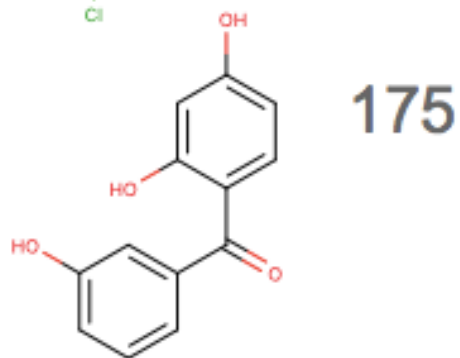
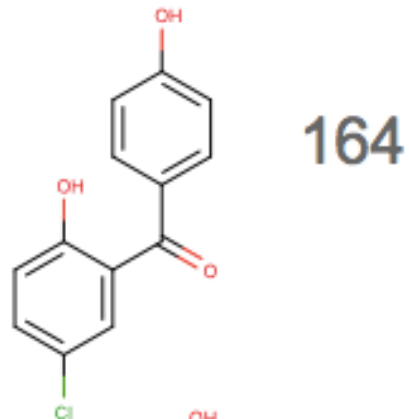
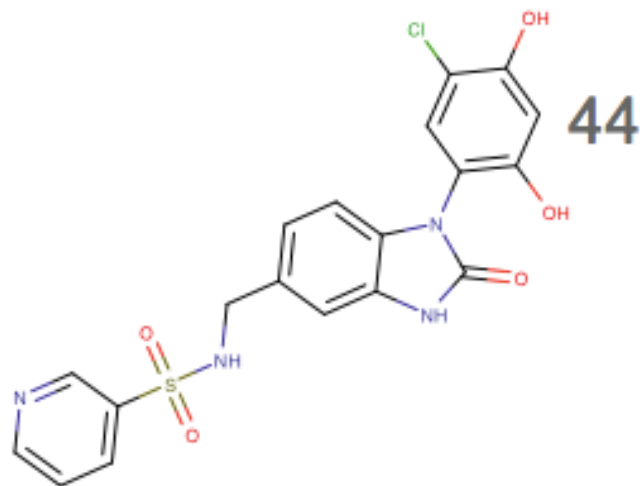
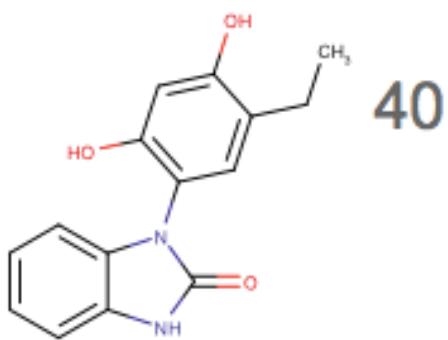


# HSP90

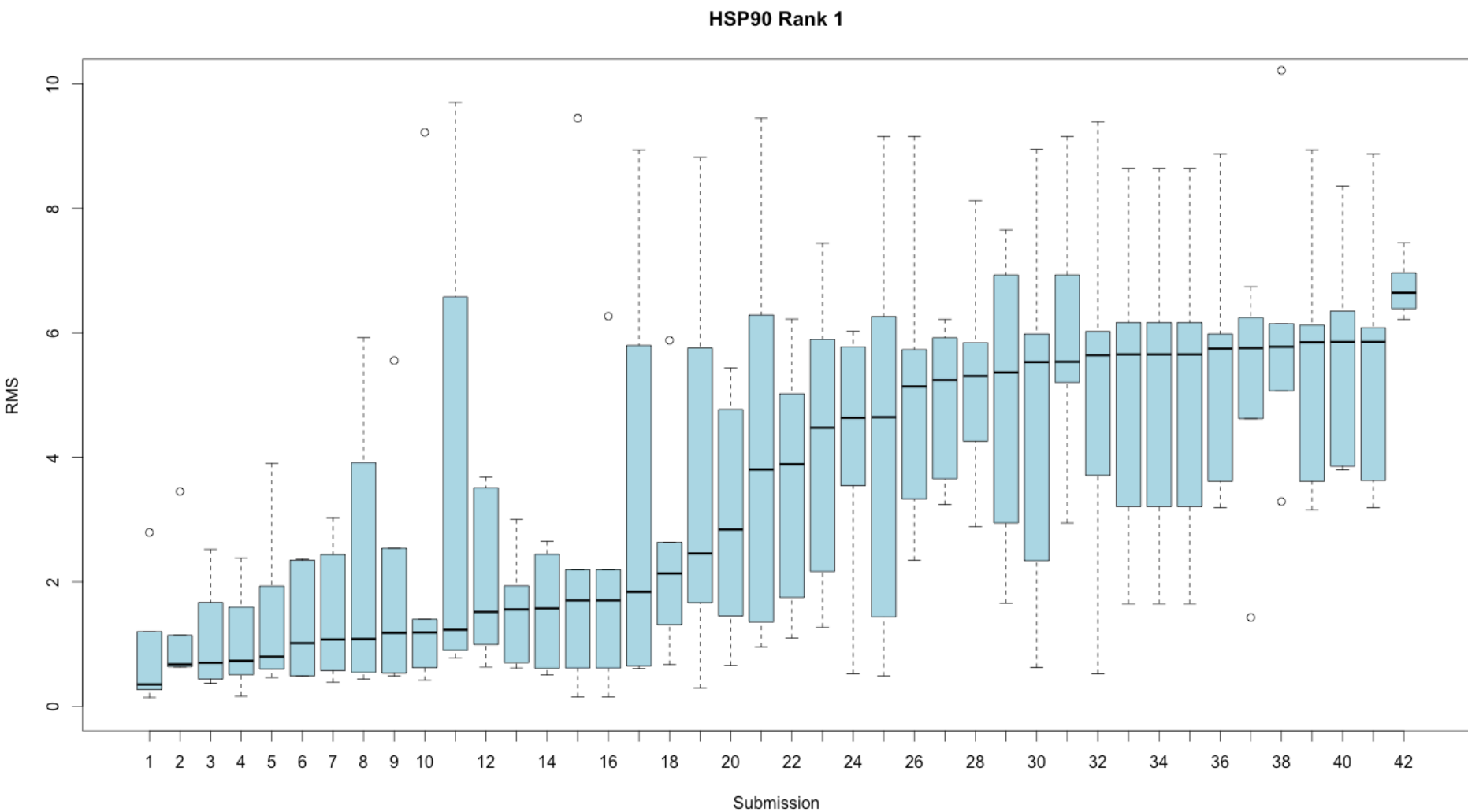
- 6 Ligands to dock



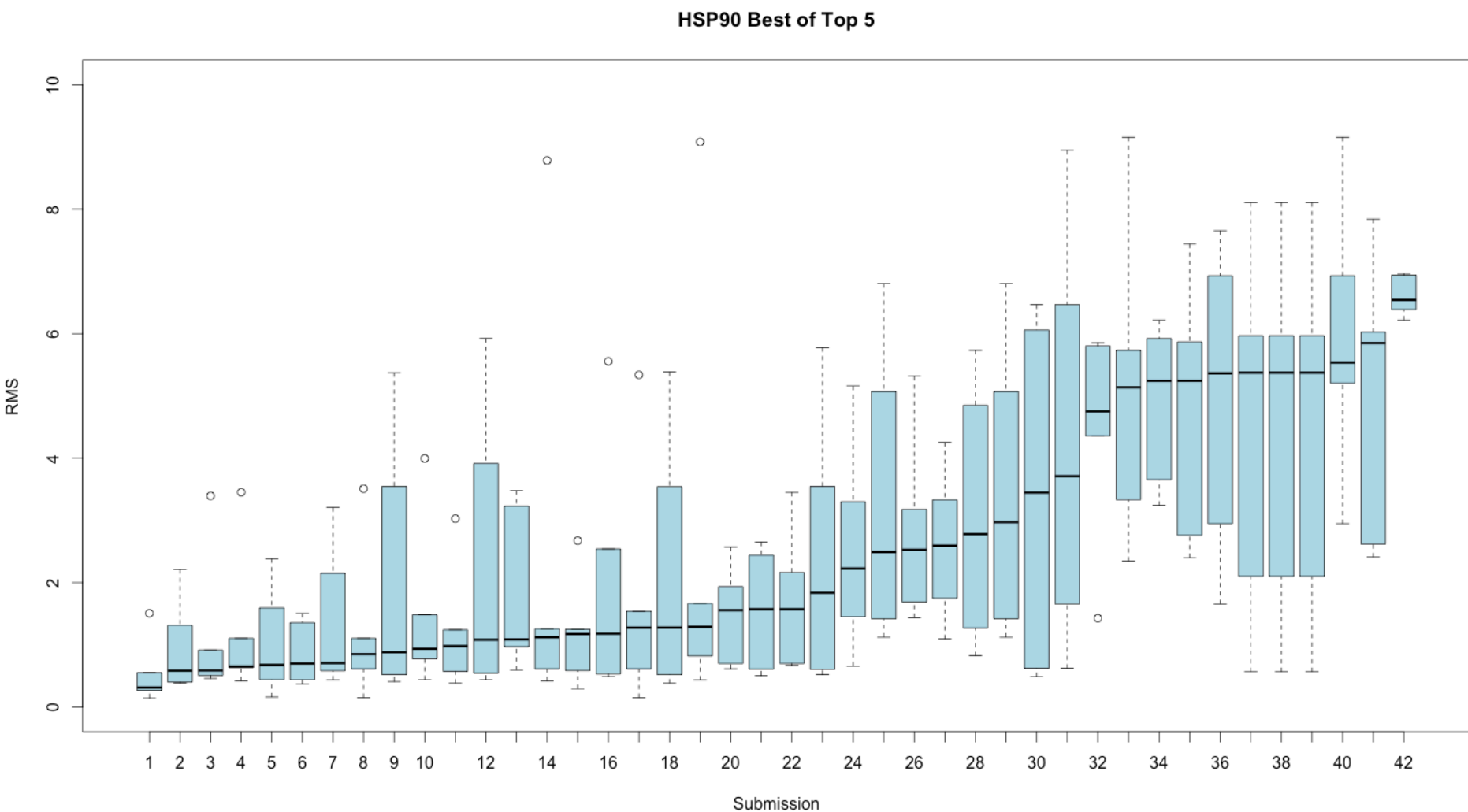
# 3 Pairs of HSP90 Ligands



# RMS for Top Ranking HSP90 Dockings



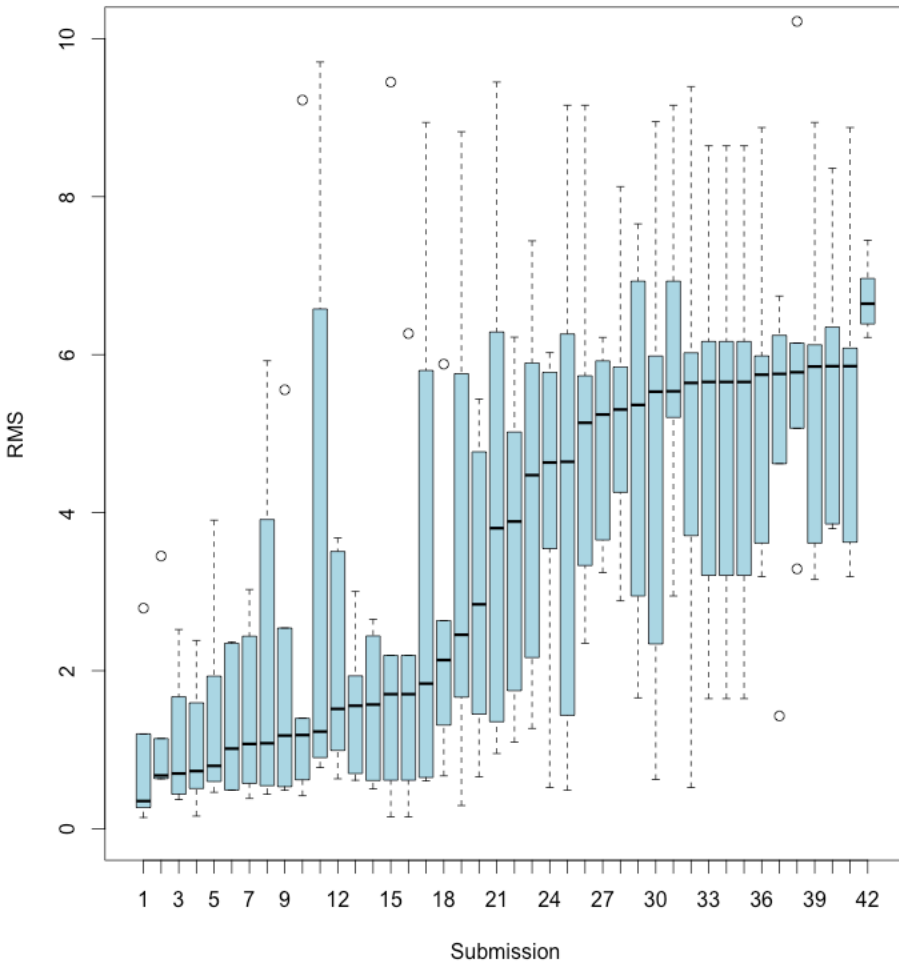
# RMS for Best Fit of Top 5 HSP90 Dockings



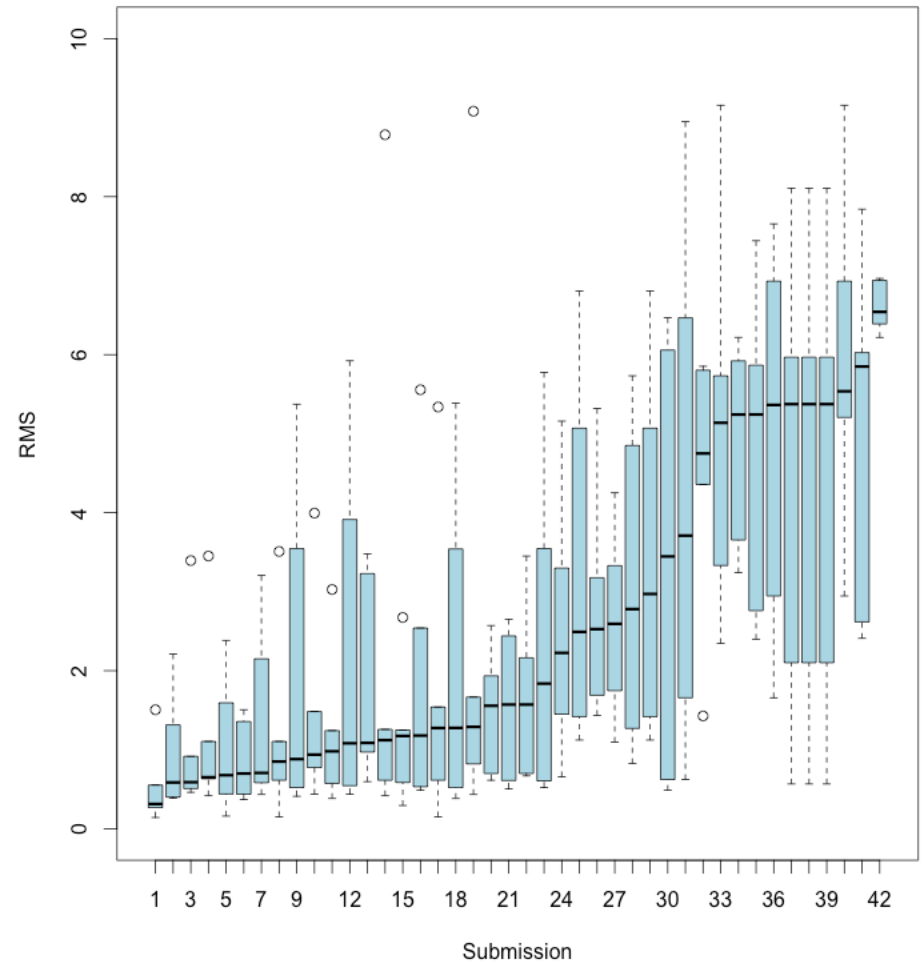


# Comparing Top and Best Ranks for HSP90

HSP90 Rank 1

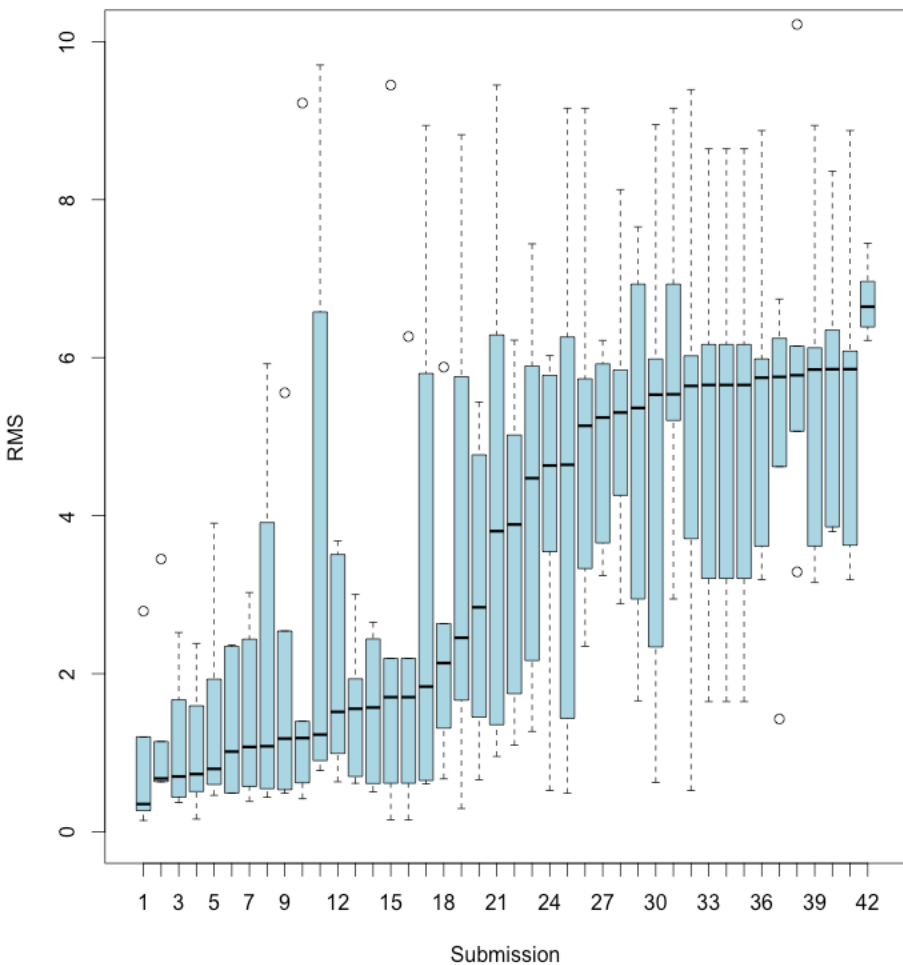


HSP90 Best of Top 5

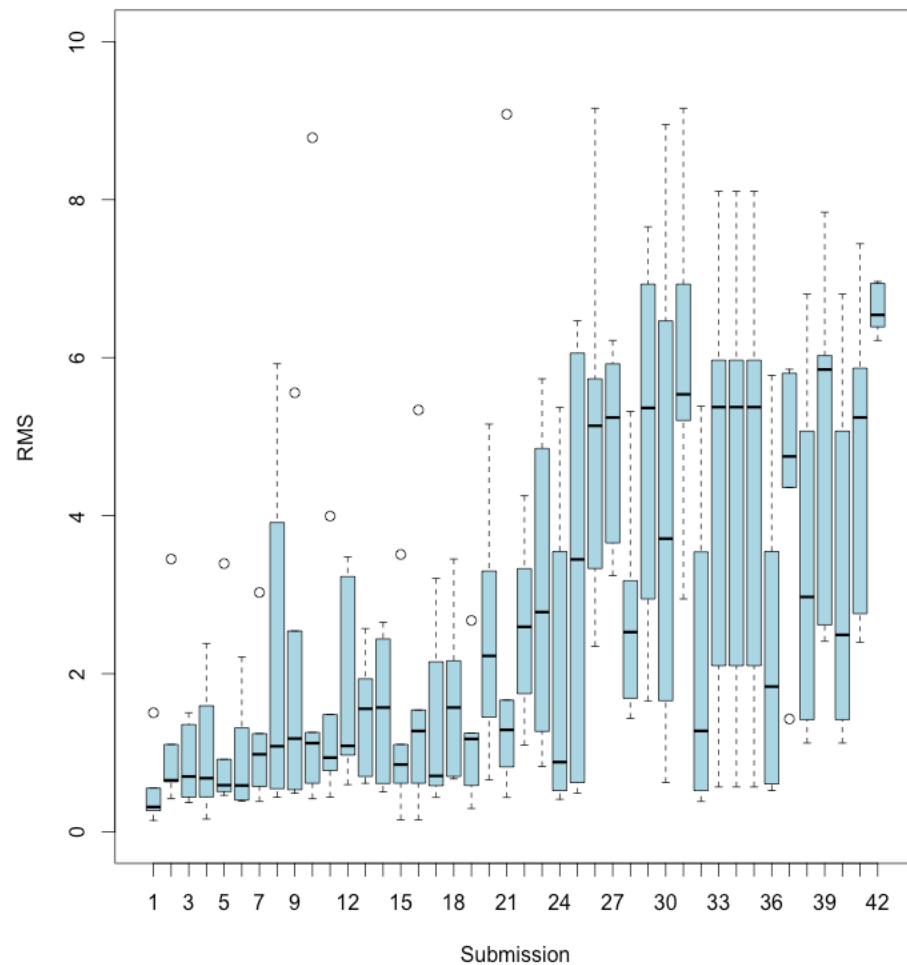


# Comparing Top and Best Ranks for HSP90 (Same Ordering)

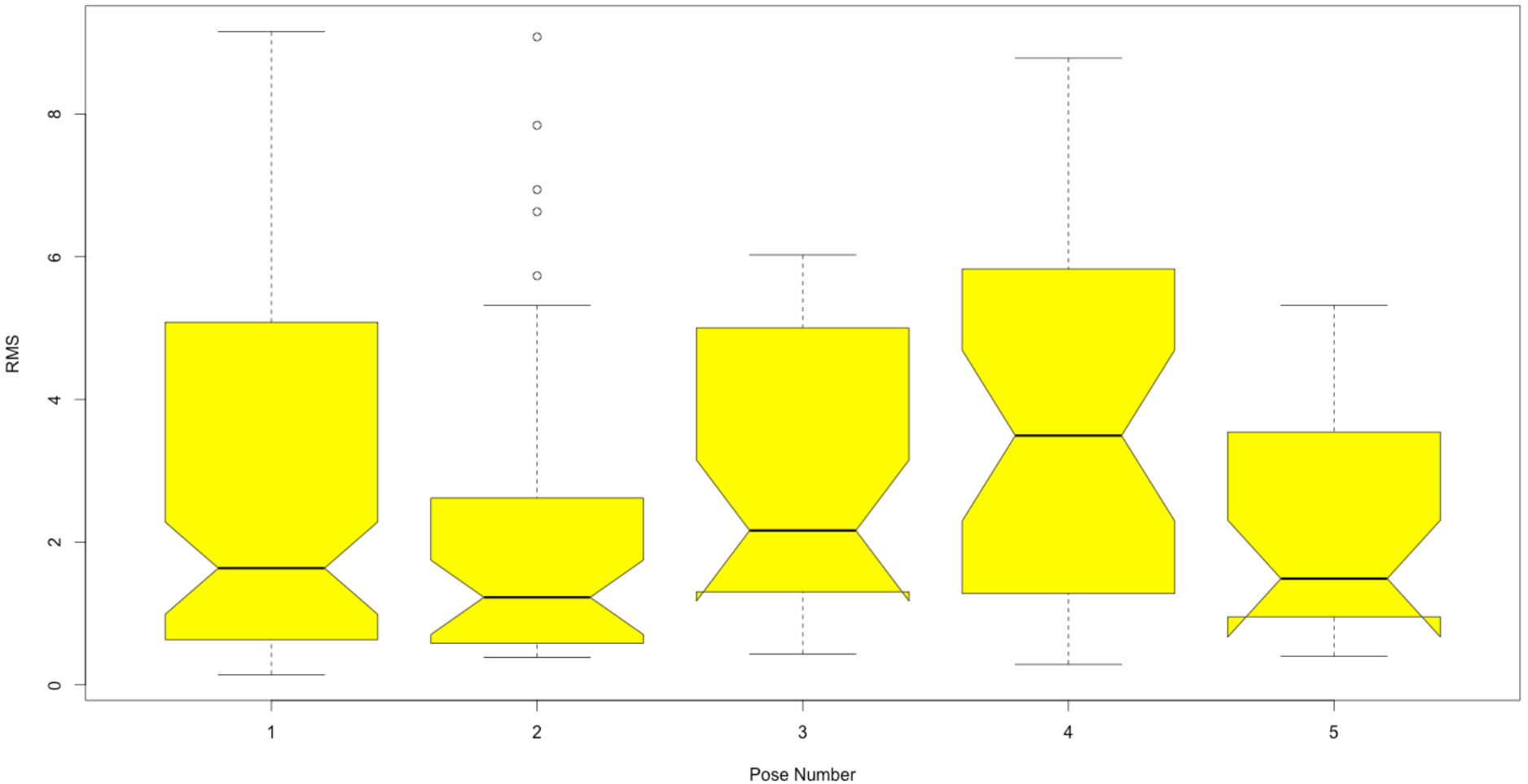
HSP90 Rank 1



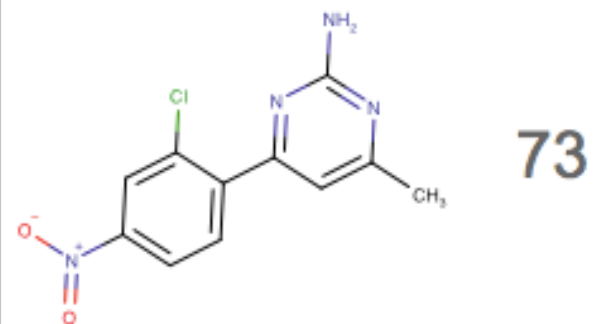
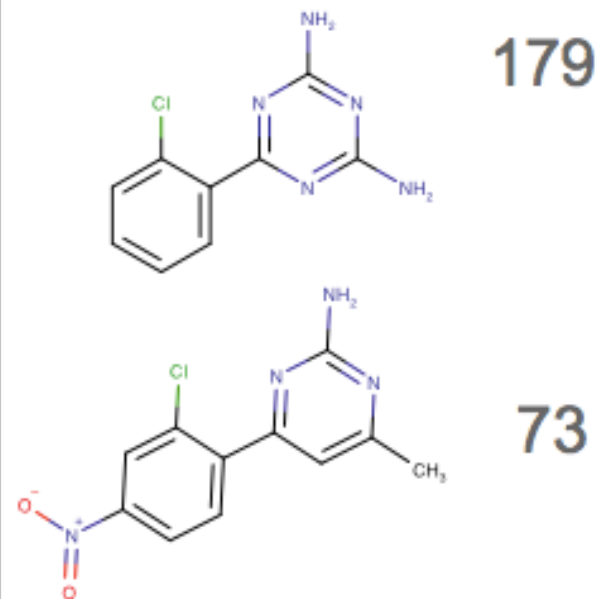
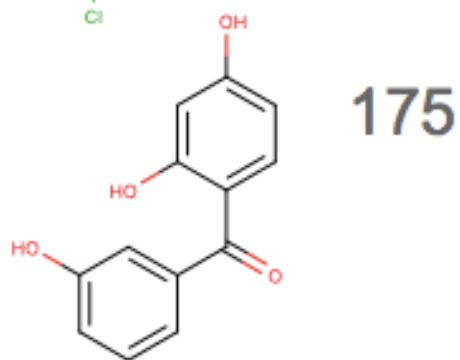
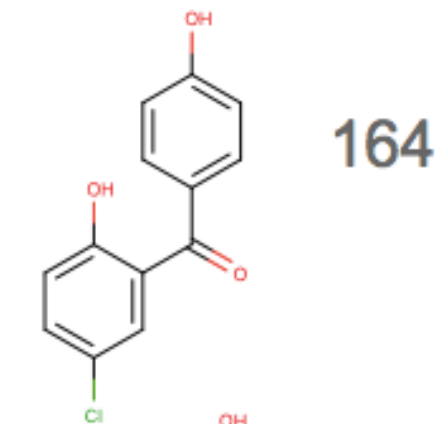
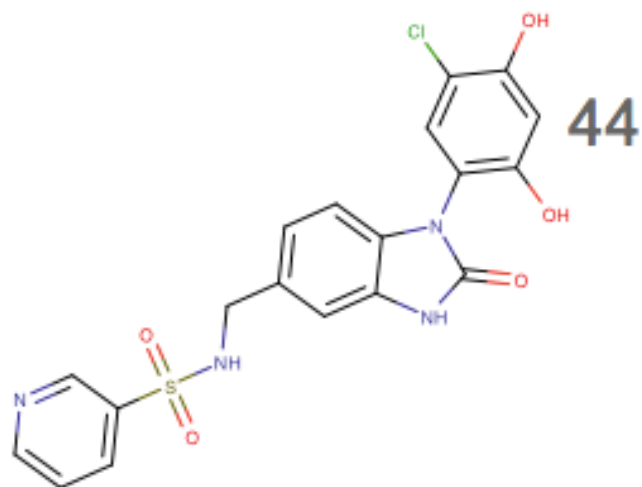
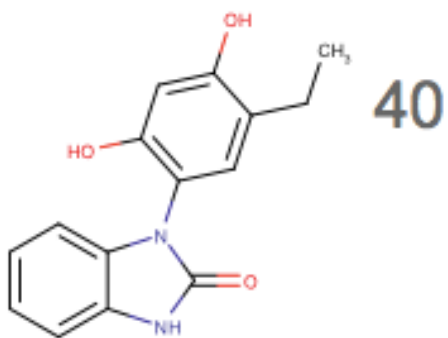
HSP90 Best of Top 5



