



Rugby Match Predictions

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The Project

- Based on previous matches in a season, can we predict who will win a match between known opponents

Inspiration

- Dan Gillick, UC Berkeley PhD, Research Analyst at Google
- “How to Predict College Football Games”
 - Aimed to reduce minimum score difference between prediction and actual
 - week 1: x vs. y result: 21-3
 - week 2: y vs. z result: 15-18
 - week 3: x vs. z result: 10-42

$$[(Sx - Sy) - (21 - 3)]^2 + [(Sy - Sz) - (15 - 18)]^2 + [(Sx - Sz) - (10 - 42)]^2$$

Raw Data

- 5 seasons of matches played in the Aviva Premiership (England's top league)
- Gathered from espnscrum.com
- 23 columns, 660 games

Sale Sharks (6) 23 - 25 (22) Harlequins (FT)

Match coverage: Report

TIMELINE				TEAMS				
NOTES				MATCH STATS		SALE STATS	HQUIN STATS	OTHER SCORES
Time	Sale Sharks	Score	Harlequins	Sale Sharks		Harlequins		
0	start of first half		start of first half	3	Tries	4		
4		0 - 5	Walker - try	1 from 3	Conversion goals	1 from 4		
19	Cipriani - penalty goal	3 - 5		2 from 2	Penalty goals	1 from 1		
24		3 - 10	Robshaw - try	60.0%	Kick at goal success	40.0%		
25		3 - 12	Evans - conversion	0	Dropped goals	0		
27		3 - 17	Yarde - try	Kick/pass/run				
32	Cipriani - penalty goal	6 - 17		19	Kicks from hand	23		
35			Matthews - sub on Robson - sub off	157	Passes	185		
39		6 - 22	Care - try	115	Runs	140		
40+1	end of first half		end of first half	613	Metres run with ball	507		
40	start of second half		start of second half	Attacking				
43		6 - 25	Evans - penalty goal	43% (0%/100%)	Possession (1H/2H)	57% (100%/0%)		
49	Taylor - sub on			15	Clean breaks	7		
	Jones - sub off			21	Defenders beaten	20		
	Lewis-Roberts - sub off			11	Offloads	22		
	Harrison - sub on			77 from 82 (93.9%)	Rucks won	87 from 94 (92.6%)		
	Seymour - sub on			0 from 0	Mauls won	0 from 0		
	Ioane - sub off			17	Turnovers conceded	14		
	- sub off			Defensive				
50	Arscott - sub on		Marfo - sub on	136/20	Tackles made/missed	122/21		
51			Ward - yellow card	87.0%	Tackling success rate	85.0%		
52	Arscott - try	11 - 25		Set pieces				
53	Cipriani - conversion			7 won, 1 lost (87.5%)	Scrums on own feed	8 won, 1 lost (88.9%)		
	- sub off	13 - 25		12 won, 2 lost (85.7%)	Lineouts on own throw	10 won, 0 lost (100.0%)		
	Mills - sub on			Discipline				
54			Botica - sub on Evans - sub off	9	Penalties conceded	15		
55	Cusiter - sub off		Wallace - sub off	0/0	Yellow/red cards	1/0		
	Cliff - sub on		Buchanan - sub on					

Sale Sharks		Harlequins
3	Tries	4
1 from 3	Conversion goals	1 from 4
2 from 2	Penalty goals	1 from 1
60.0%	Kick at goal success	40.0%
0	Dropped goals	0
Kick/pass/run		
19	Kicks from hand	23
157	Passes	185
115	Runs	140
613	Metres run with ball	507
Attacking		
43% (0%/100%)	Possession (1H/2H)	57% (100%/0%)
15	Clean breaks	7
21	Defenders beaten	20
11	Offloads	22
77 from 82 (93.9%)	Rucks won	87 from 94 (92.6%)
0 from 0	Mauls won	0 from 0
17	Turnovers conceded	14
Defensive		
136/20	Tackles made/missed	122/21
87.0%	Tackling success rate	85.0%
Set pieces		
7 won, 1 lost (87.5%)	Scrums on own feed	8 won, 1 lost (88.9%)
12 won, 2 lost (85.7%)	Lineouts on own throw	10 won, 0 lost (100.0%)
Discipline		
9	Penalties conceded	15
0/0	Yellow/red cards	1/0

- Pretty messy tables here
 - # from #
 - won
 - lost
 - (%)
 - /
- Missing
 - Points, winner, point differential

Cleaning

- Tackles made/missed
 - 136/20
 - Split into 'tackles_made' and 'tackles_missed'
- Conversion goals
 - 1 from 3
 - Split into 'conversions_made' and 'conversions_missed'

Cleaning

- Mauls & Rucks
 - 1 from 2 (50.0%)
 - Split into mauls_started, mauls_won, and maul_success; rucks_started, rucks_won, and ruck_success
- Scrums & Lineouts
 - 7 won, 1 lost (87.5%)
 - Split into scrums_won, scrums_lost, scrum_success; lo_won, lo_lost, lo_success

Cleaning

- Penalties
 - 10 (1)
 - Split into penkicks and freekicks
- Penalty goals
 - 2 from 2
 - Split into pen_goals, pen_attempt
- Drop goals
 - Split into drop_goals, drop_missed
- Tries
 - Some of these had a note of (1 penalty try) that had to be removed