# Minimal Differences in RMS for Top 5 Poses

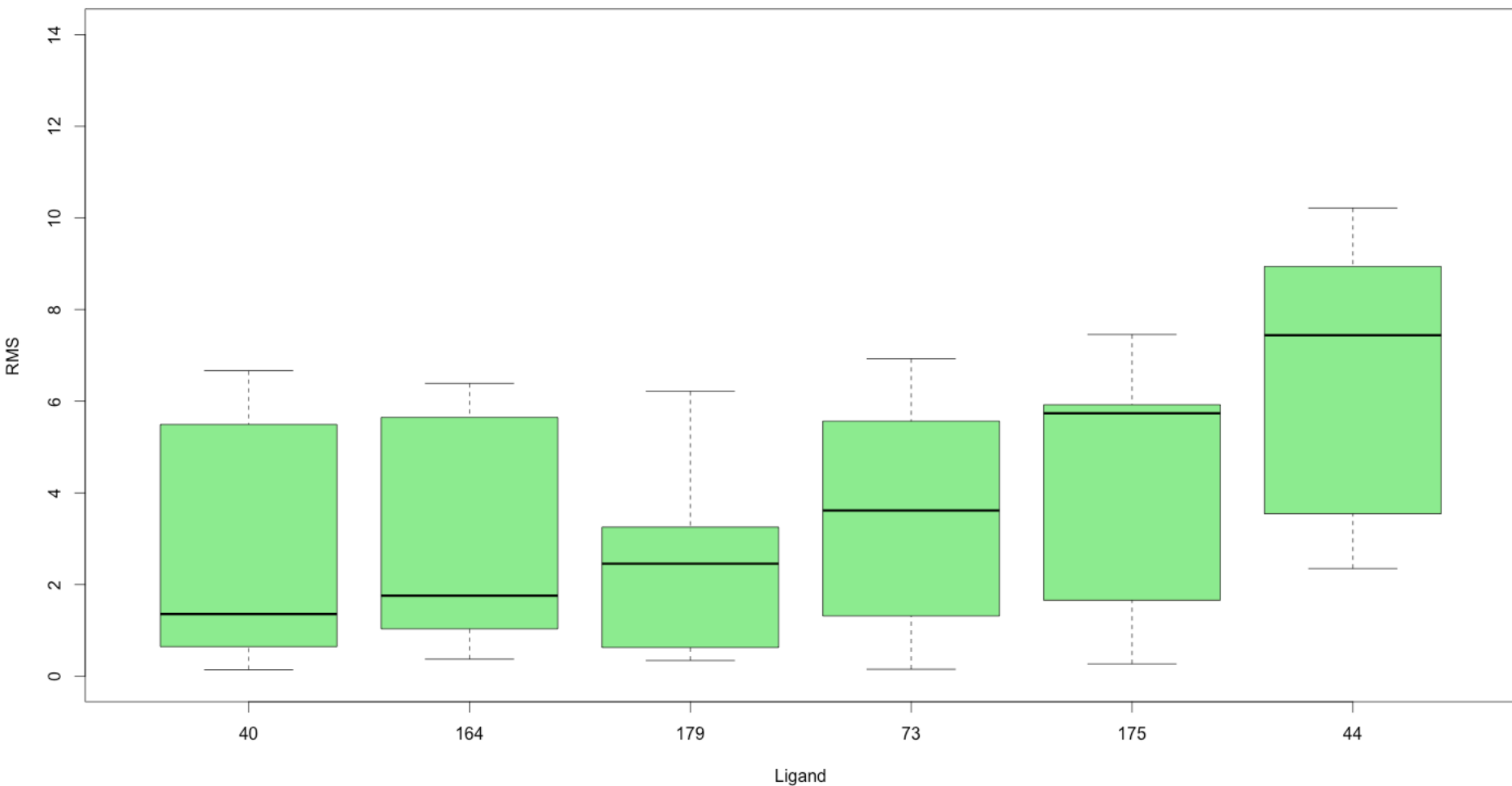


# 3 Pairs of HSP90 Ligands

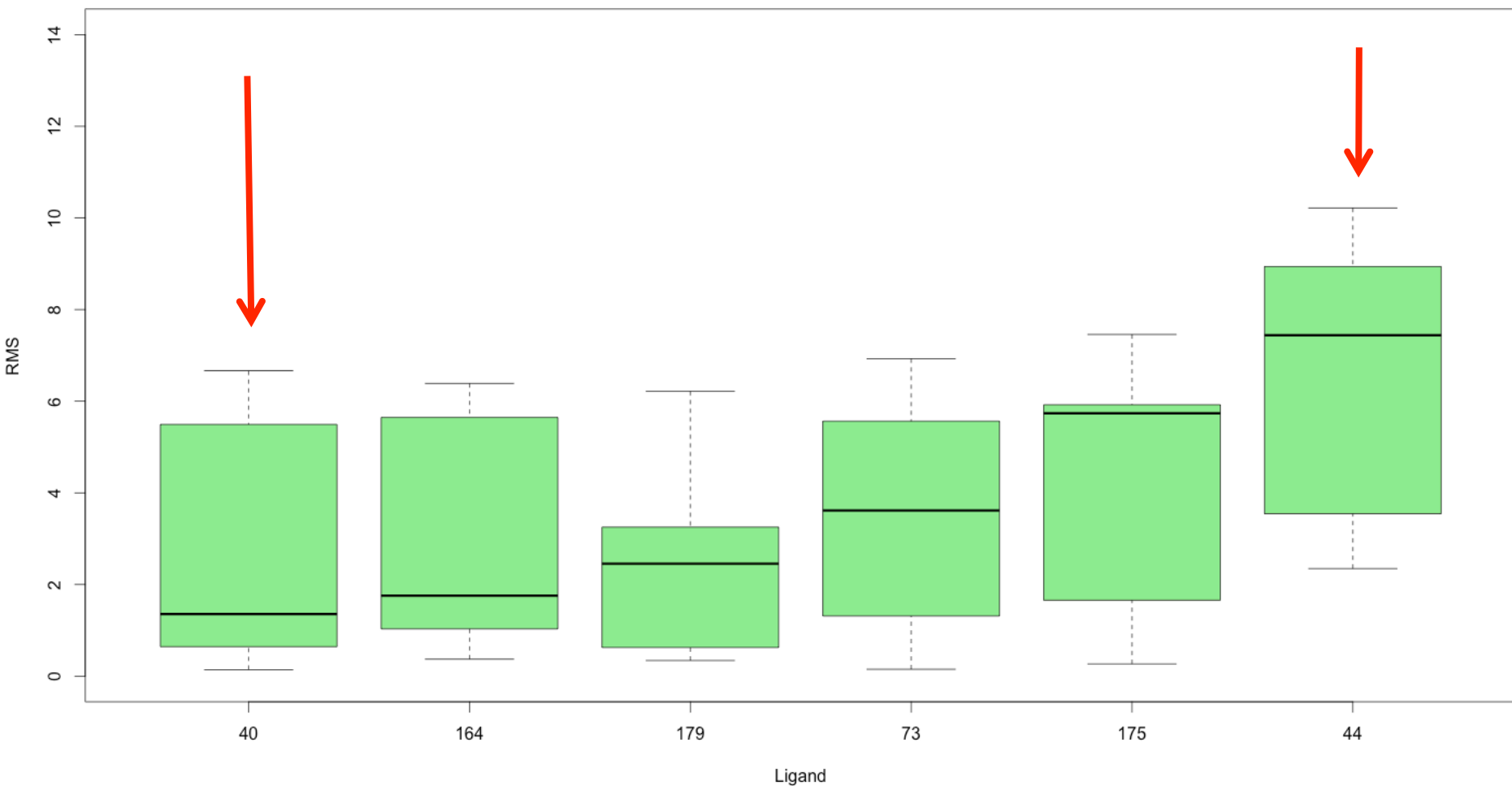




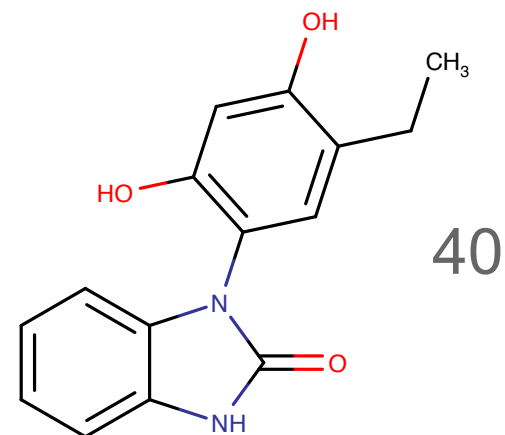
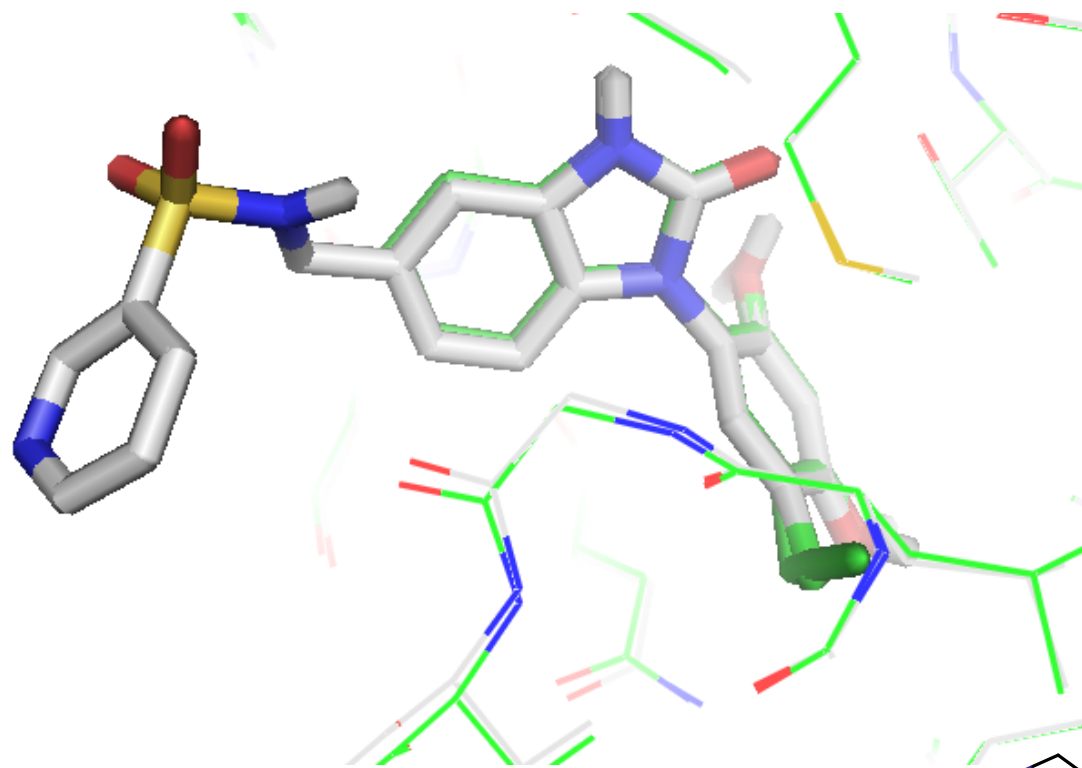
# Some Ligands Appear More Difficult to Dock



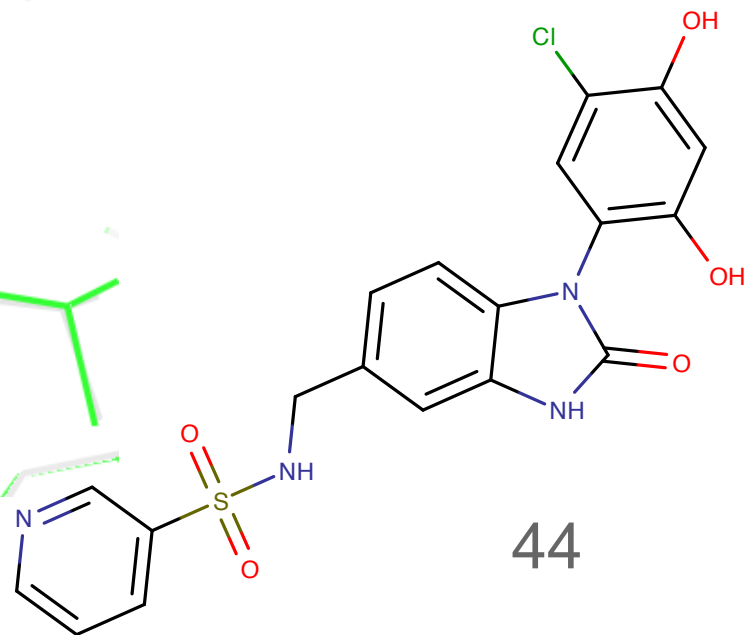
# Comparing Ligands 40 and 44



# Ligands 40 and 44 have similar poses

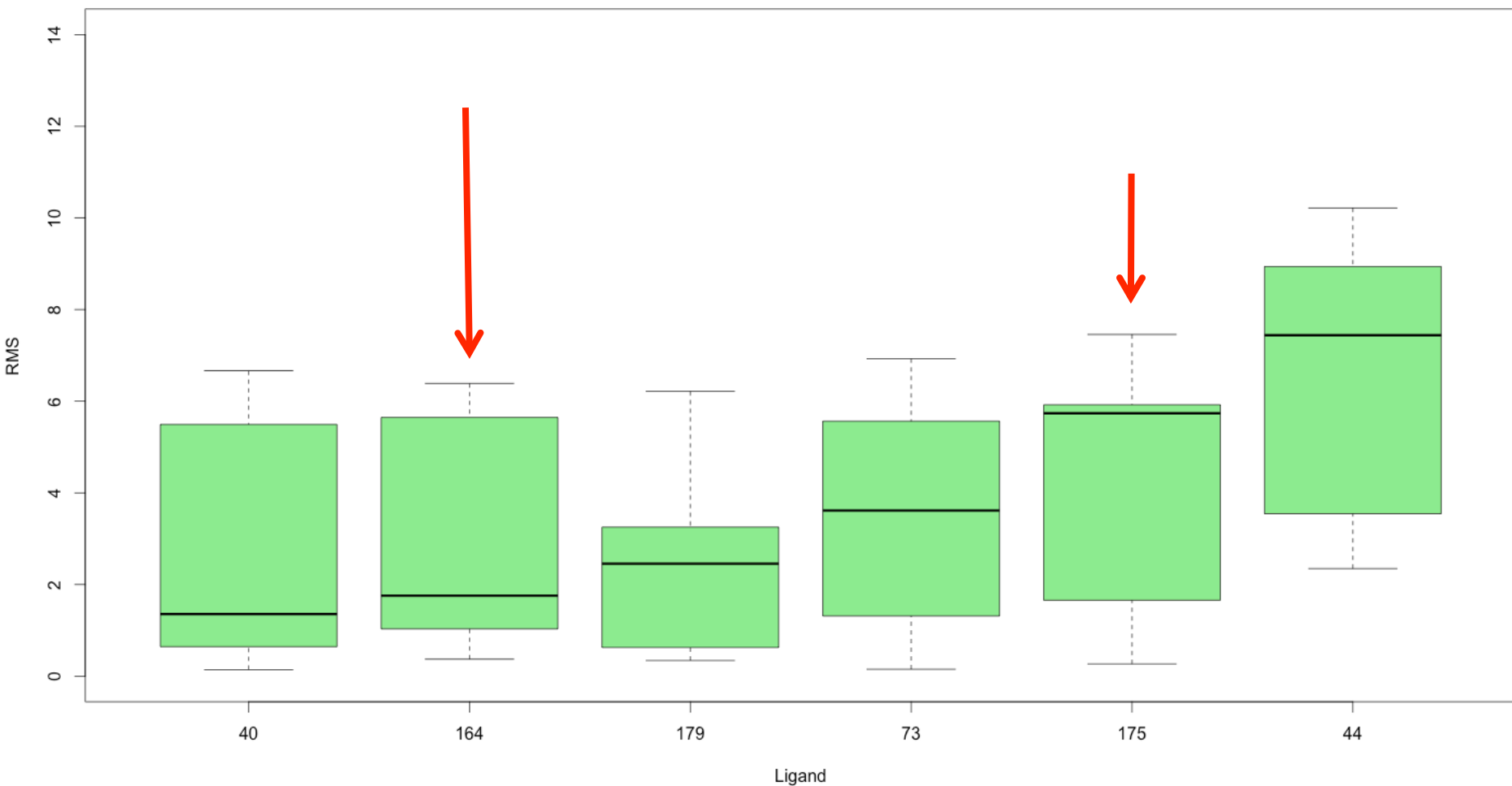


40



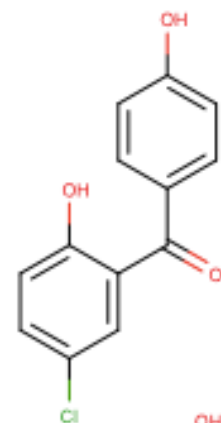
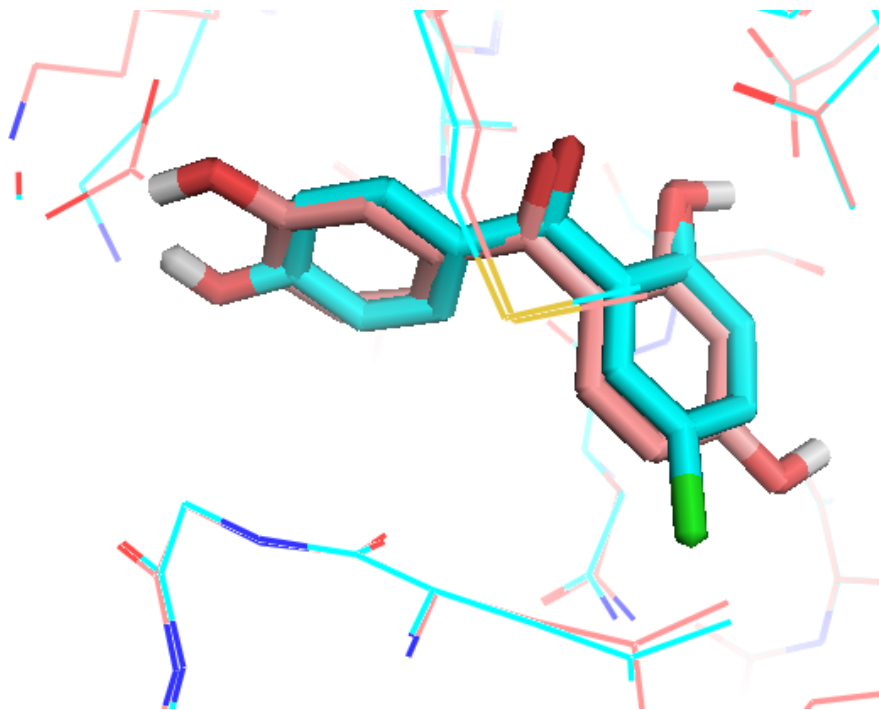
44

# Comparing Ligands 164 and 175

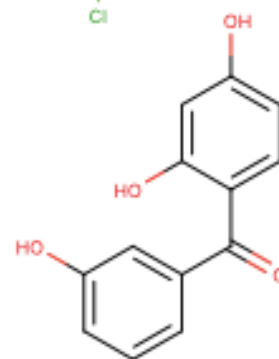




# Comparing 164 and 175

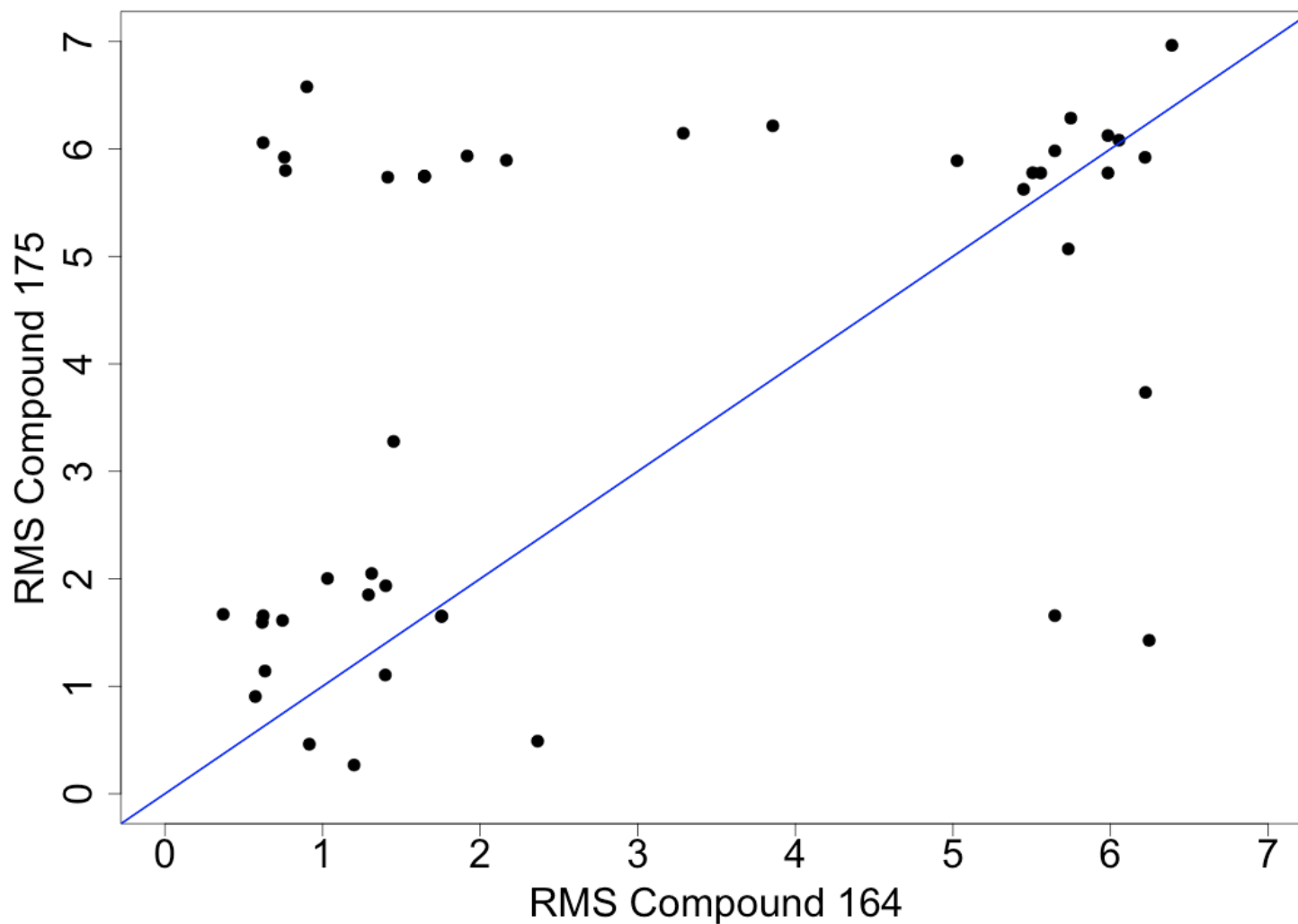


164

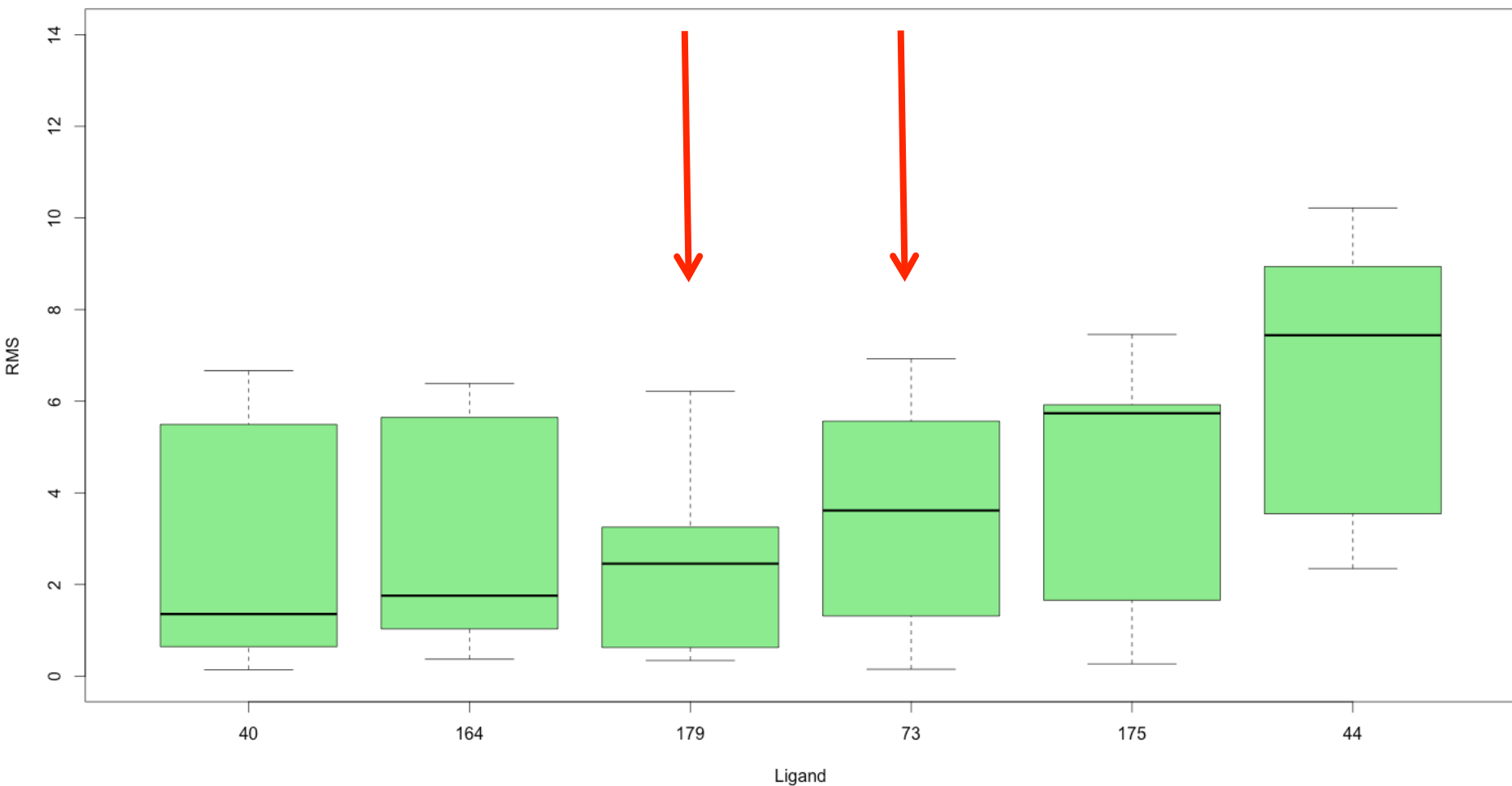


175

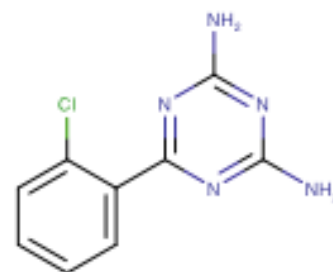
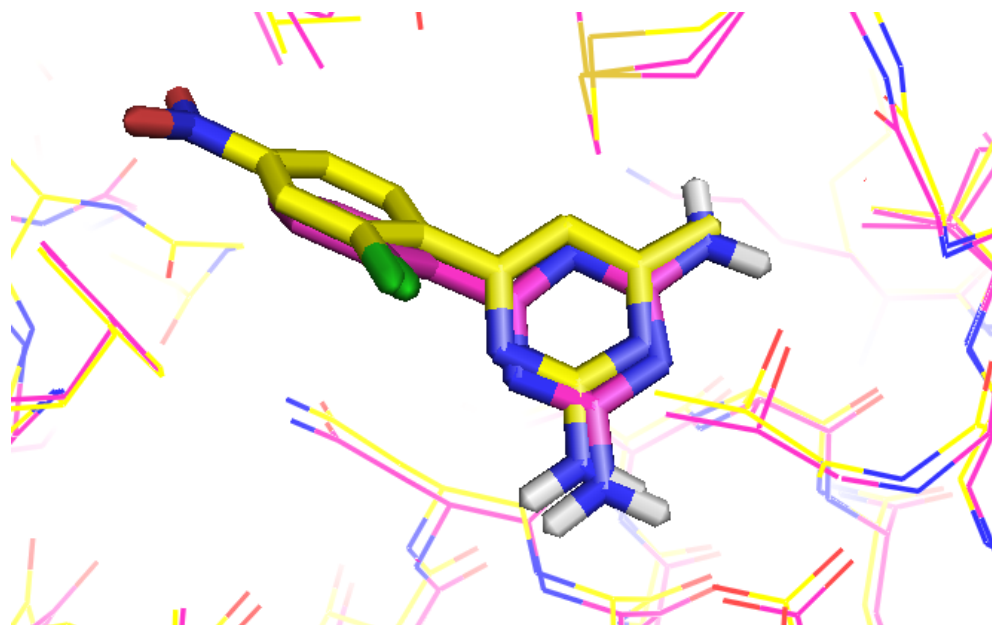
## Different Docking Accuracy for 164 and 175



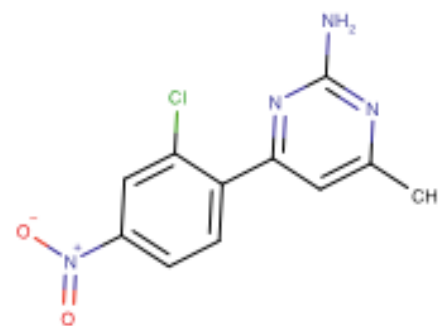
# Comparing Ligands 179 and 73



# Comparing Ligands 179 and 73



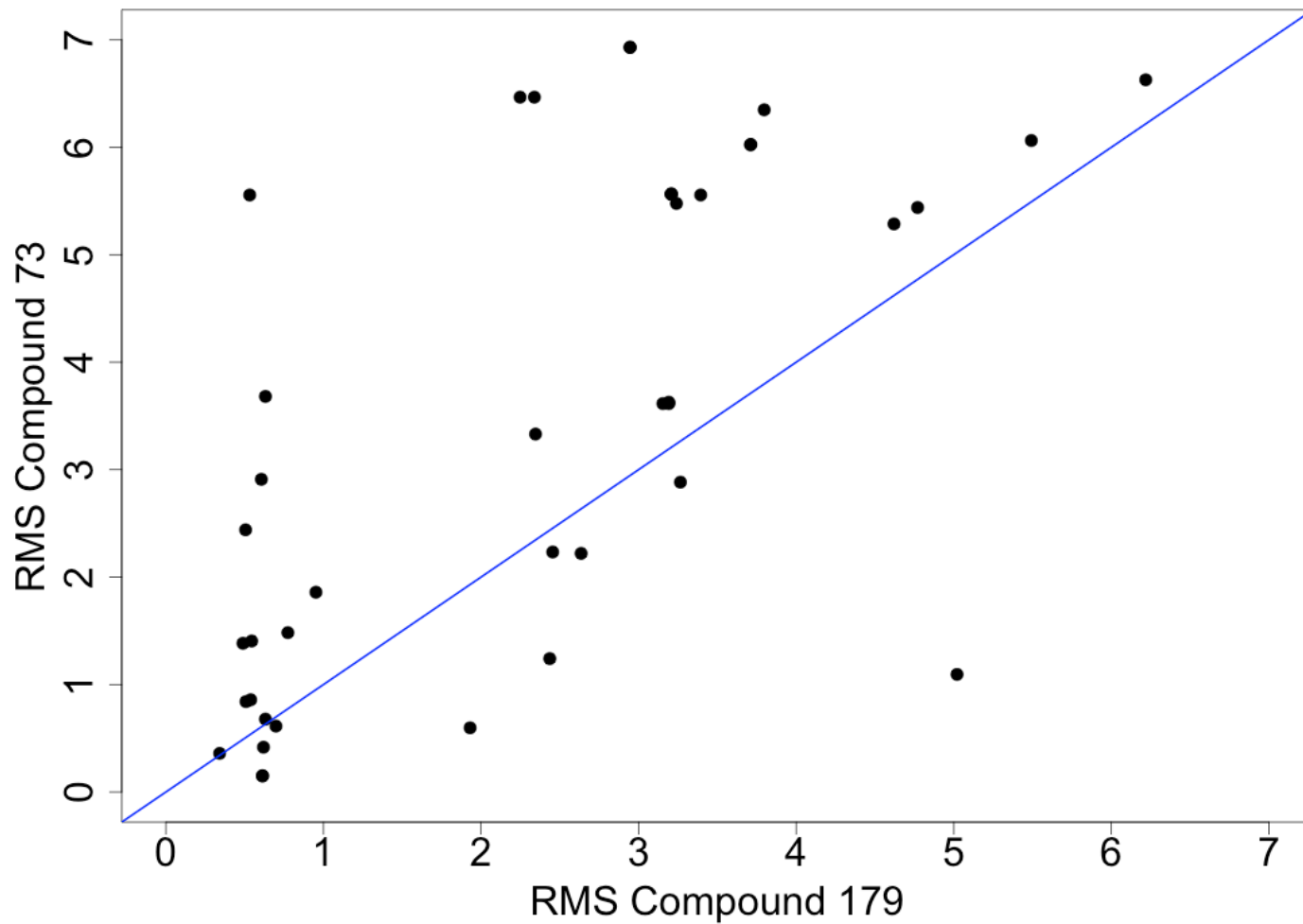
179



73

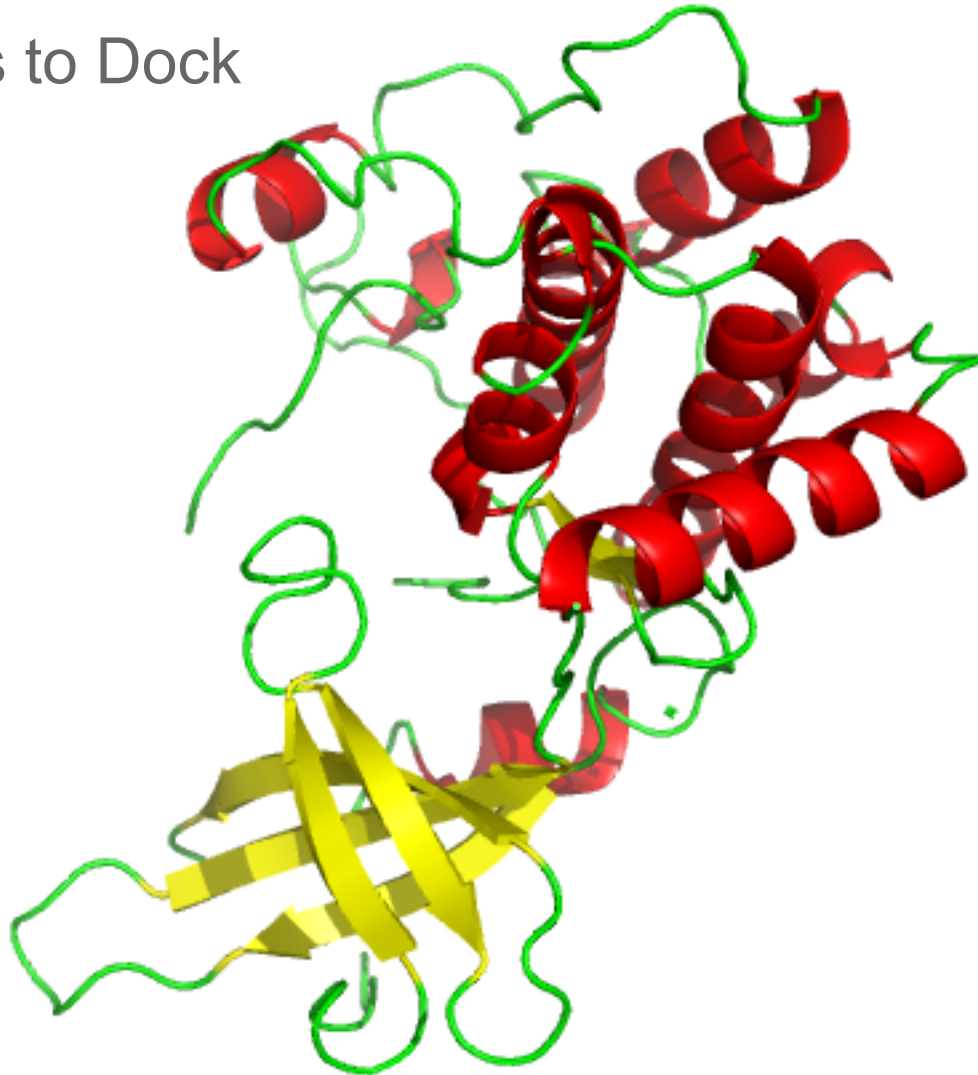


# Different Docking Accuracy for 179 and 73

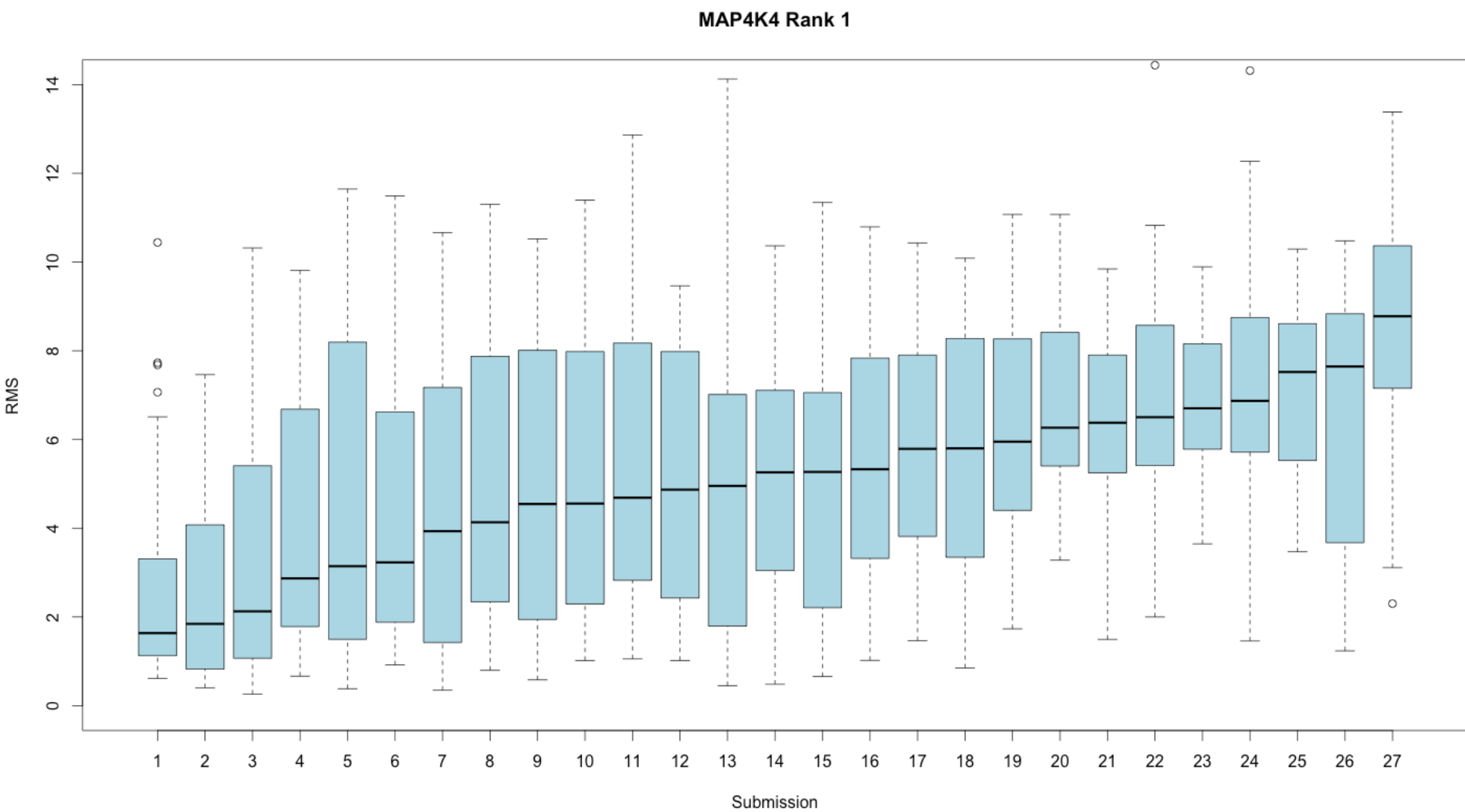


# MAP4K4

30 Ligands to Dock

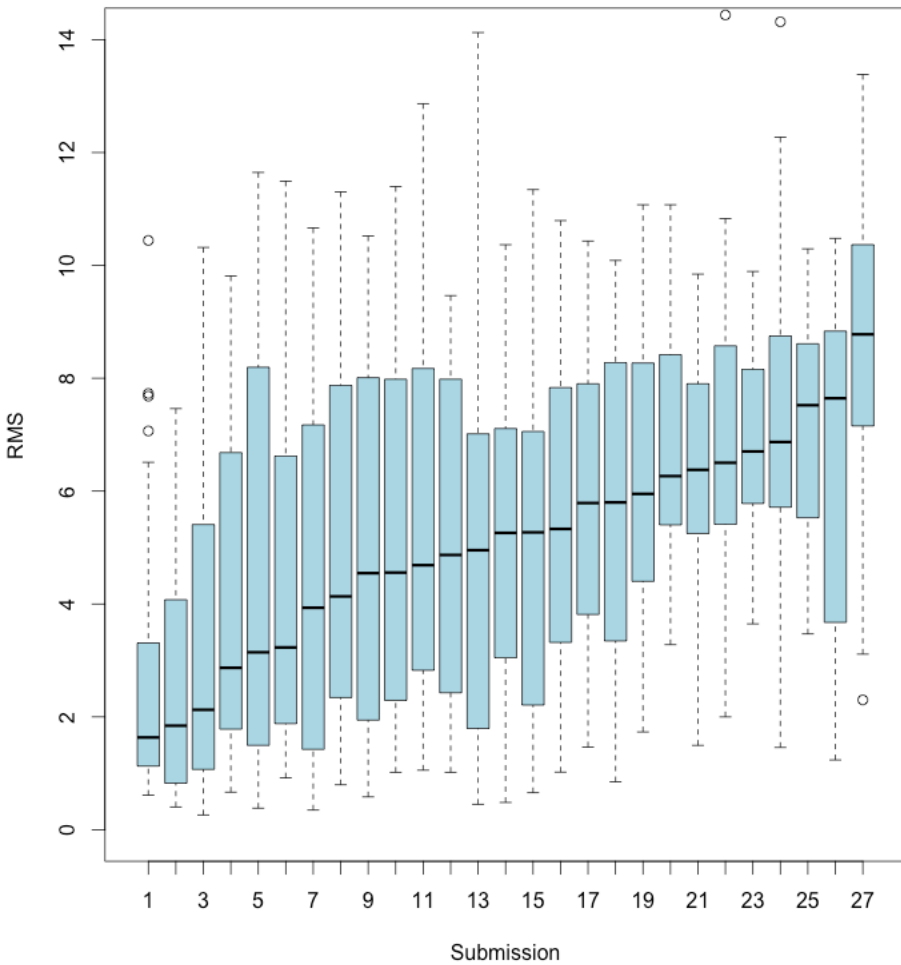


# RMS for Top Ranking MAP4K4 Dockings

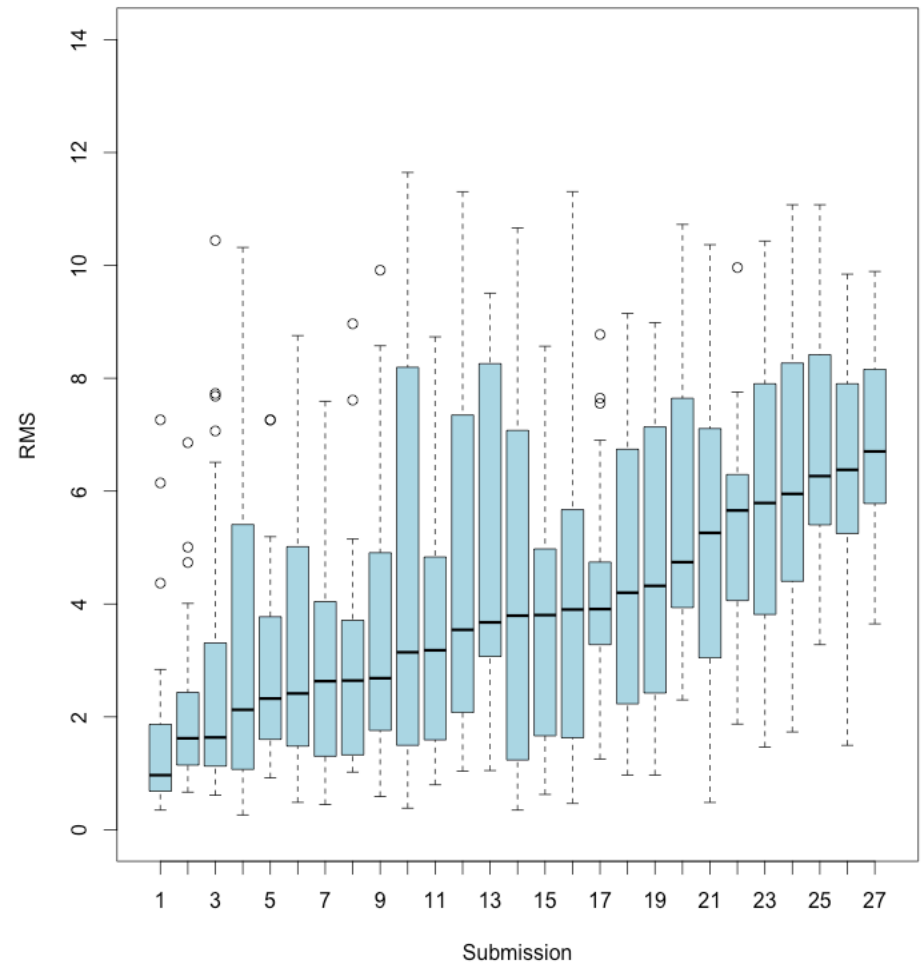


# Comparing Top and Best Ranks for MAP4K4

MAP4K4 Rank 1

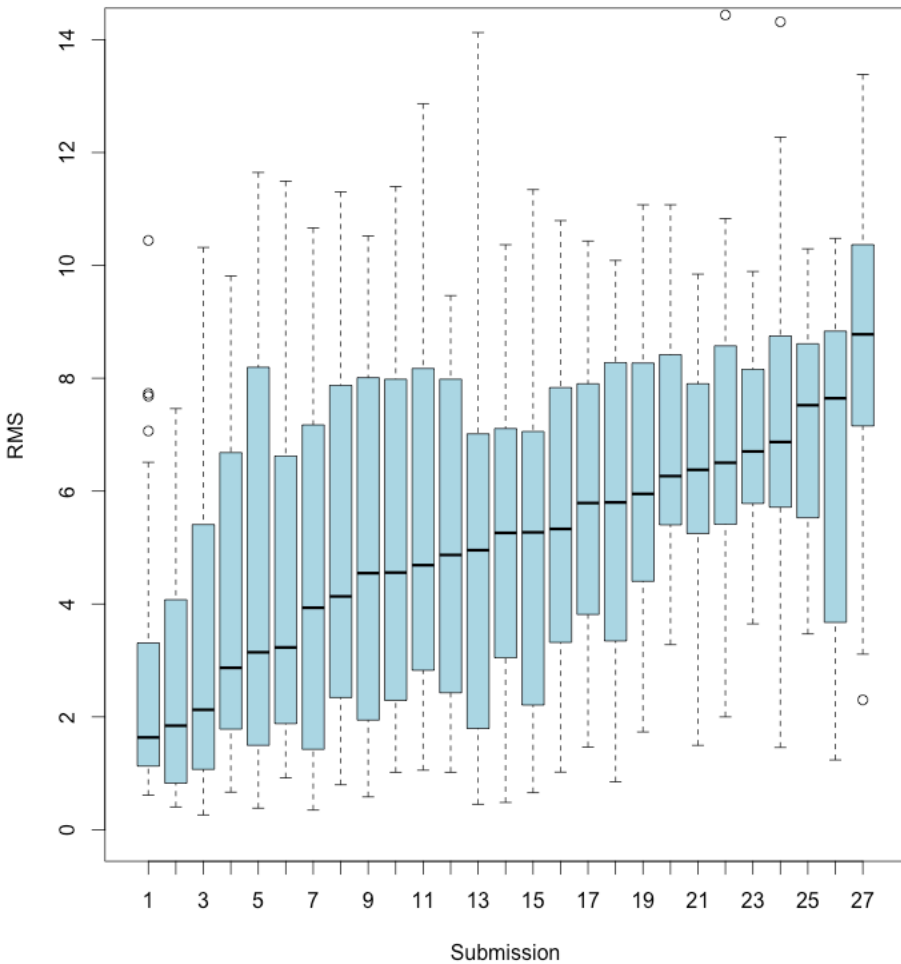


MAP4K4 Best of Top 5

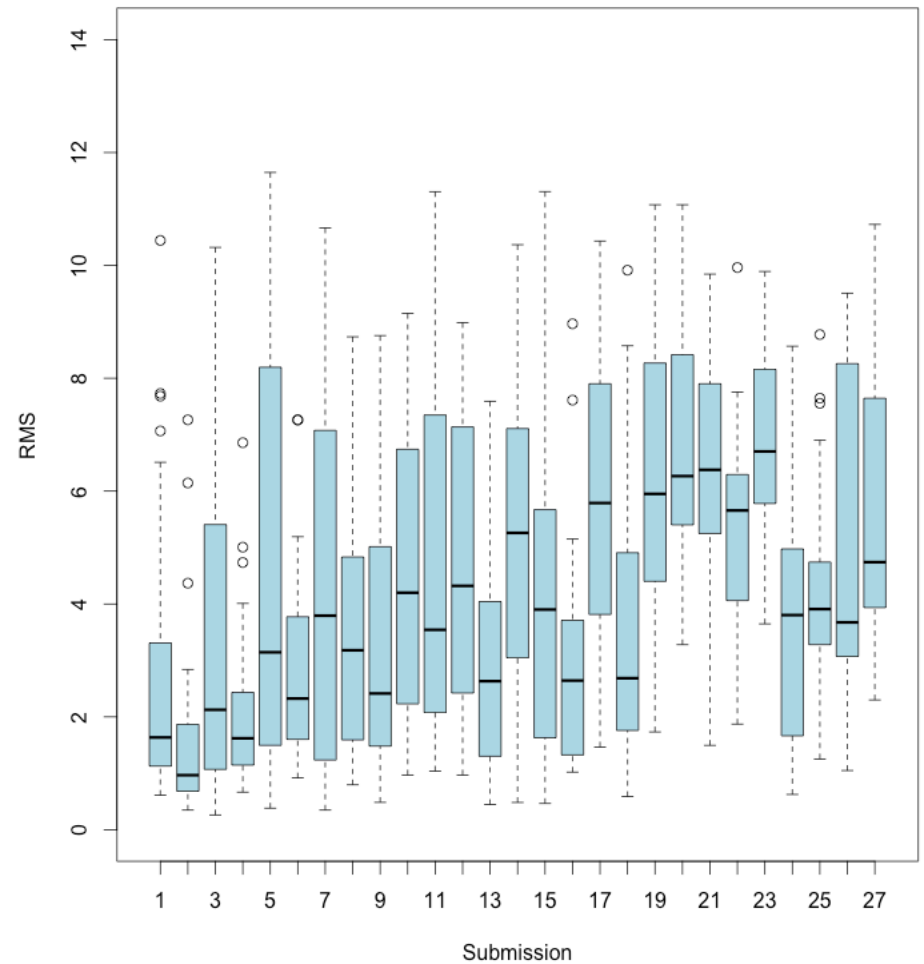


# Comparing Top and Best Ranks for MAP4K4 (Same Ordering)

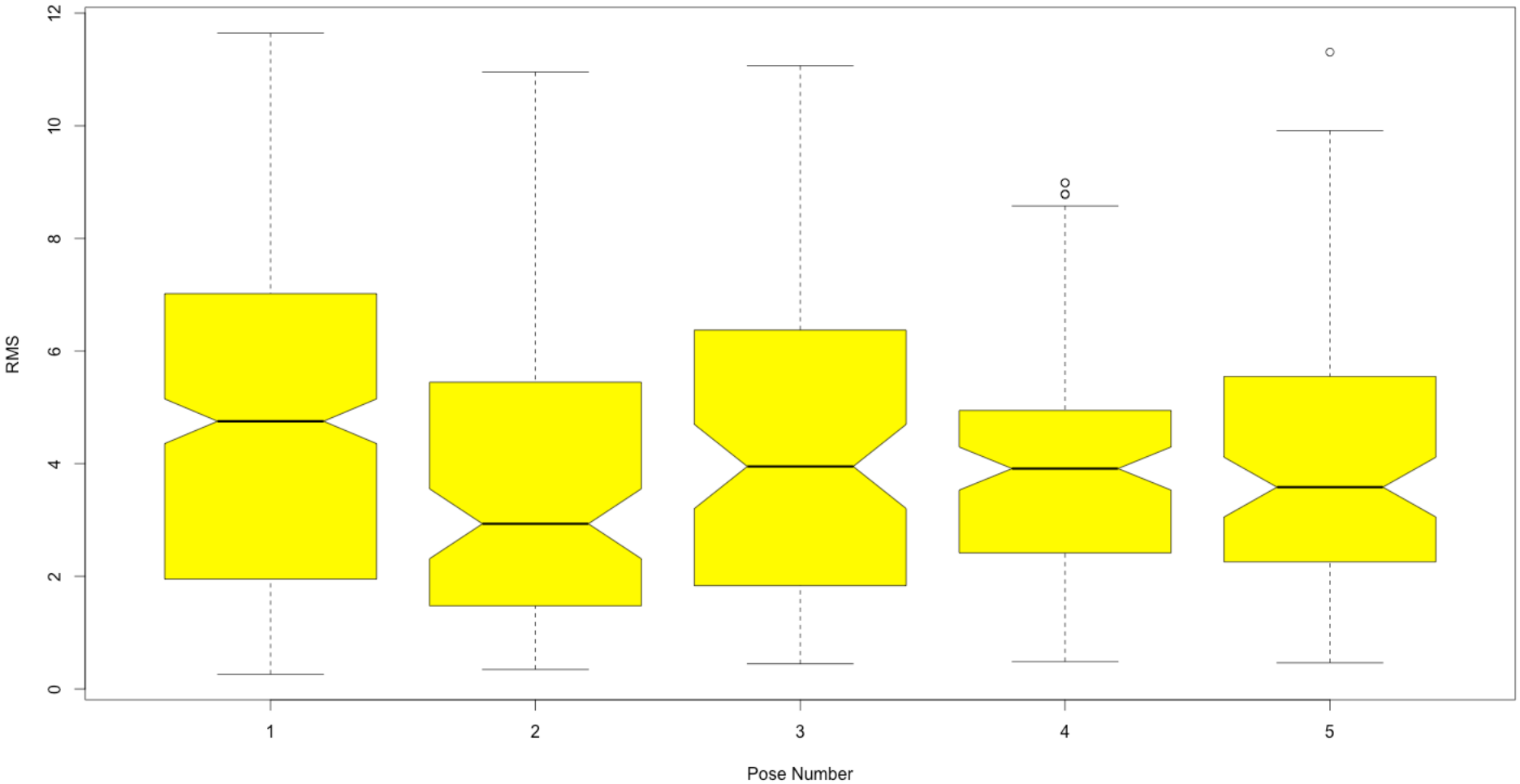
MAP4K4 Rank 1



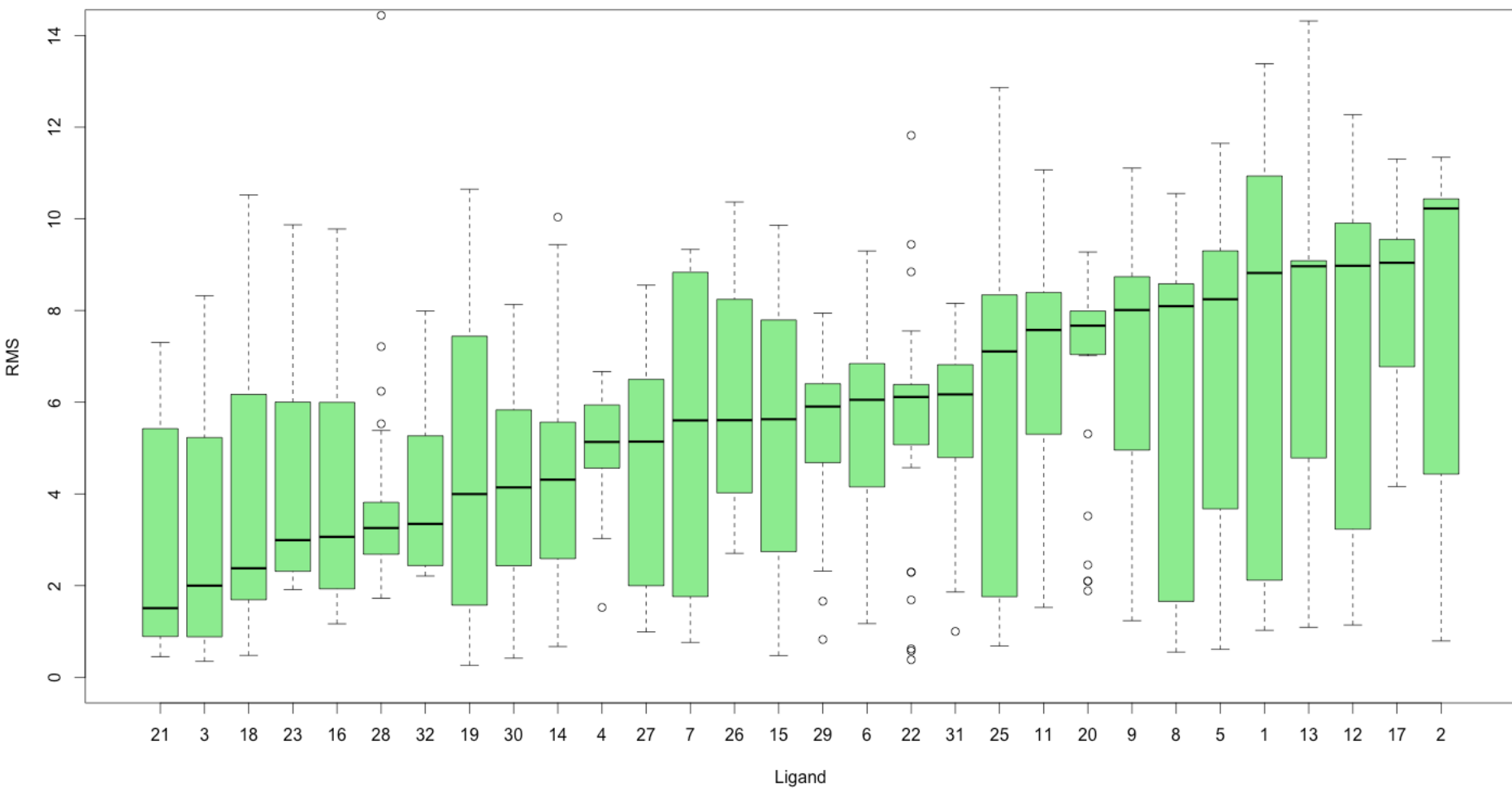
MAP4K4 Best of Top 5



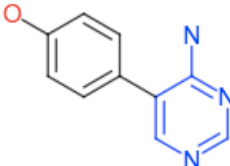
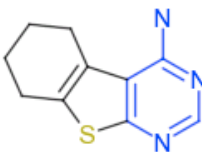
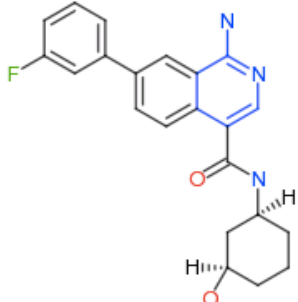
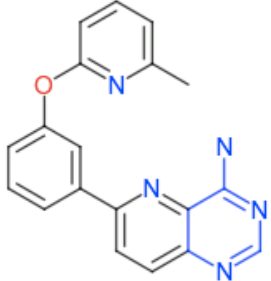
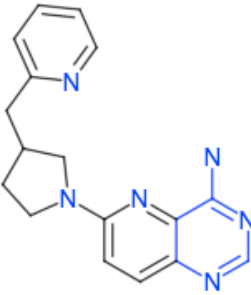
# Top Ranked Poses Did Not Have the Best RMS



# Which Ligands Were Easiest to Dock into MAP4K4?

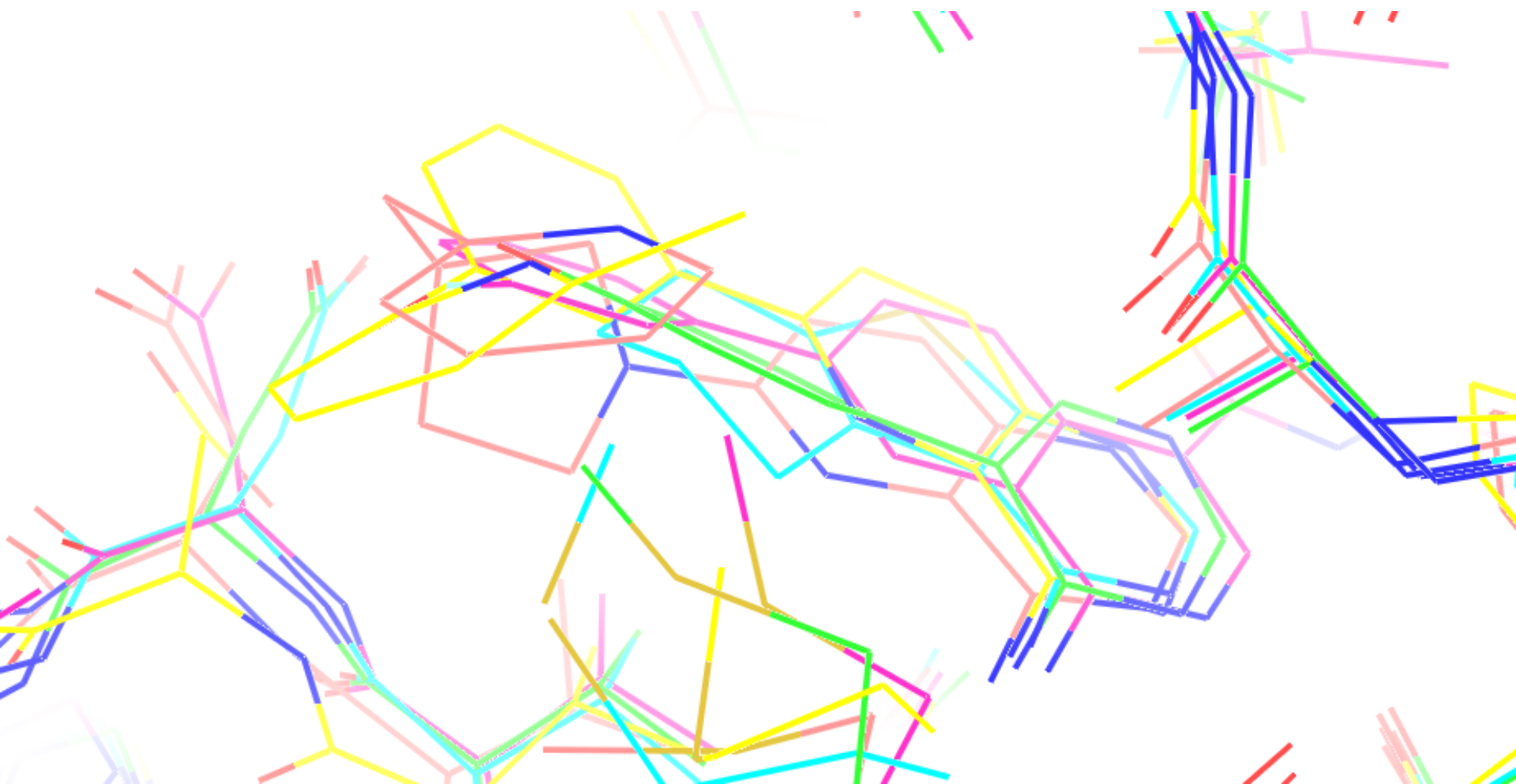


# Common Motif in Correctly Docked Structures

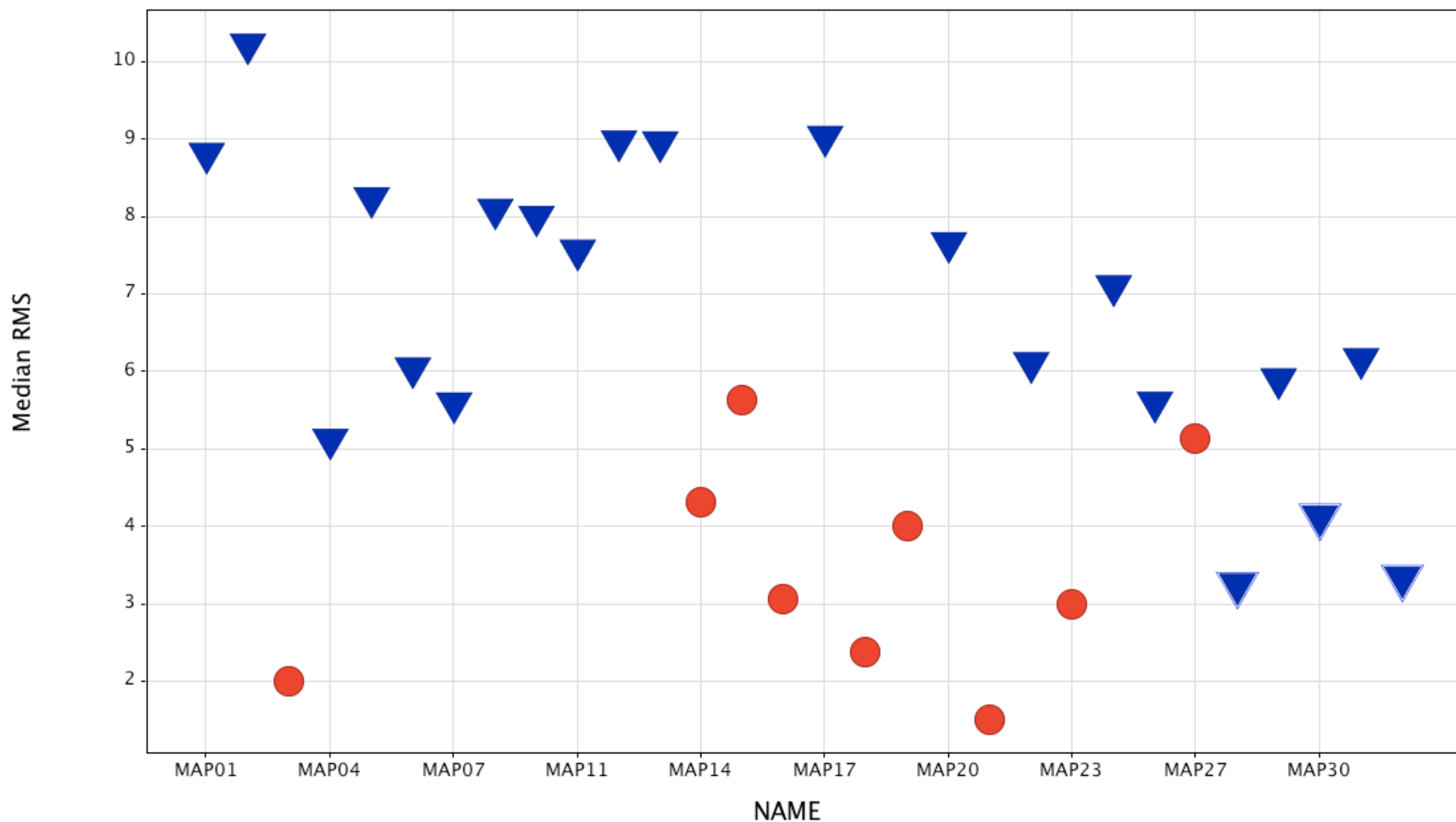
NAME	MAP21	MAP03	MAP18	MAP23	MAP16
SMILES					
Median RMS	1.51	2	2.38	2.99	3.06



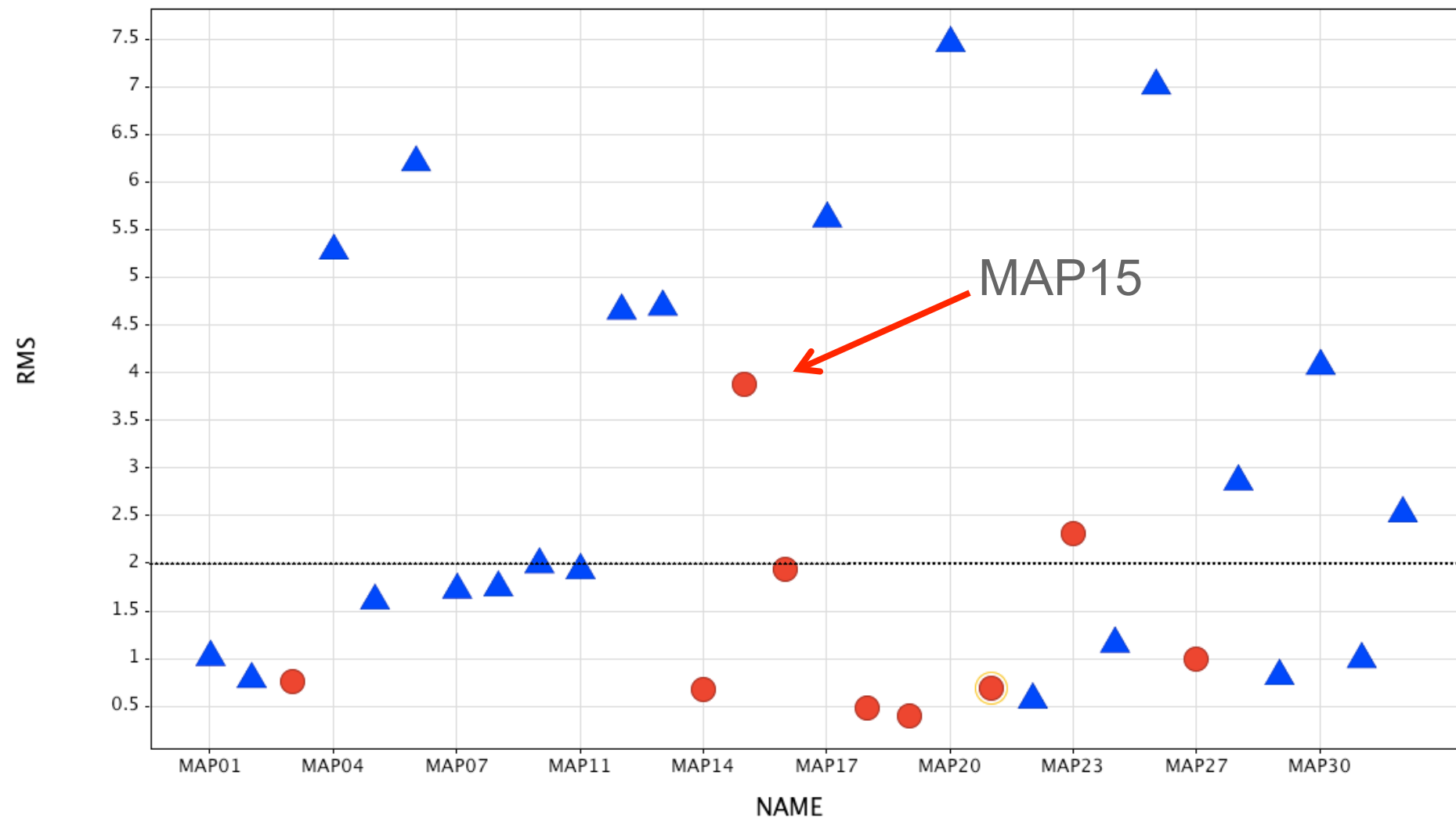
# Structures Have a Common Binding Mode



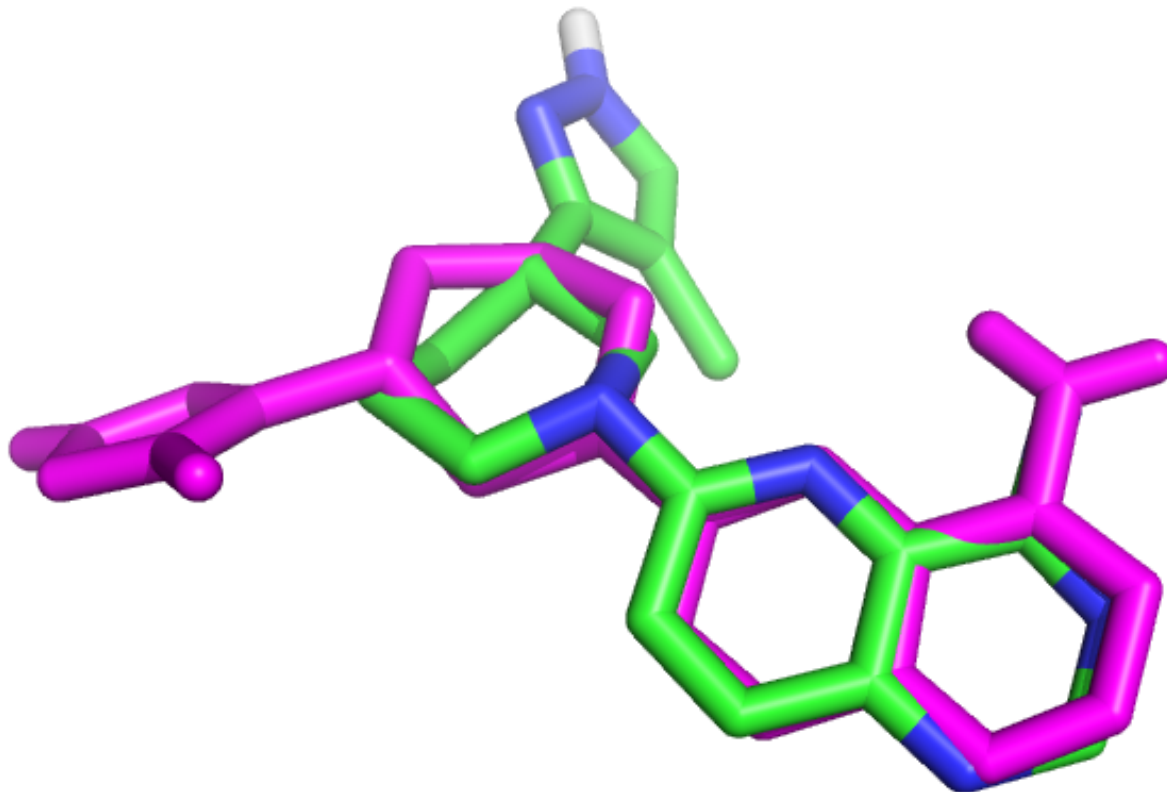
# Pyridyl Anilines Have Lower Median RMS



# Similar Trends in High Scoring Entries



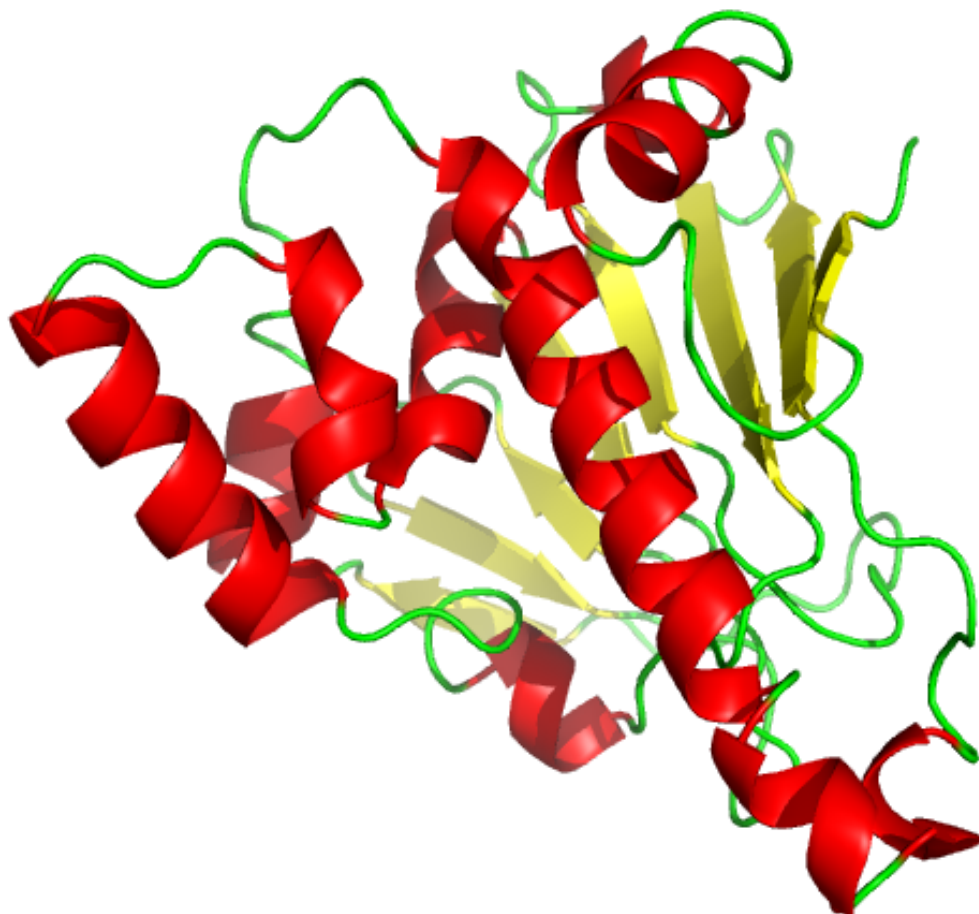
# Detail on MAP15



# Rank Ordering

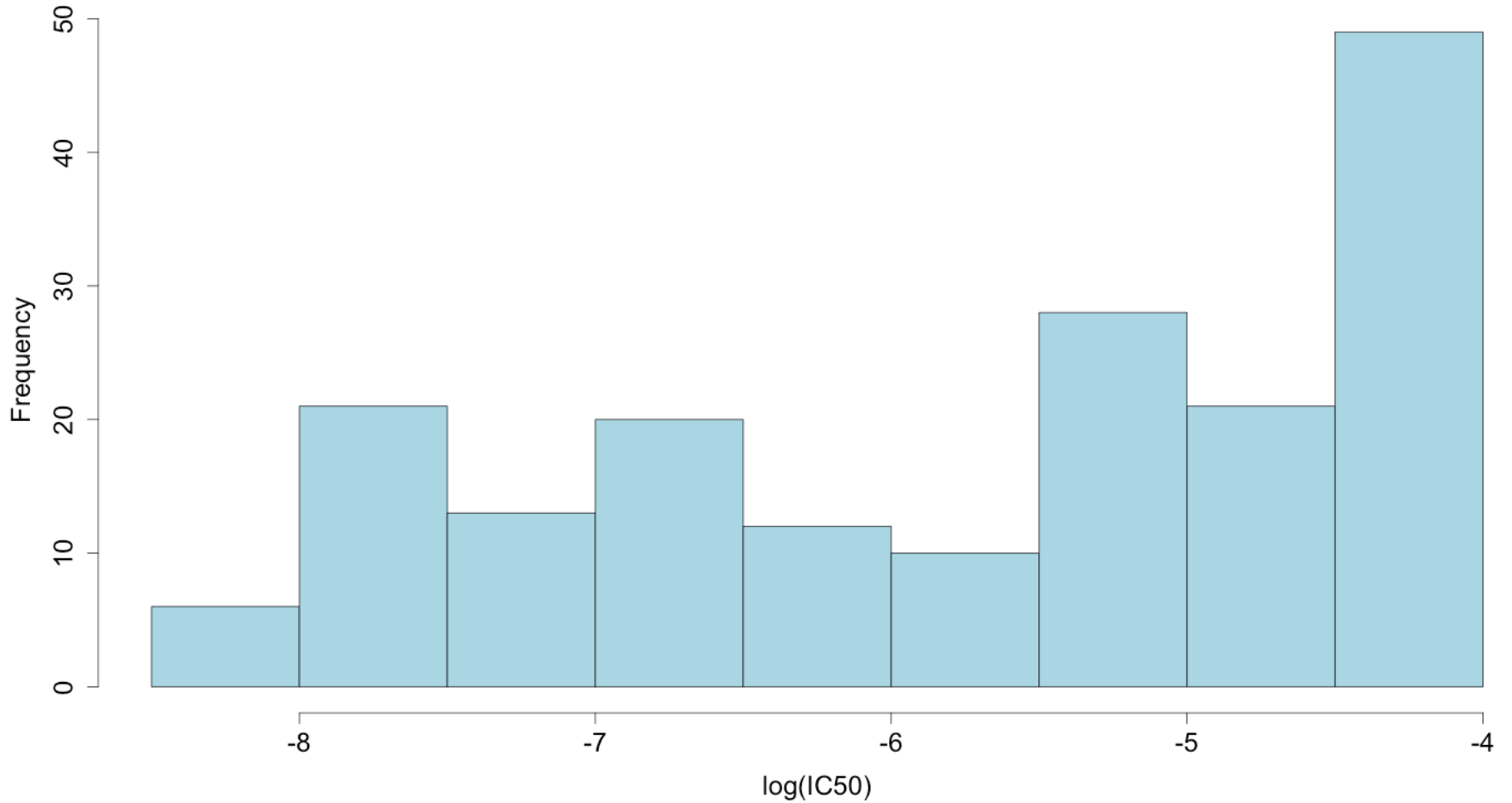


# HSP90

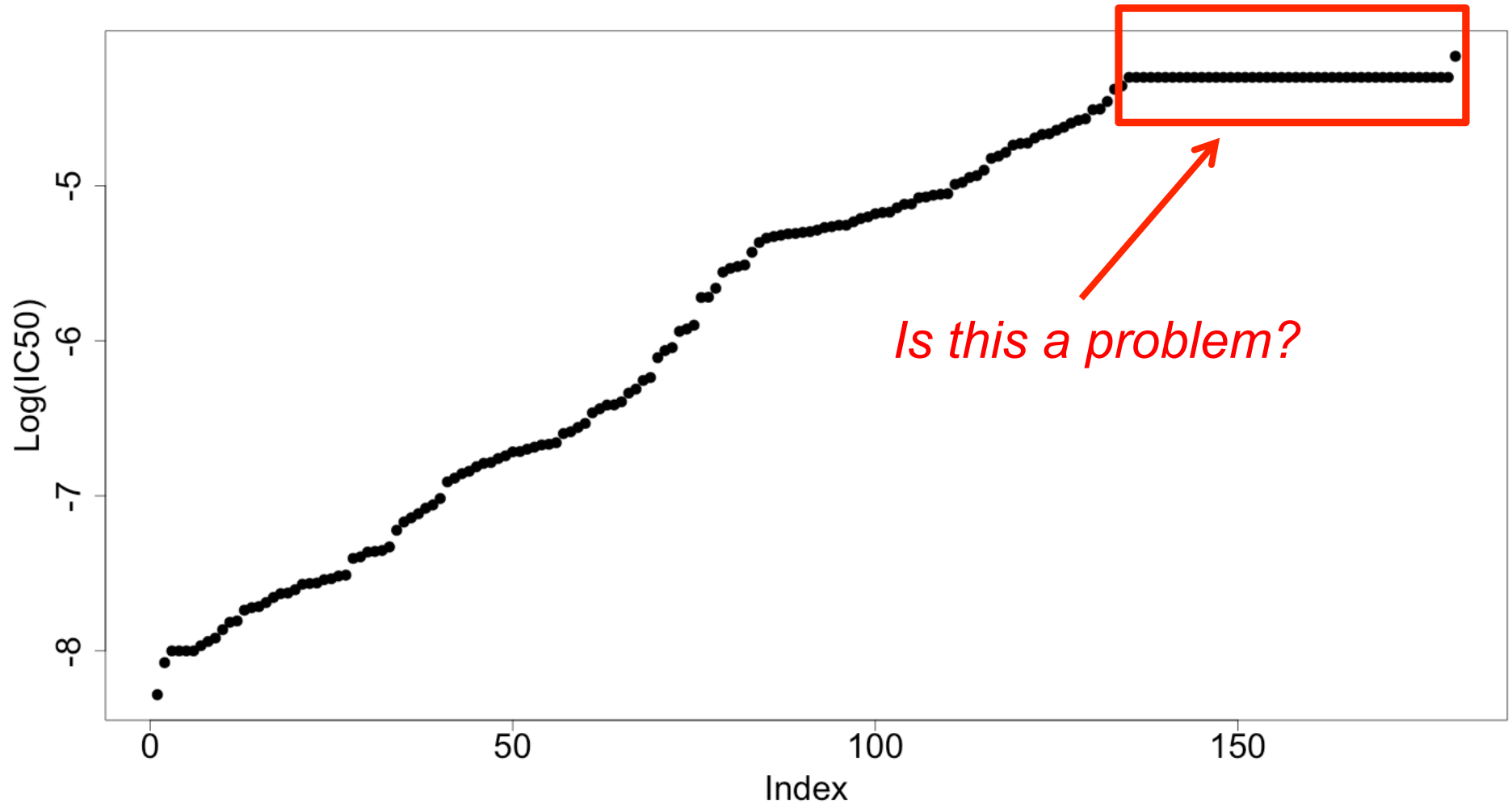


# HSP90 Activity Distribution

HSP90 IC50 Distribution

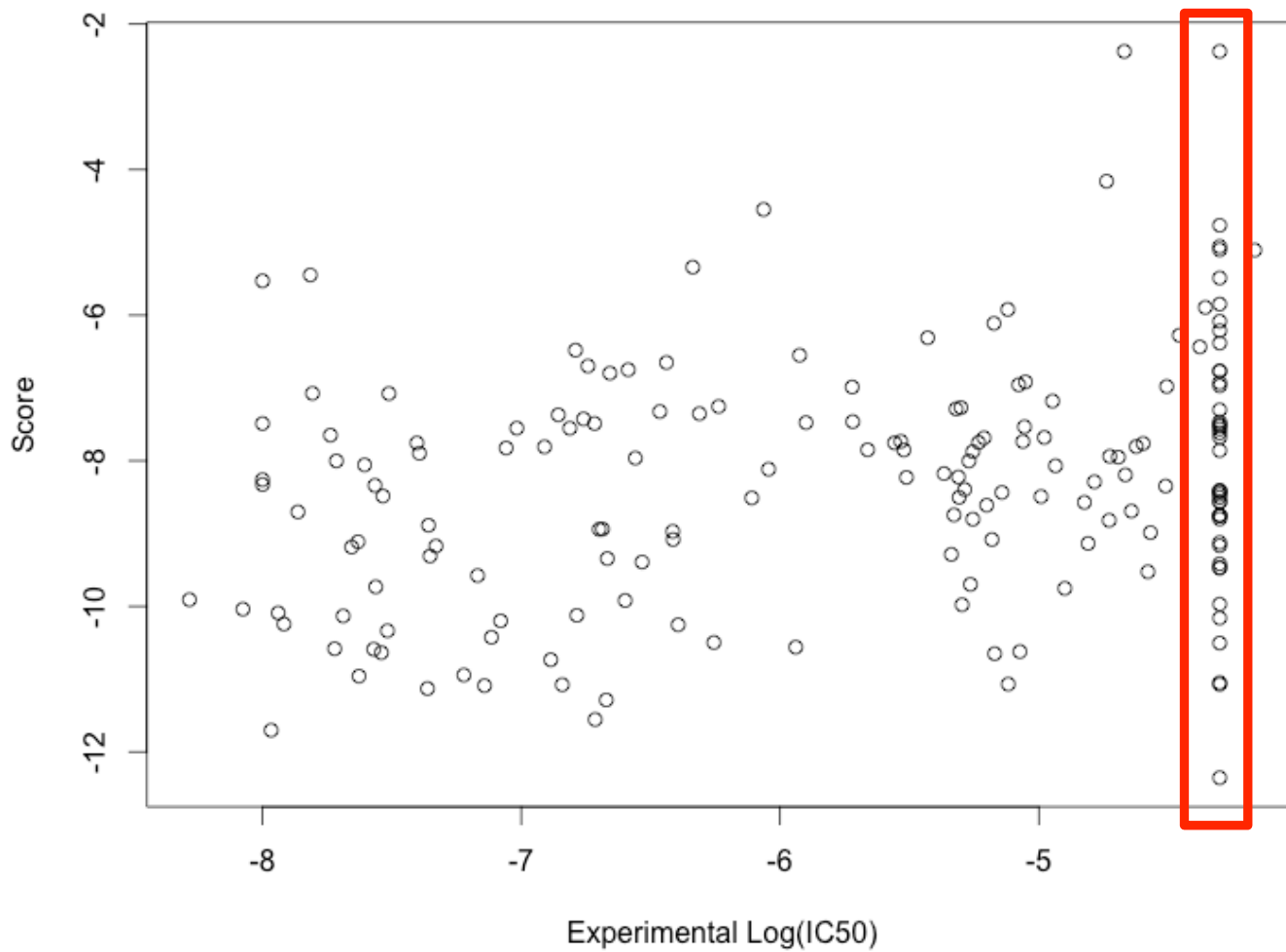


# HSP90 Activity Distribution





# Drop the Inactive Compounds?



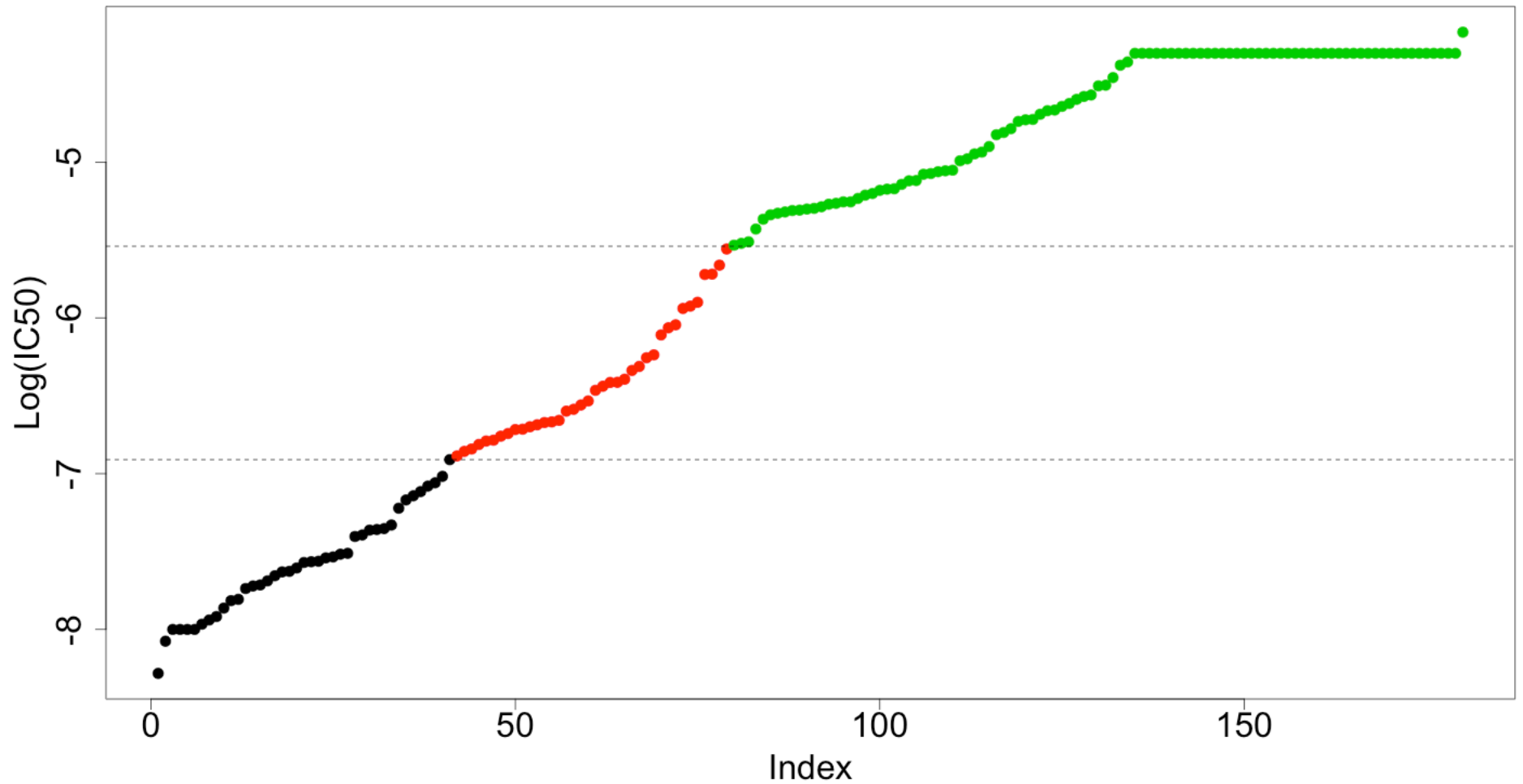
# Can we regress the HSP90 dataset?

- Many compounds with the same activity
  - 48 inactive compounds
  - Activities not evenly distributed
- How will different ranks for the same activity affect correlation?

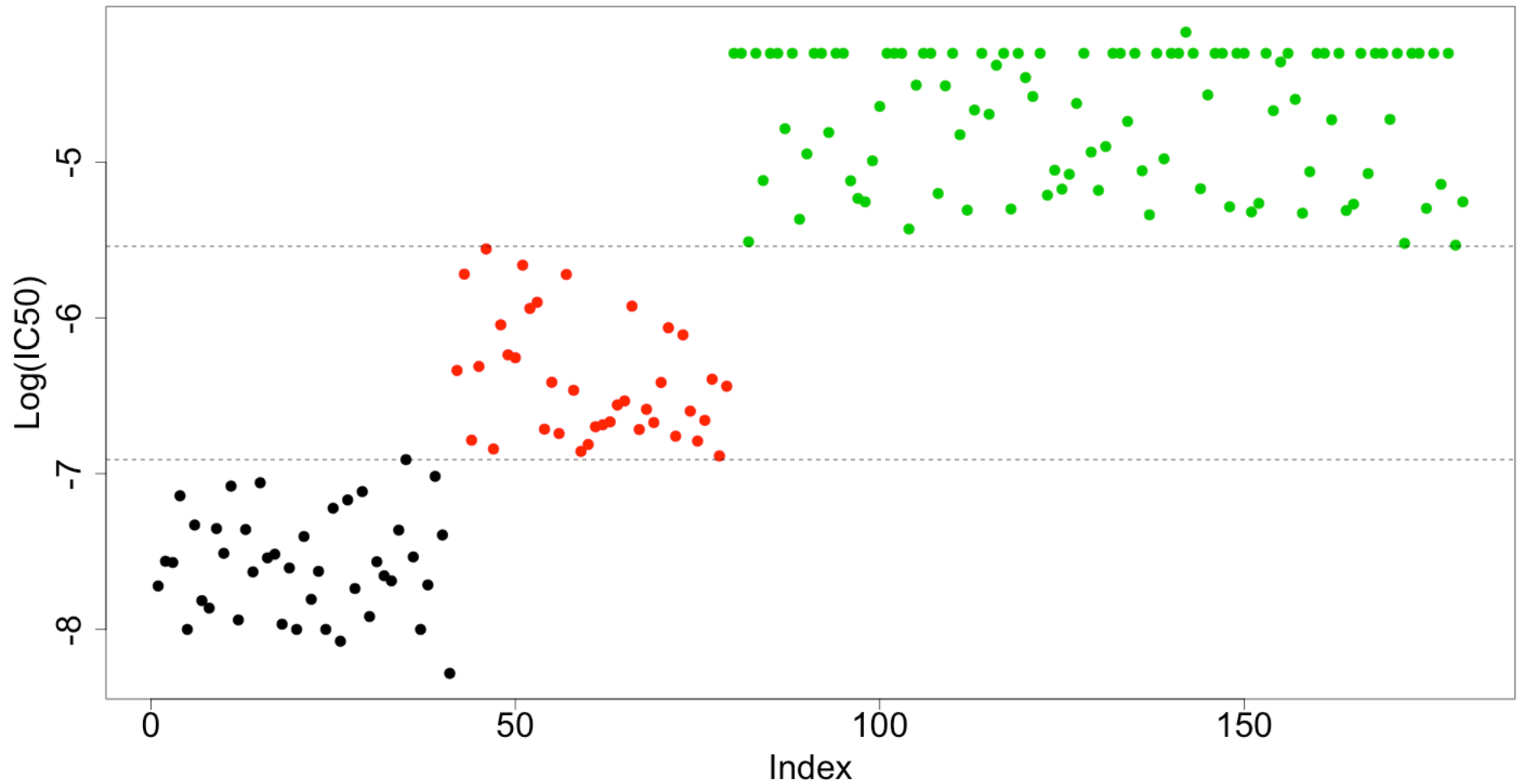
# Simulate Activity Prediction

- Divide ranks into bins based on activity
  - 3 to 10 bins
- Permute ranks within bins
- Calculate correlations between initial and permuted bins

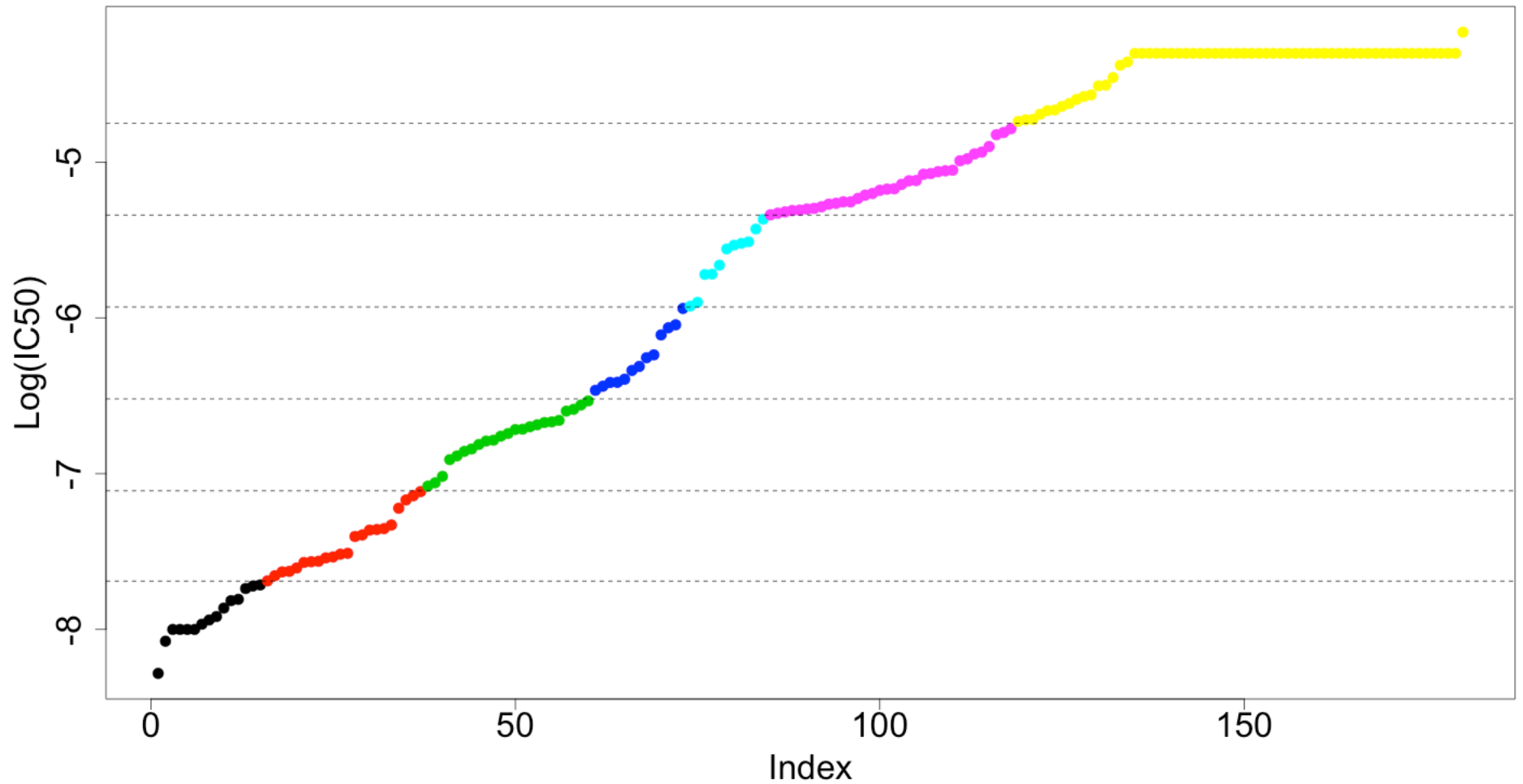
# Divide Data Into 3 Bins



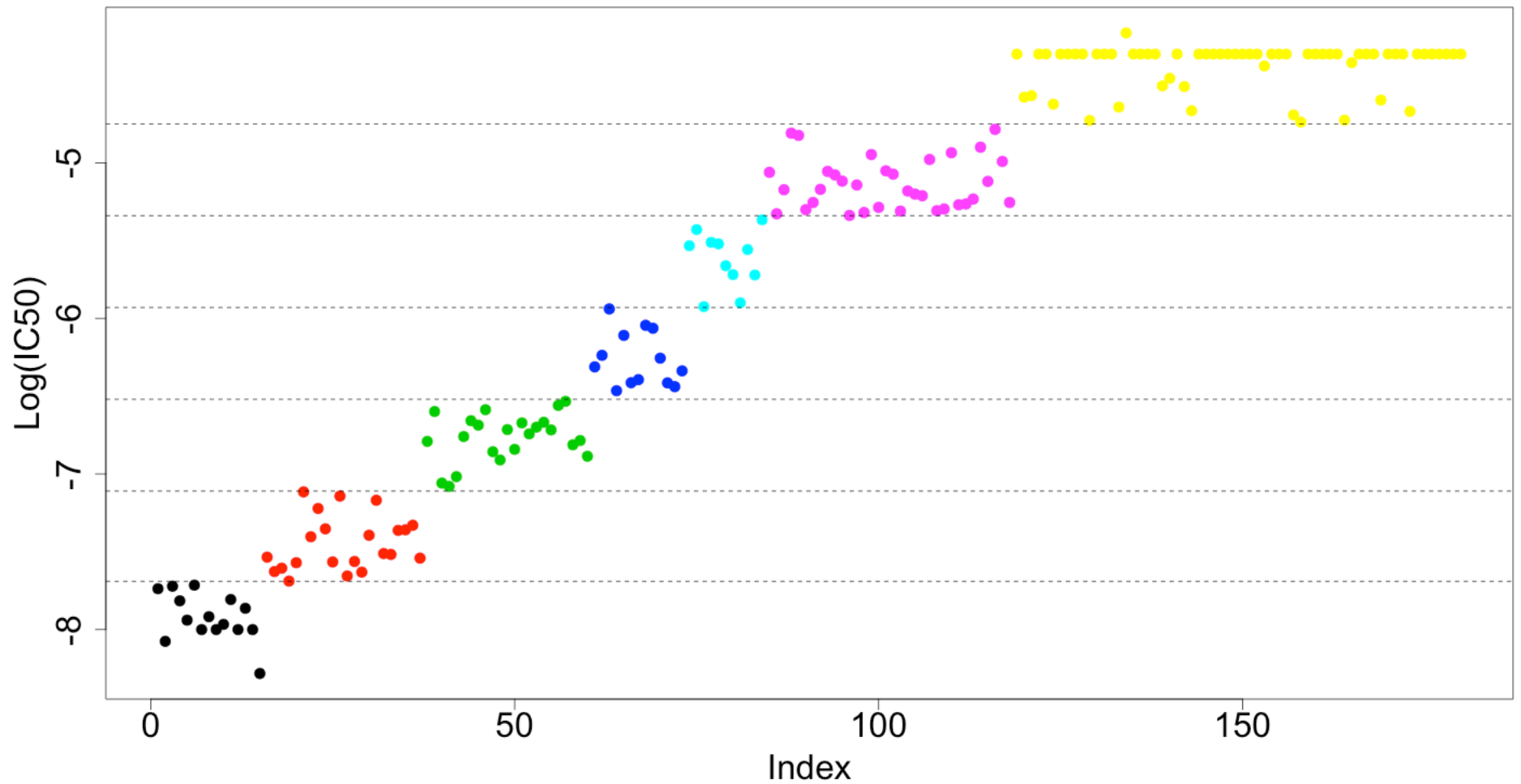
# Permute Within the Bins



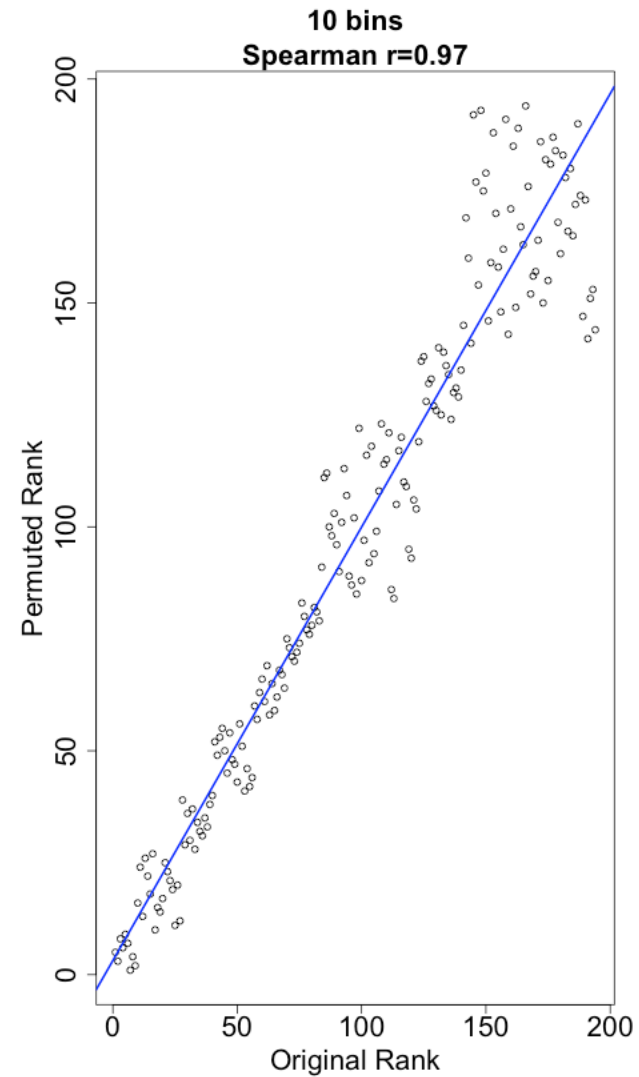
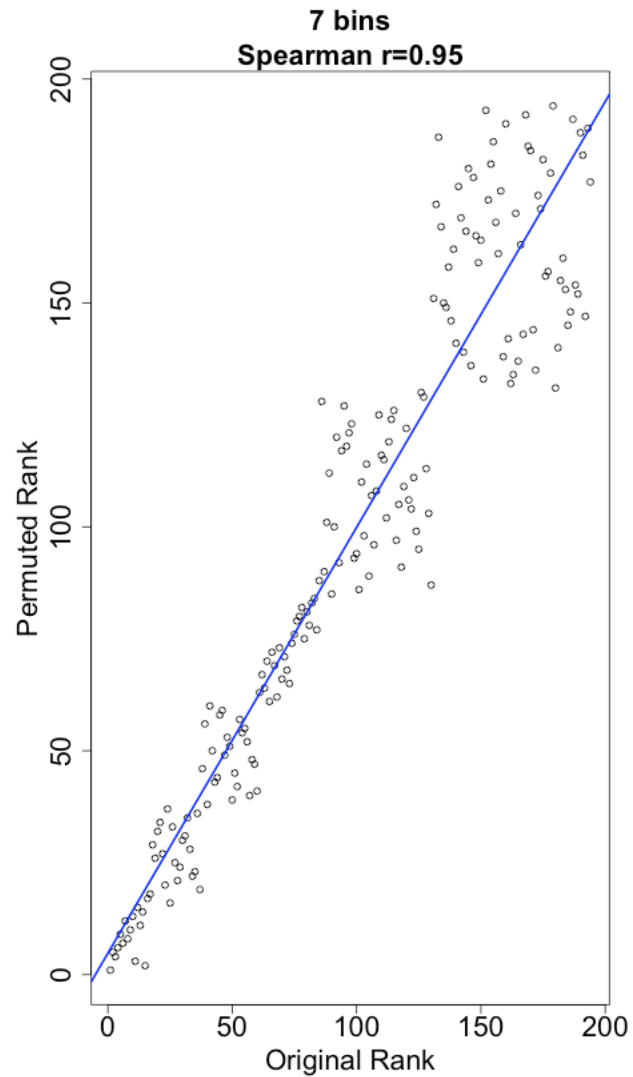
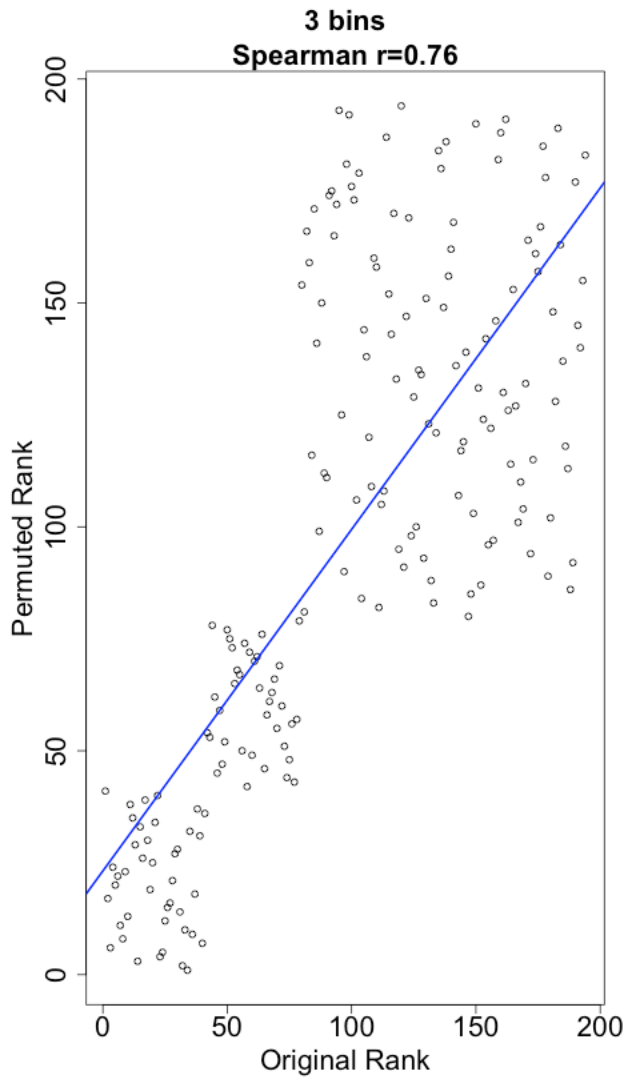
# Divide Data Into 7 Bins



# Permute Within 7 Bins

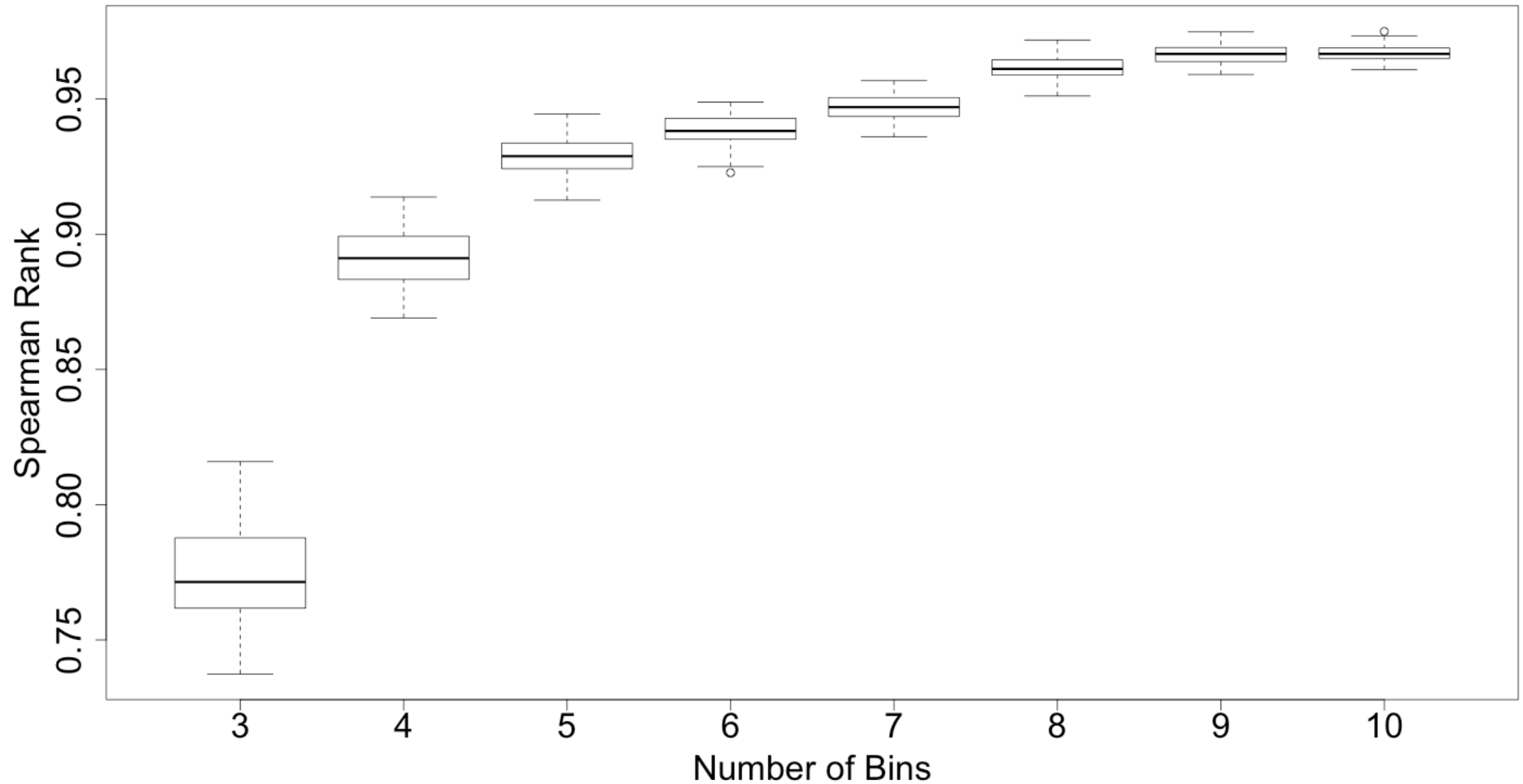


# Impact of Binning on Correlation





# Reasonable Correlations Are Achievable



# Maximum Achievable Correlation

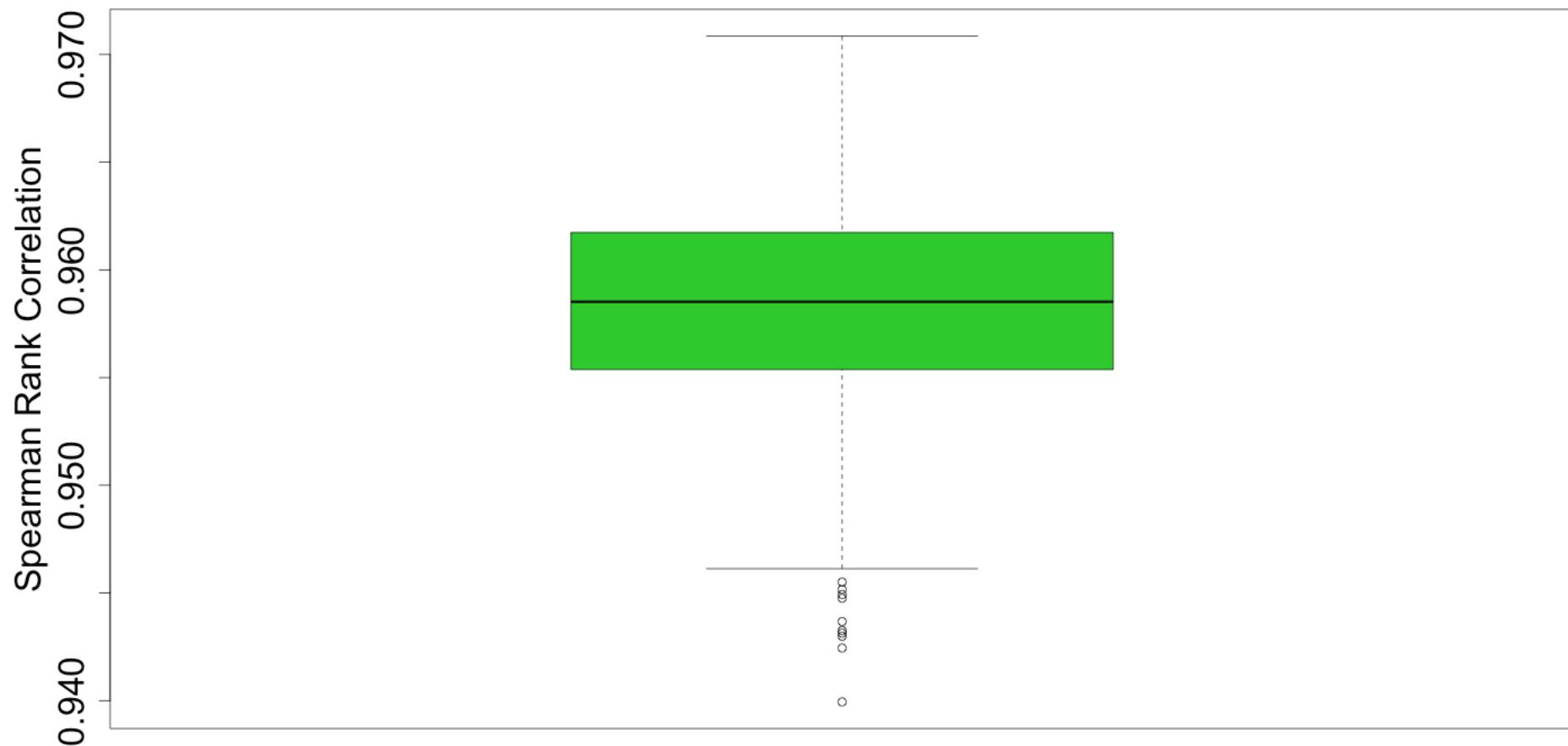
- Start with experimental data
- Add Gaussian error
  - Mean = 0.0
  - Standard deviation = 0.3 log
- Calculation correlation
- Repeat 1000 times

Brown, Scott P., Steven W. Muchmore, and Philip J. Hajduk.  
"Healthy skepticism: assessing realistic model performance."  
*Drug Discovery Today* 14.7 (2009): 420-427.



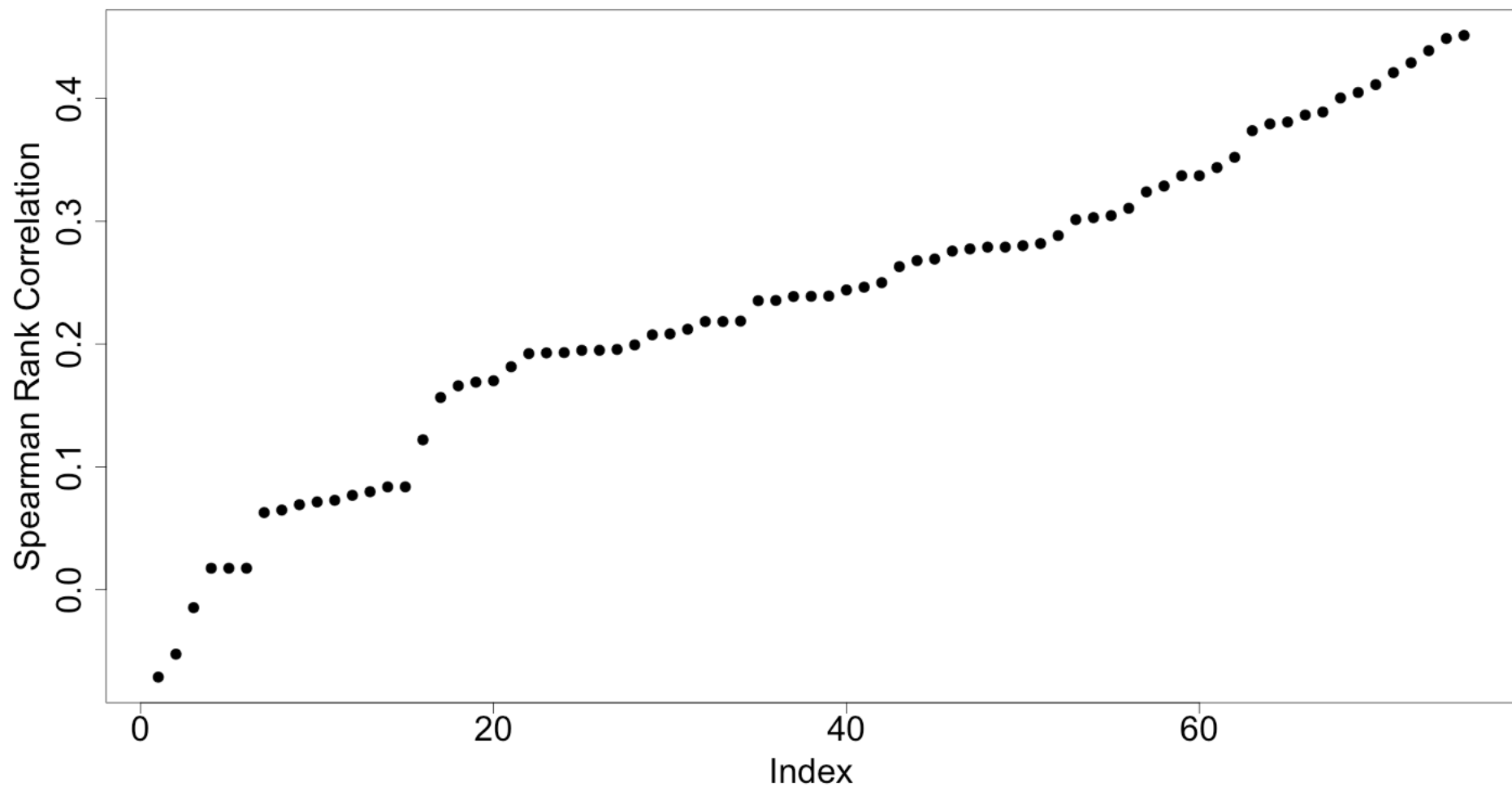
# Maximum Achievable Correlation for HSP90

Maximum Achievable Correlation

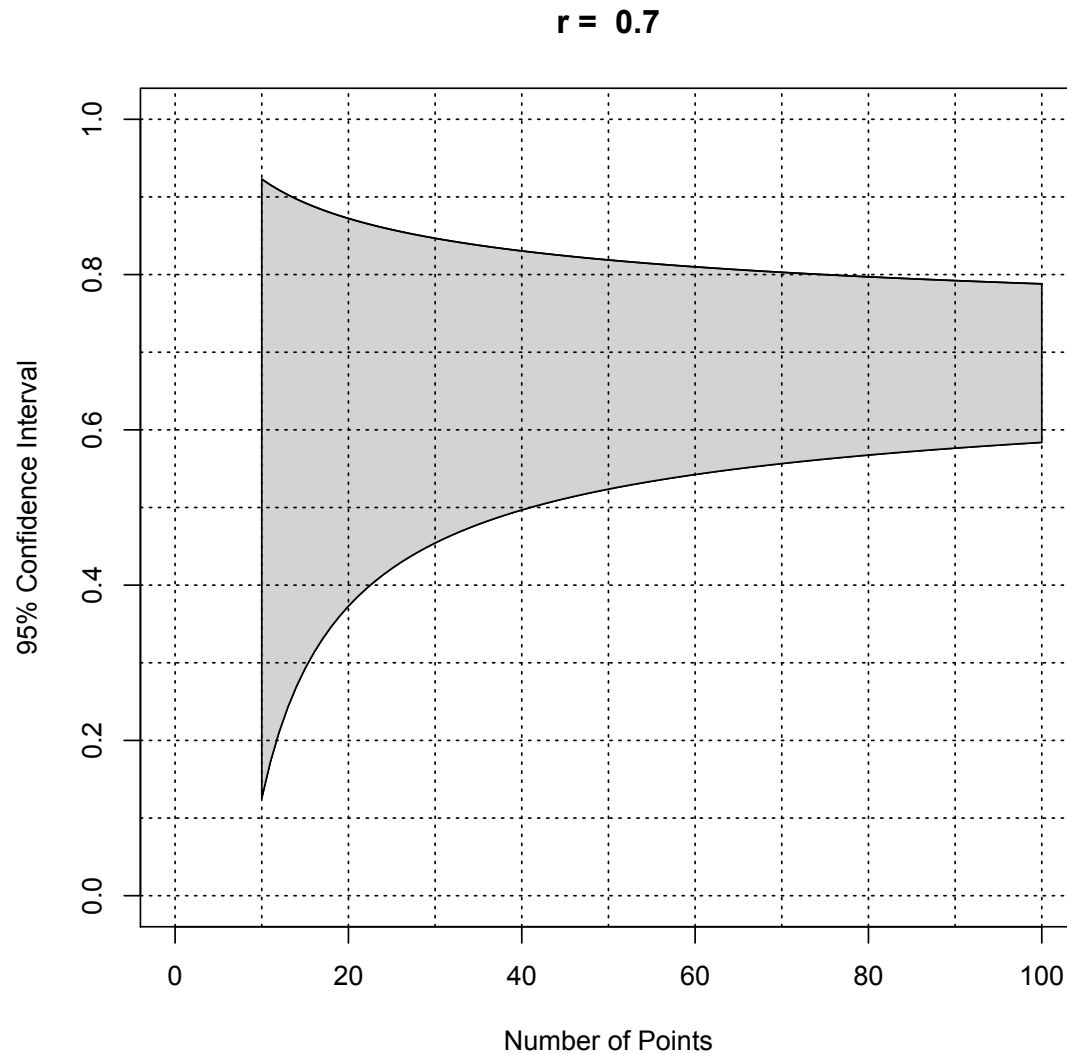


# HSP90 Stage 1 Rank Correlations

HSP90 Stage 1

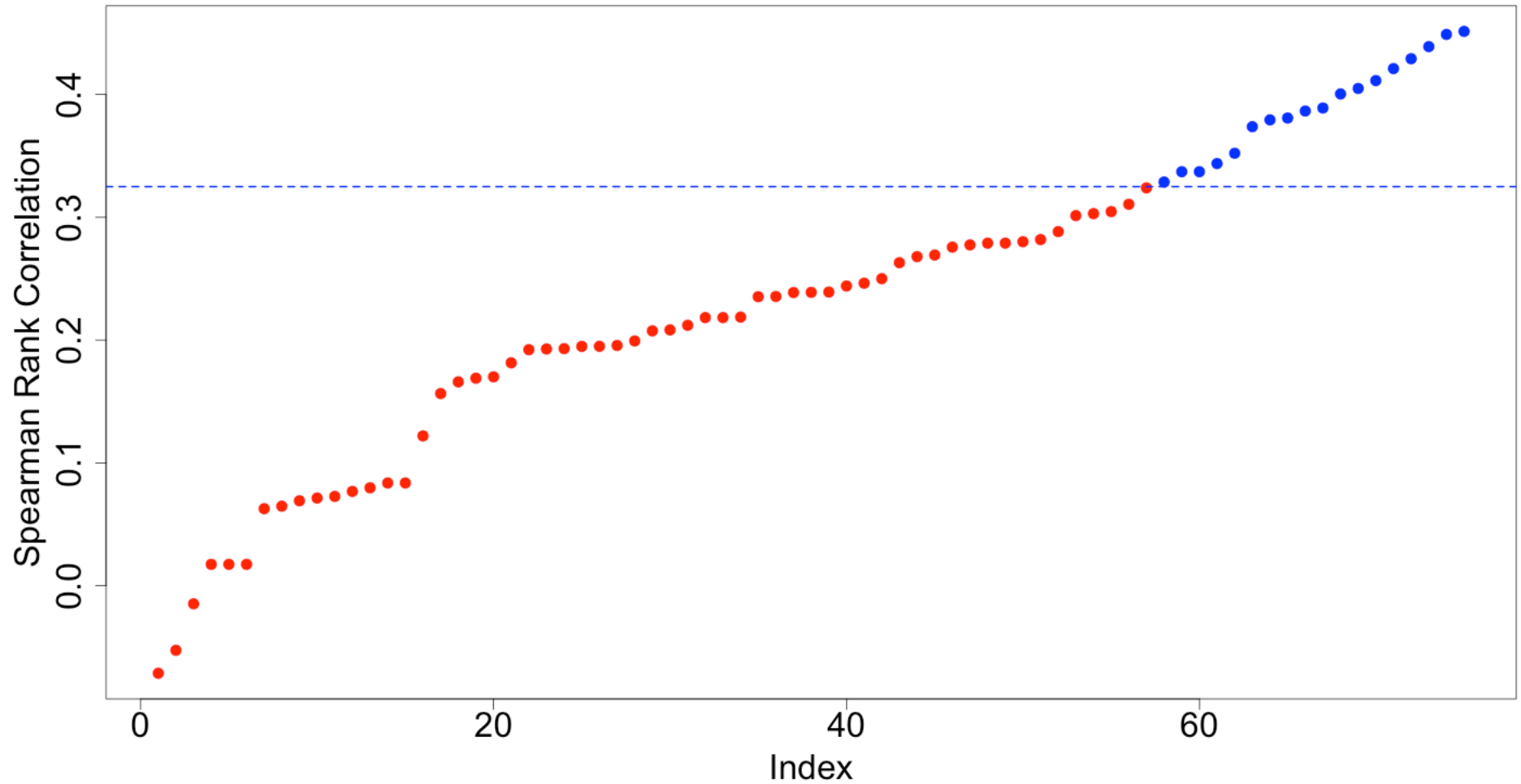


# Remember That Correlations Have Confidence Intervals



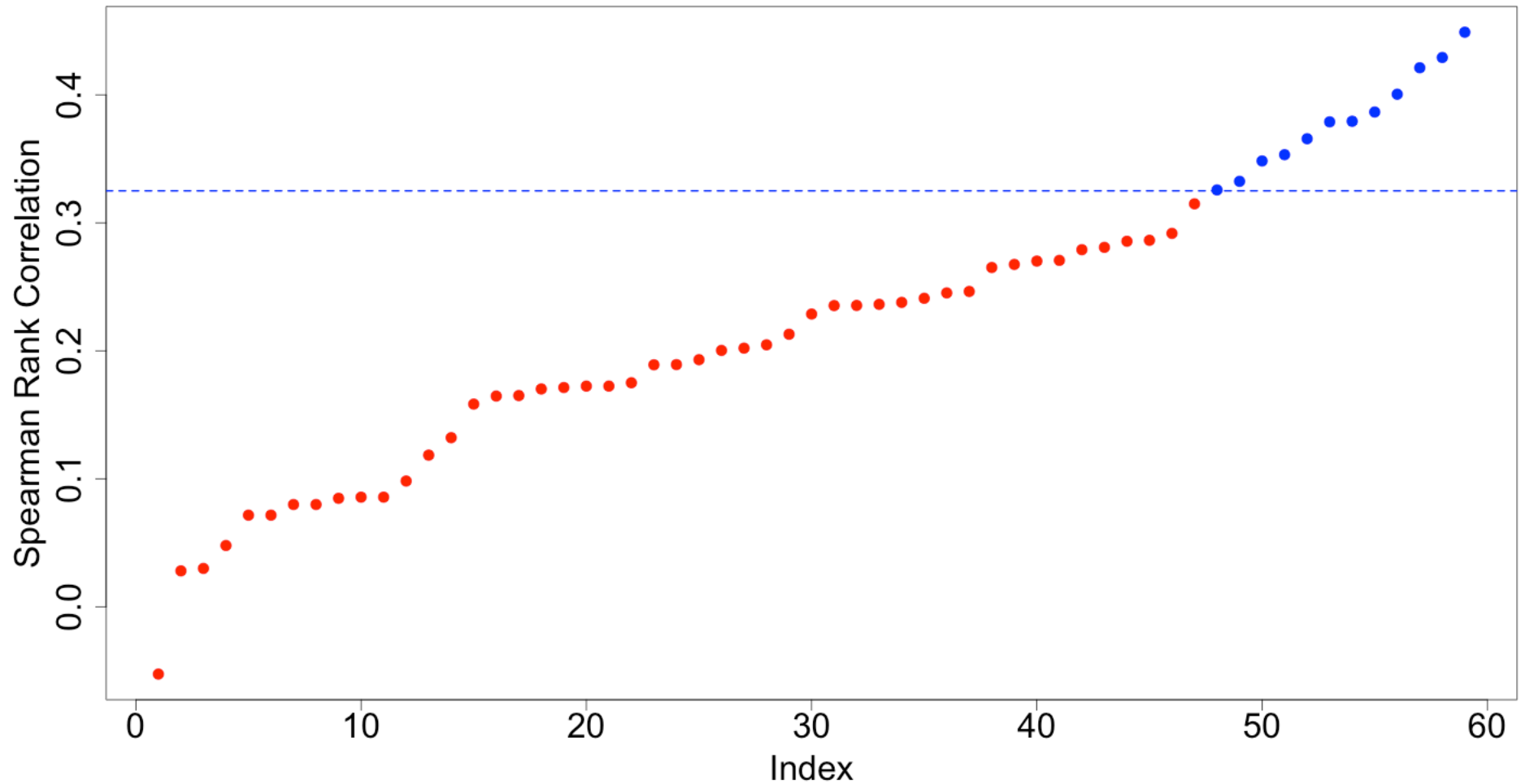
# Comparing HSP90 Stage1 Correlations

Top 18 Correlations Equivalent



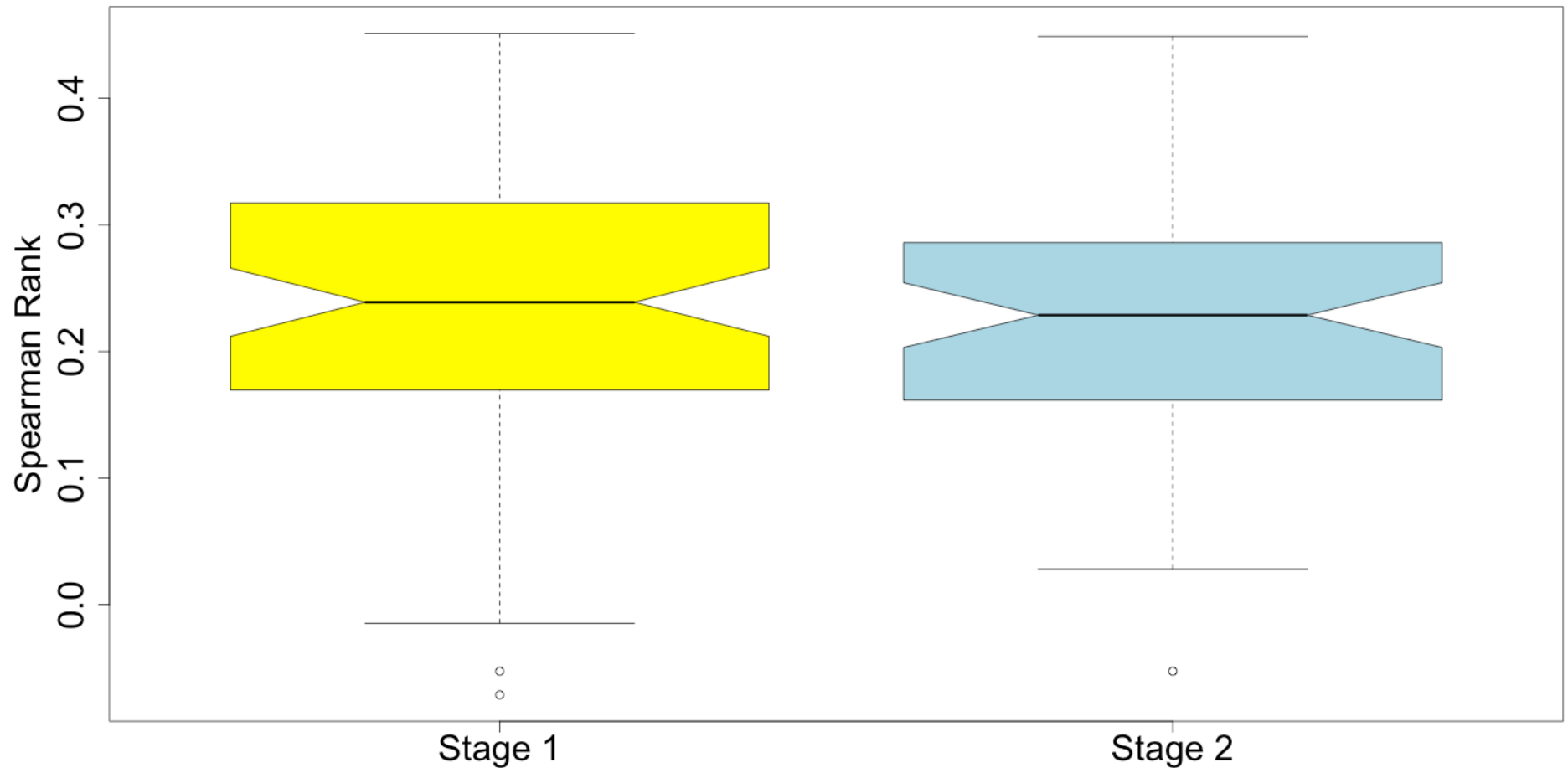
# Comparing HSP90 Stage 2 Correlations

Top 12 Correlations Equivalent



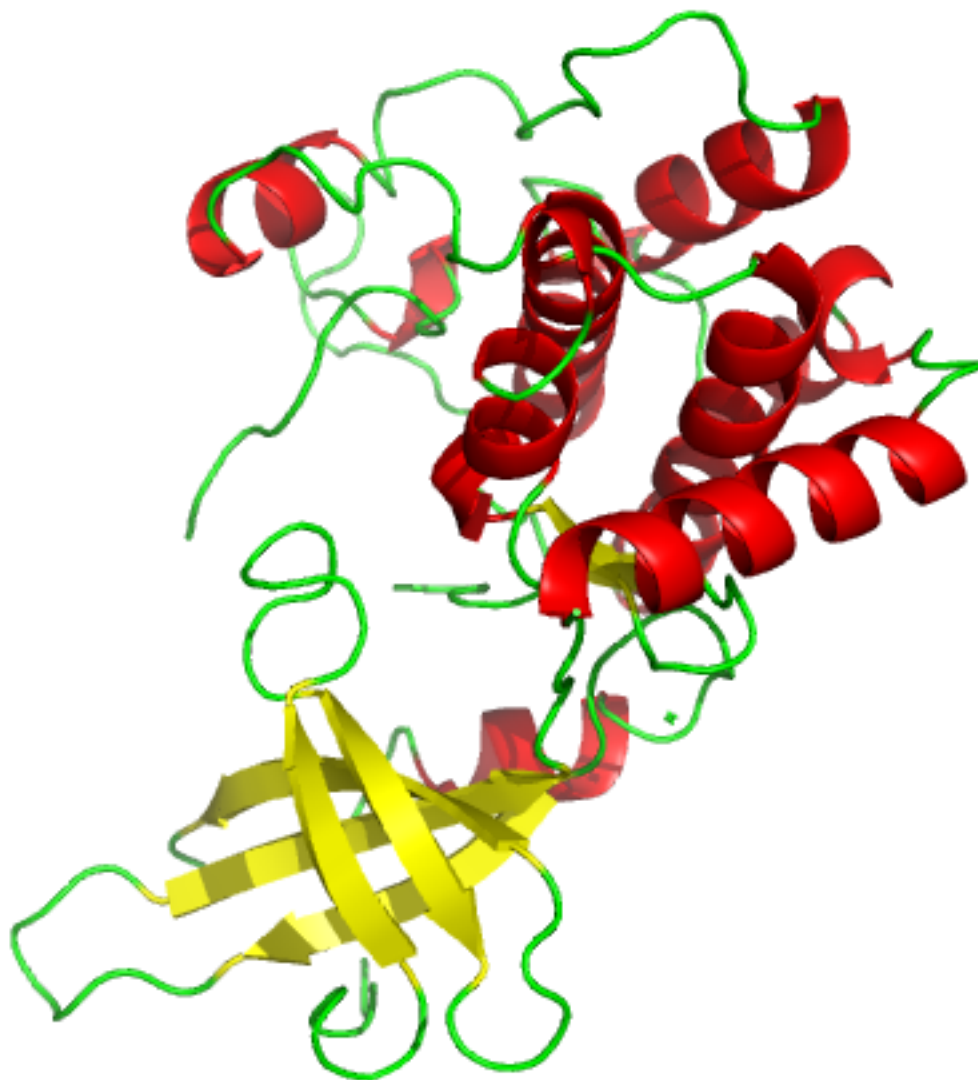
# Similar Performance Between Stage 1 and Stage 2

## HSP90 Correlations

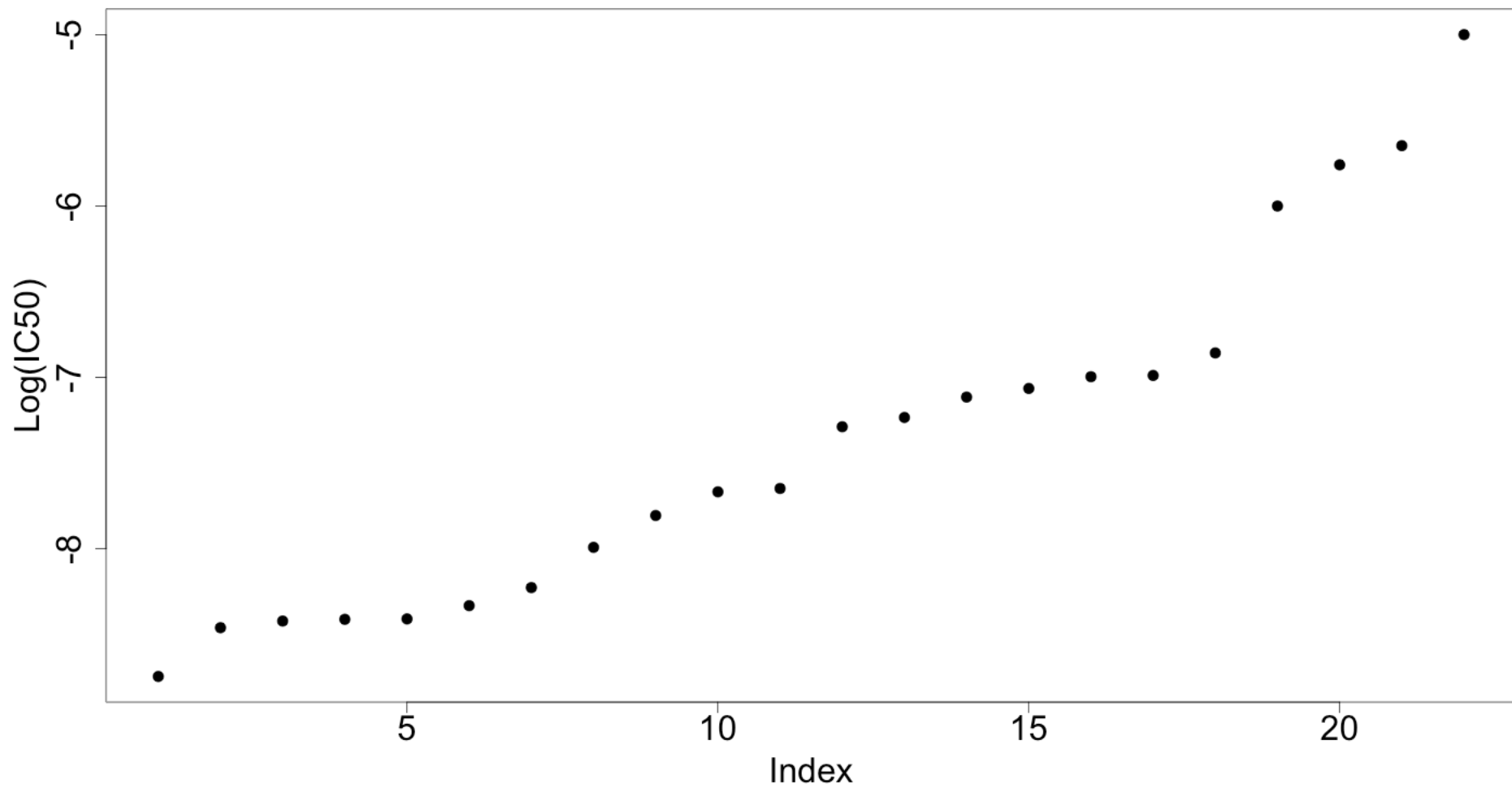




# MAP4K4

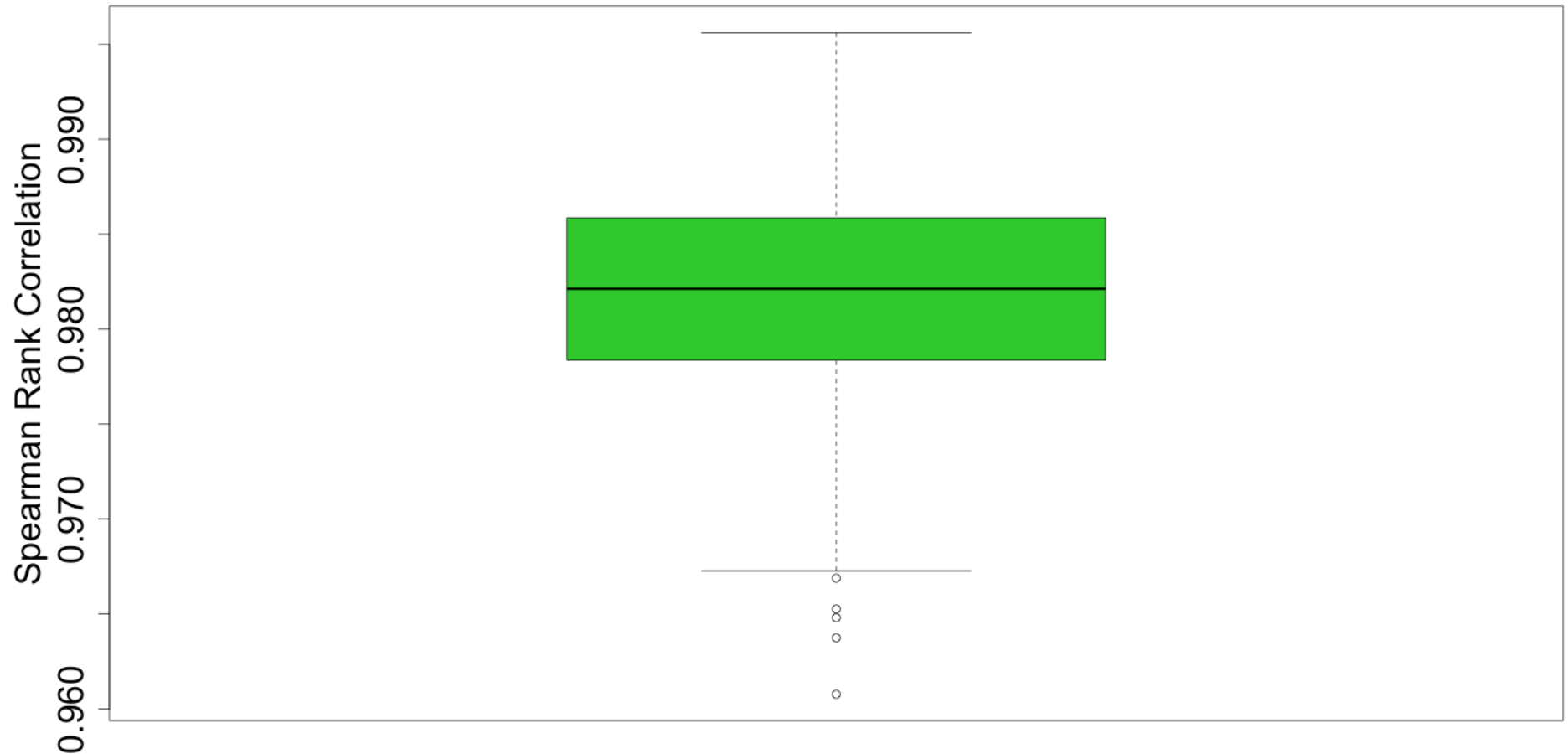


# MAP4K4 Activity Distribution



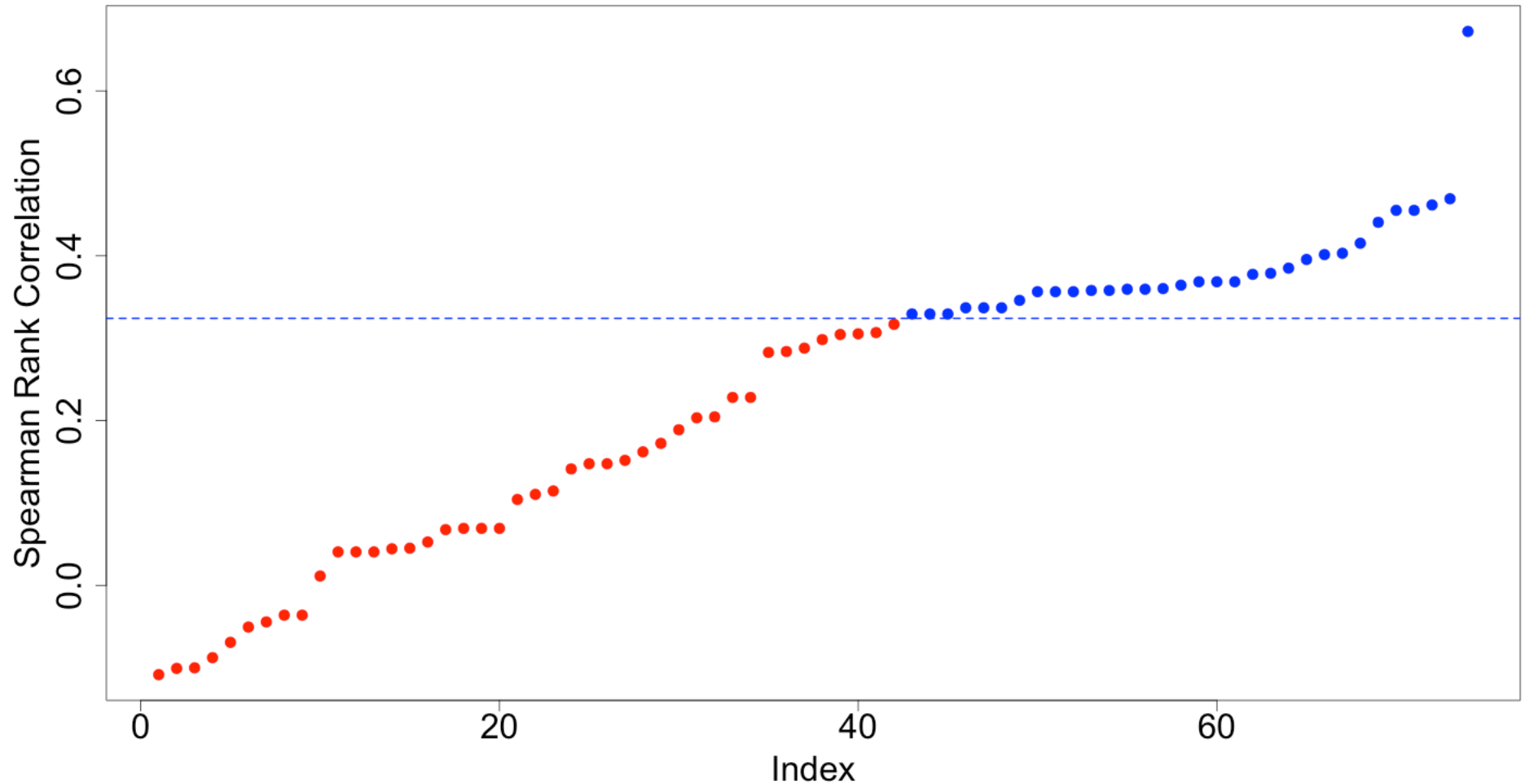
# Maximum Achievable Correlation for MAP4K4

Maximum Possible Correlation



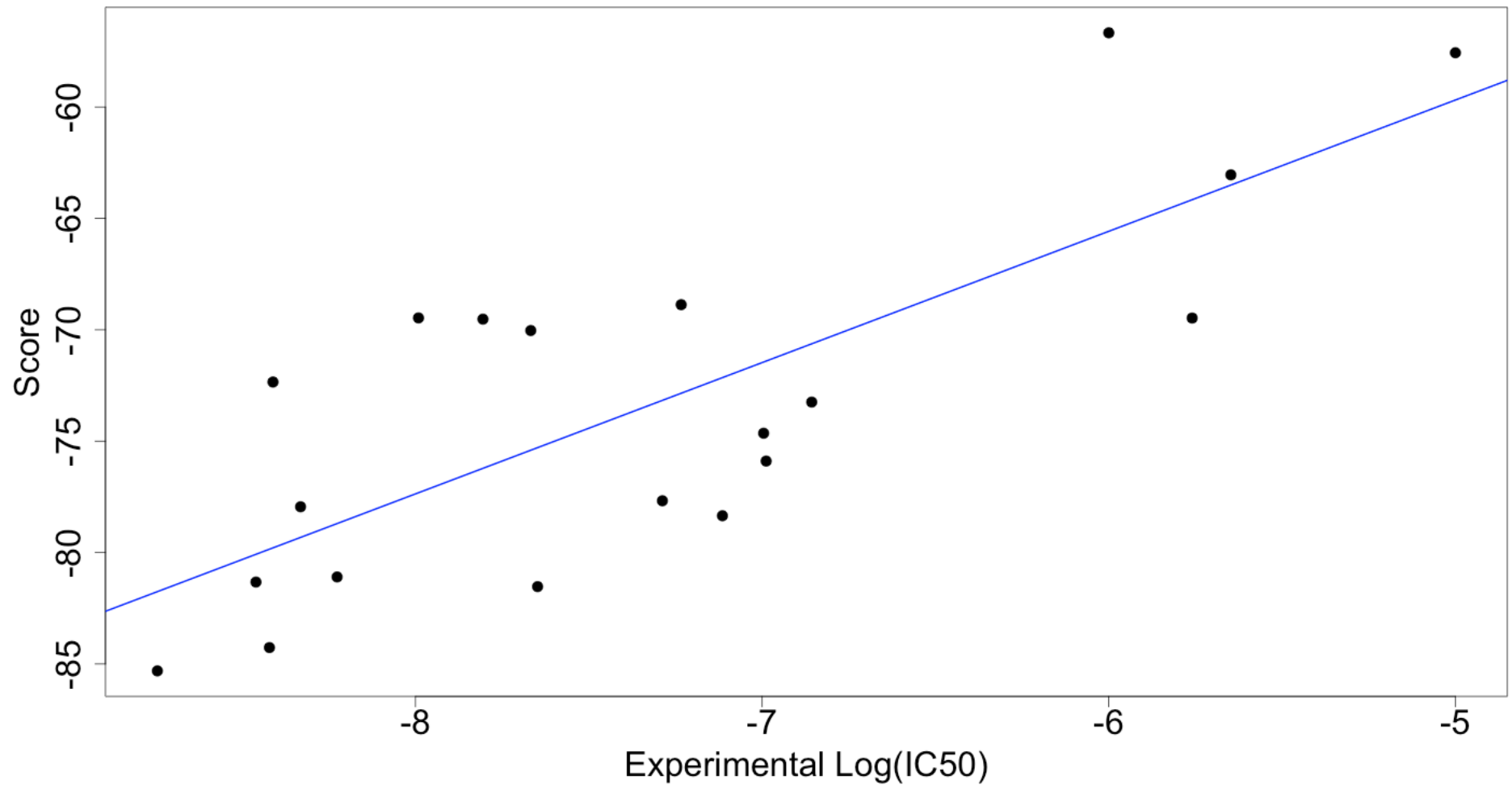
# Comparing MAP4K4 Stage1 Correlations

Top 32 Correlations Equivalent



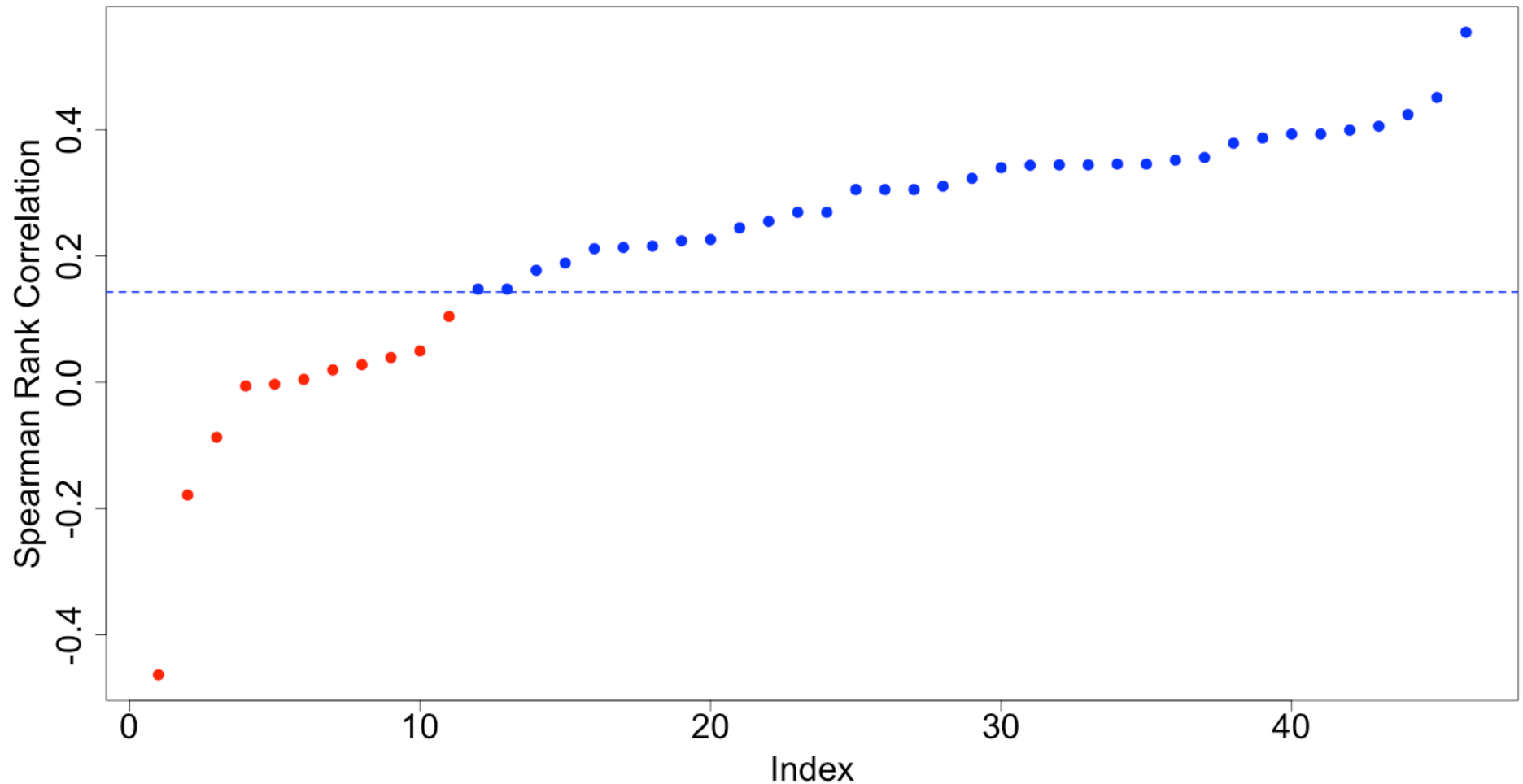
# Best MAP4K4 Stage 1 Correlation

Spearman Rank = 0.67



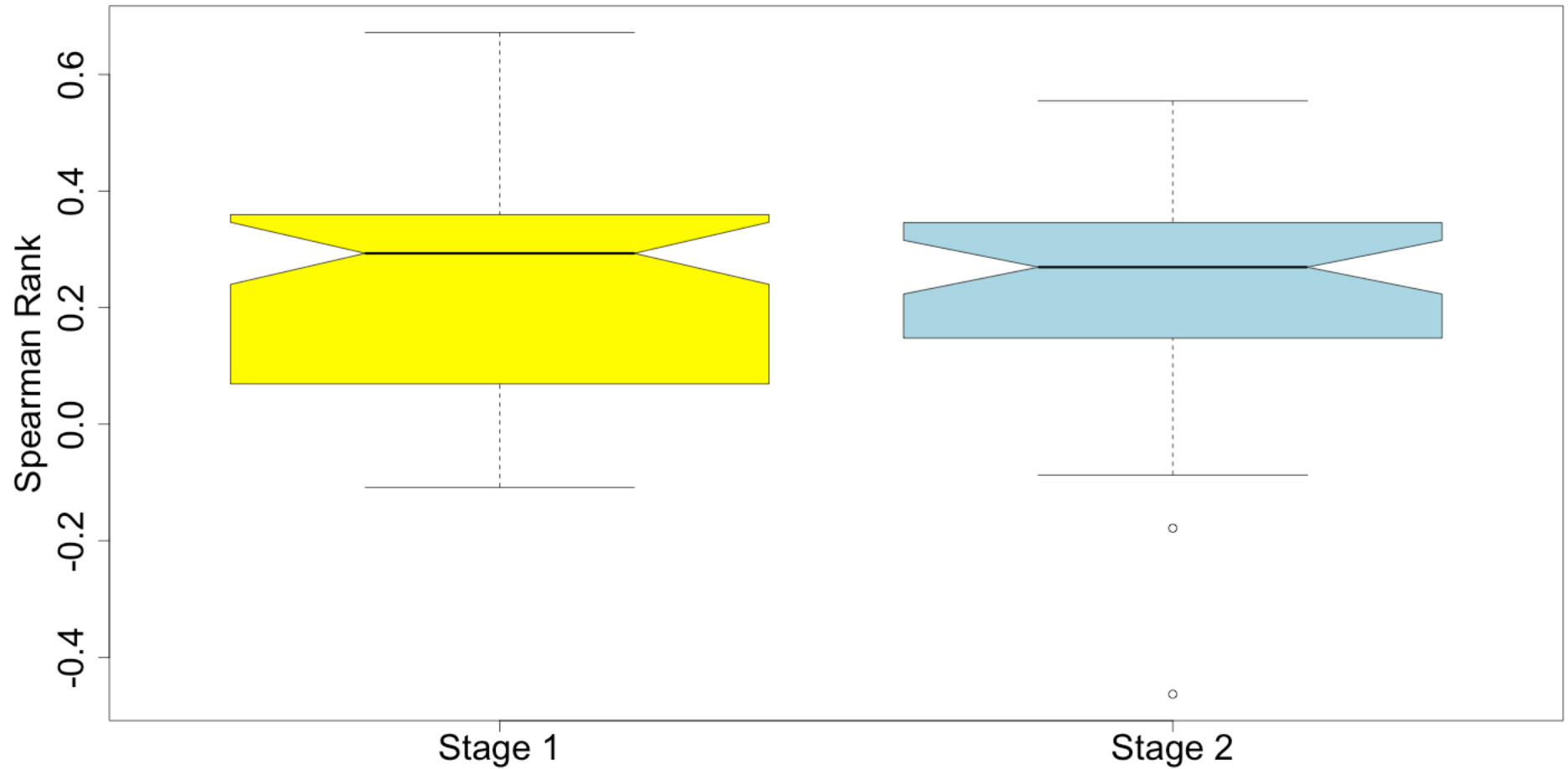
# Comparing MAP4K4 Stage2 Correlations

Top 52 Correlations Equivalent



# Similar Performance Between Stage 1 and Stage 2

MAP4K4 Correlations





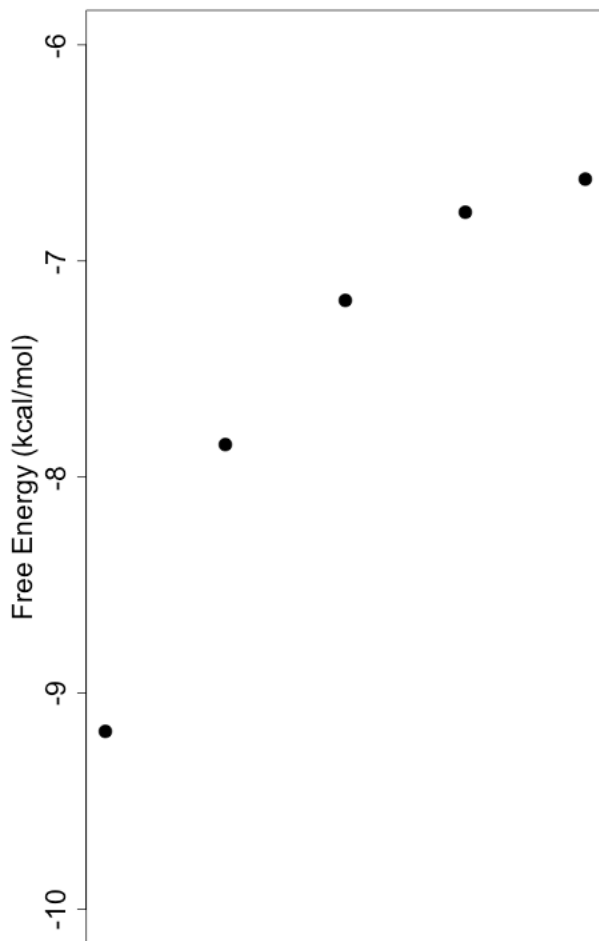
# FREE ENERGY

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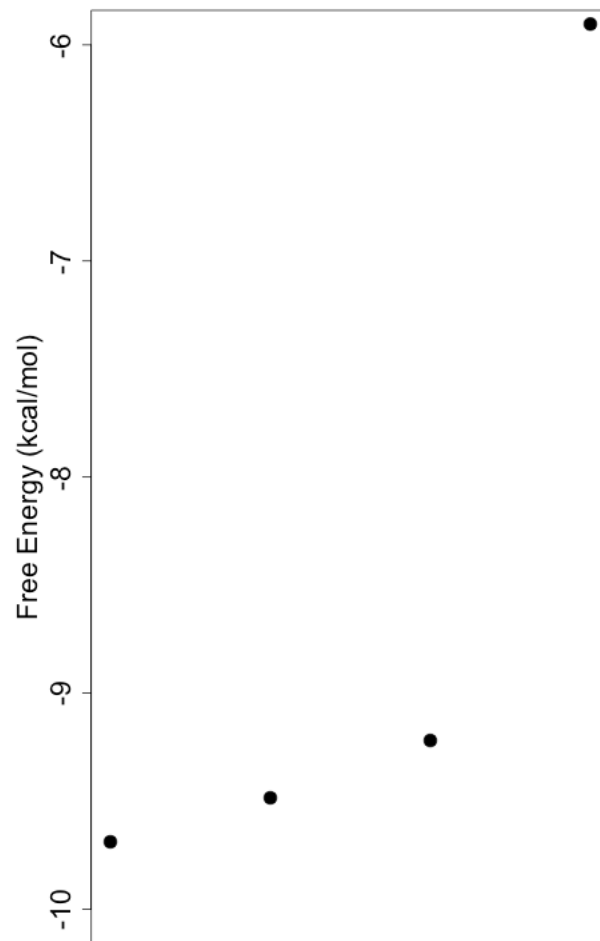


# Free Energy Distributions

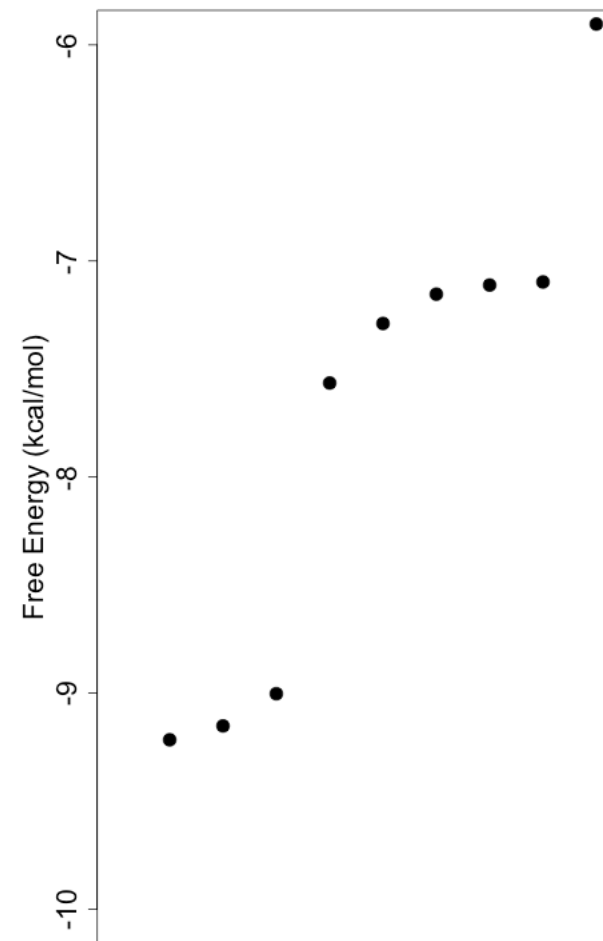
Set 1



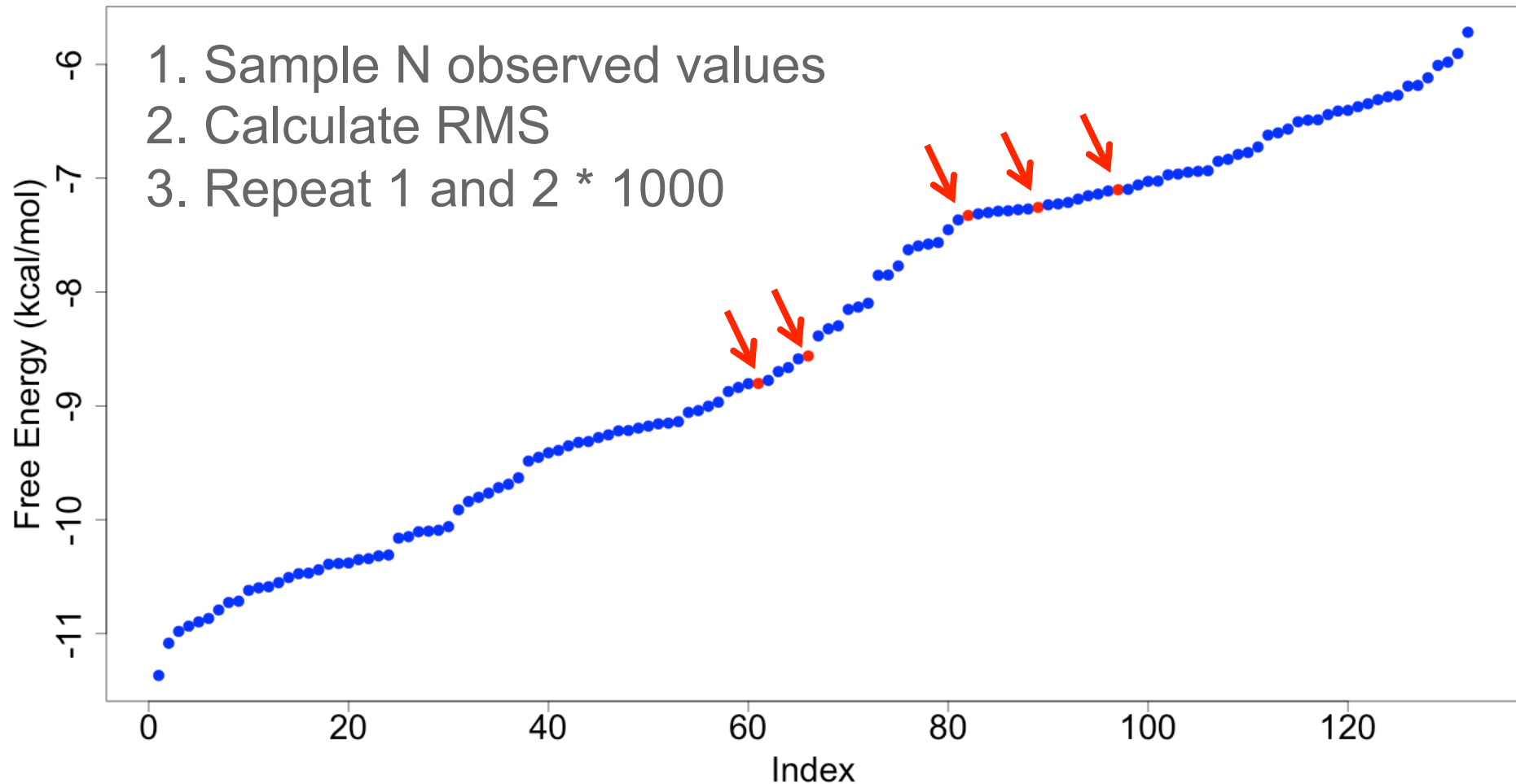
Set 2



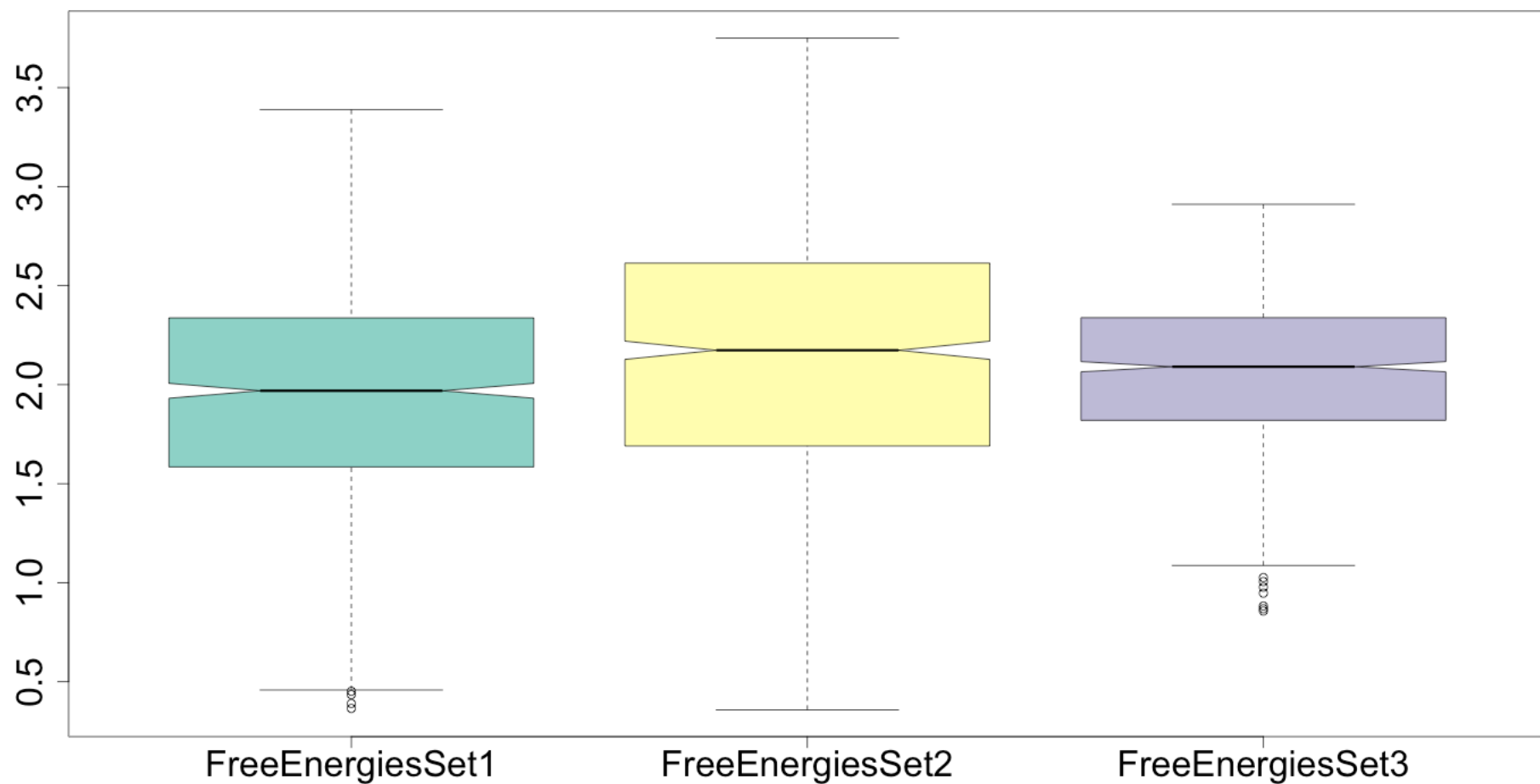
Set 3



# A Null Model for Free Energies?

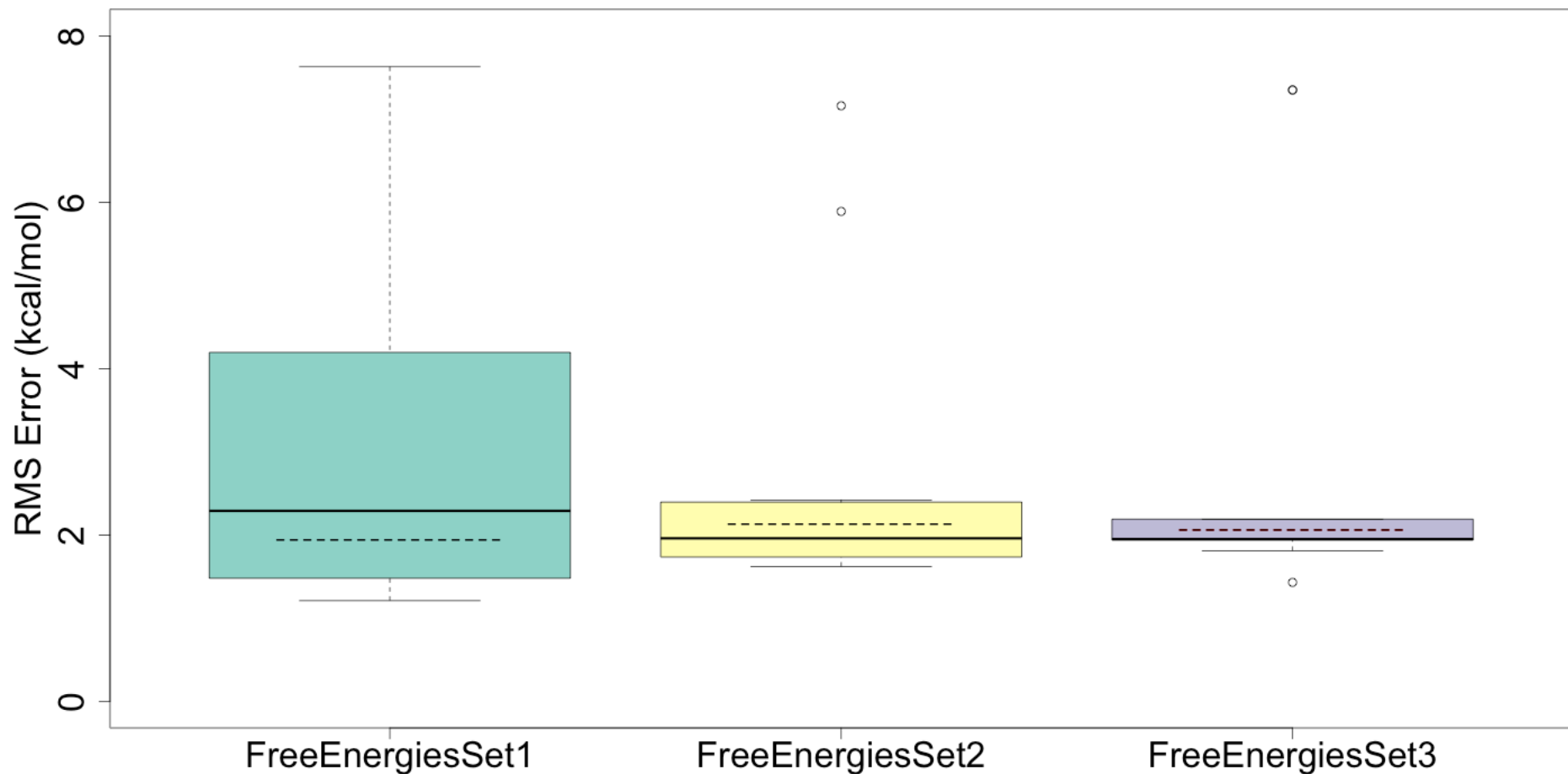


# A Null Model for Free Energy



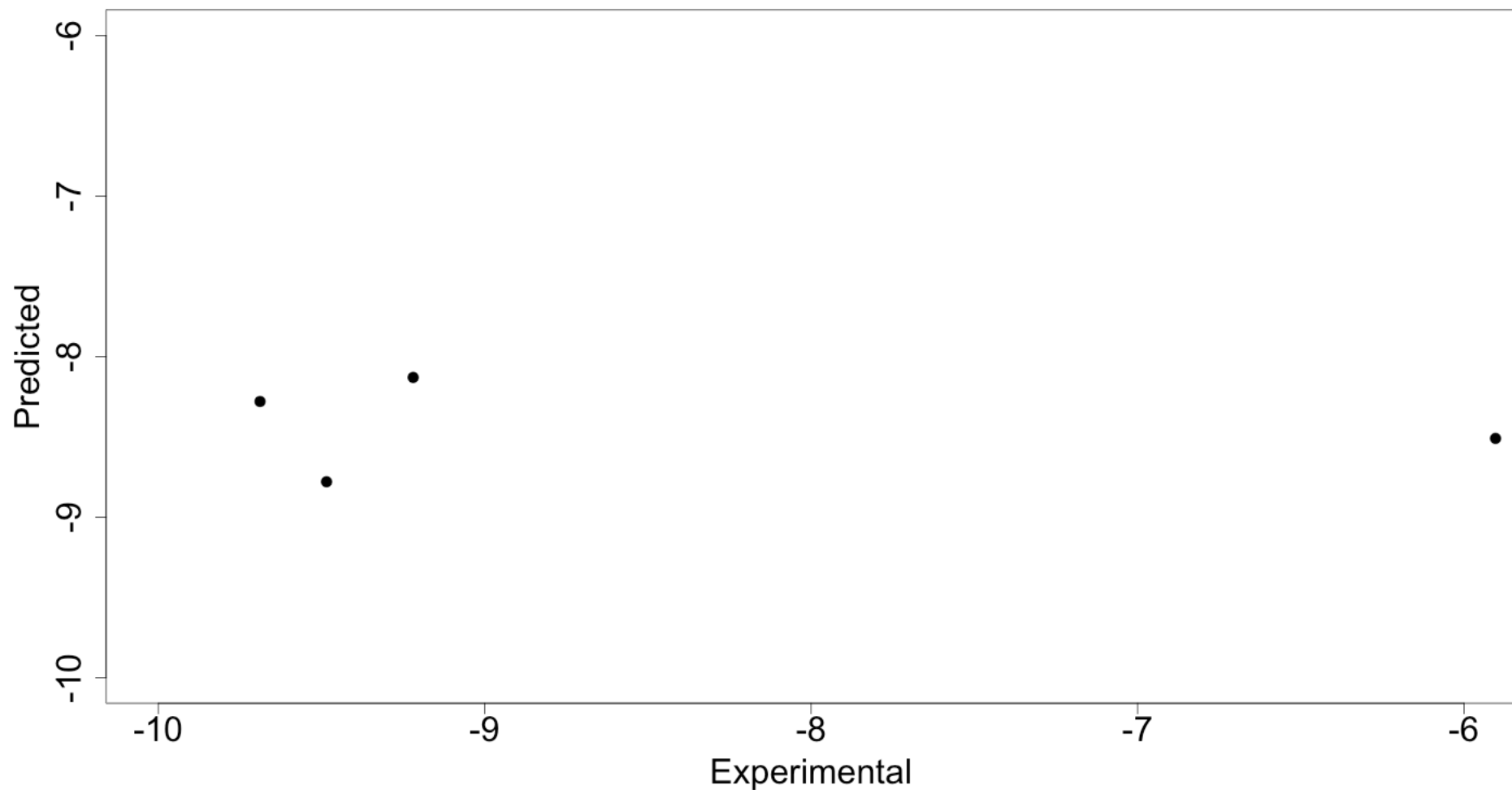
# Free Energy RMS Error

*Dashed line indicates the null model*



## Free Energy Set 2 - Lowest RMSE – Useful?

RMSE = 1.6 kcal/mol



# A Few Technical Issues

- PDB format makes RMS calculations difficult
- Score files were not formatted consistently
- Score files were not named consistently
- Free energy files were not named and formatted consistently



# Improperly Formatted PDB files

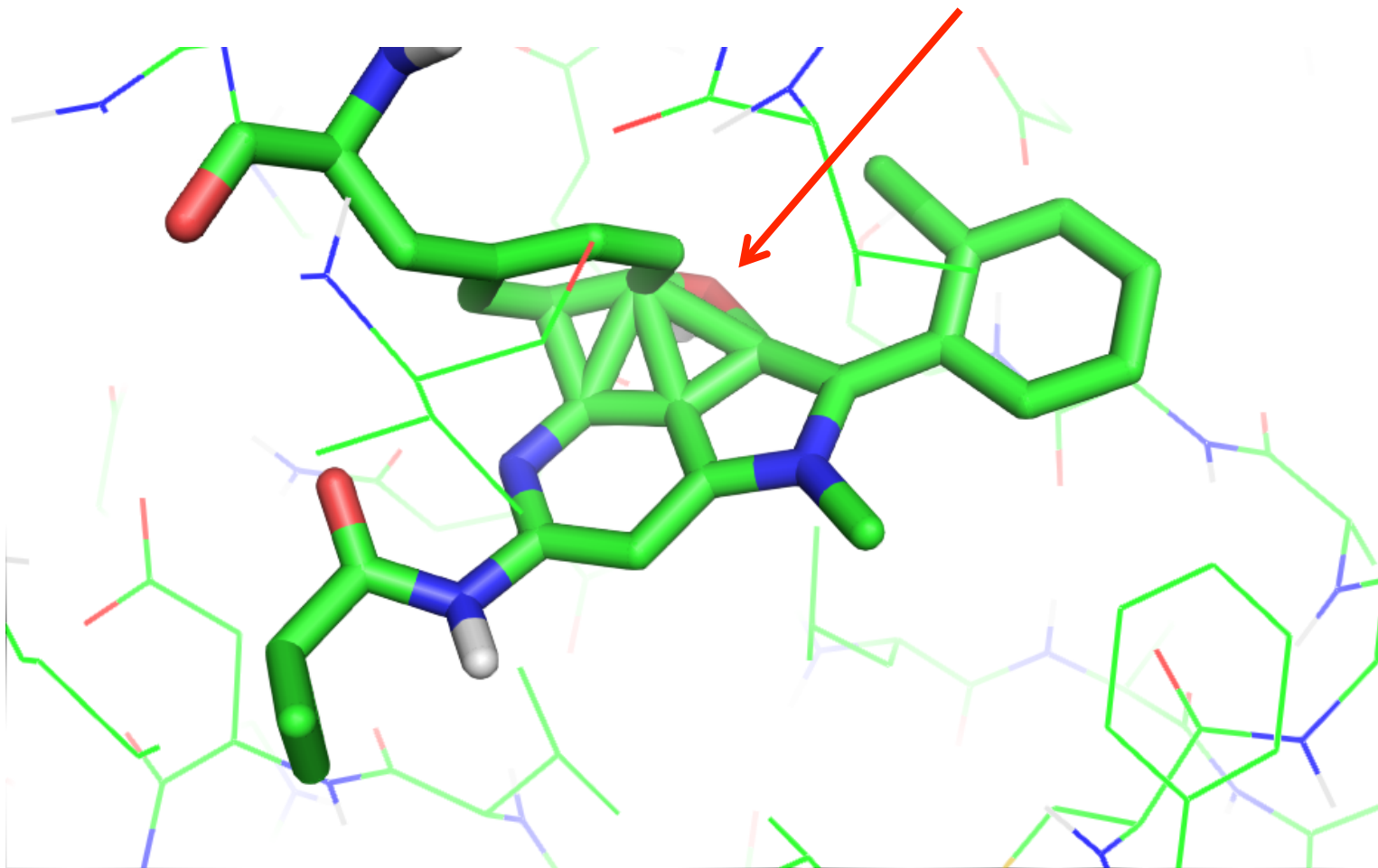
## *Incorrect*

ATOM	3273	C11	LIG	208	-1.480	8.493	28.087	1.00	0.00	SYST	C
ATOM	3274	C12	LIG	208	-1.030	7.703	27.066	1.00	0.00	SYST	C
ATOM	3275	C13	LIG	208	0.029	6.790	27.307	1.00	0.00	SYST	C
ATOM	3276	C11	LIG	208	0.896	11.872	24.337	1.00	0.00	SYST	C
ATOM	3277	H1	LIG	208	-5.162	10.808	25.309	1.00	0.00	SYST	H
ATOM	3278	H2	LIG	208	2.002	5.790	29.700	1.00	0.00	SYST	H

## *Correct*

HETATM	1645	CL	LIG	B	1	0.892	12.514	23.277	1.00	41.41	CL
HETATM	1646	C10	LIG	B	1	-0.672	11.835	23.662	1.00	36.86	C
HETATM	1647	C9	LIG	B	1	-0.816	11.109	24.823	1.00	35.88	C
HETATM	1648	H6	LIG	B	1	0.077	10.810	25.369	0.00	35.70	H
HETATM	1649	C11	LIG	B	1	-1.752	12.136	22.857	1.00	33.25	C
HETATM	1650	H7	LIG	B	1	-1.608	12.683	21.929	0.00	33.13	H
HETATM	1651	C12	LIG	B	1	-3.015	11.729	23.256	1.00	32.92	C

# Can't Infer Connectivity From Incorrect Geometry





# Conclusions

- As a community we are pretty good a pose prediction
- Unfortunately ranking and free energy have ways to go
- Hopefully we can all learn from these datasets
- Hopefully we will all share what we learn
- We need to make some improvements to the submission process
- The next round should be even better



# Acknowledgments

- Rommie Amaro
- Mike Gilson
- Vicki Feher
- Shuai Liu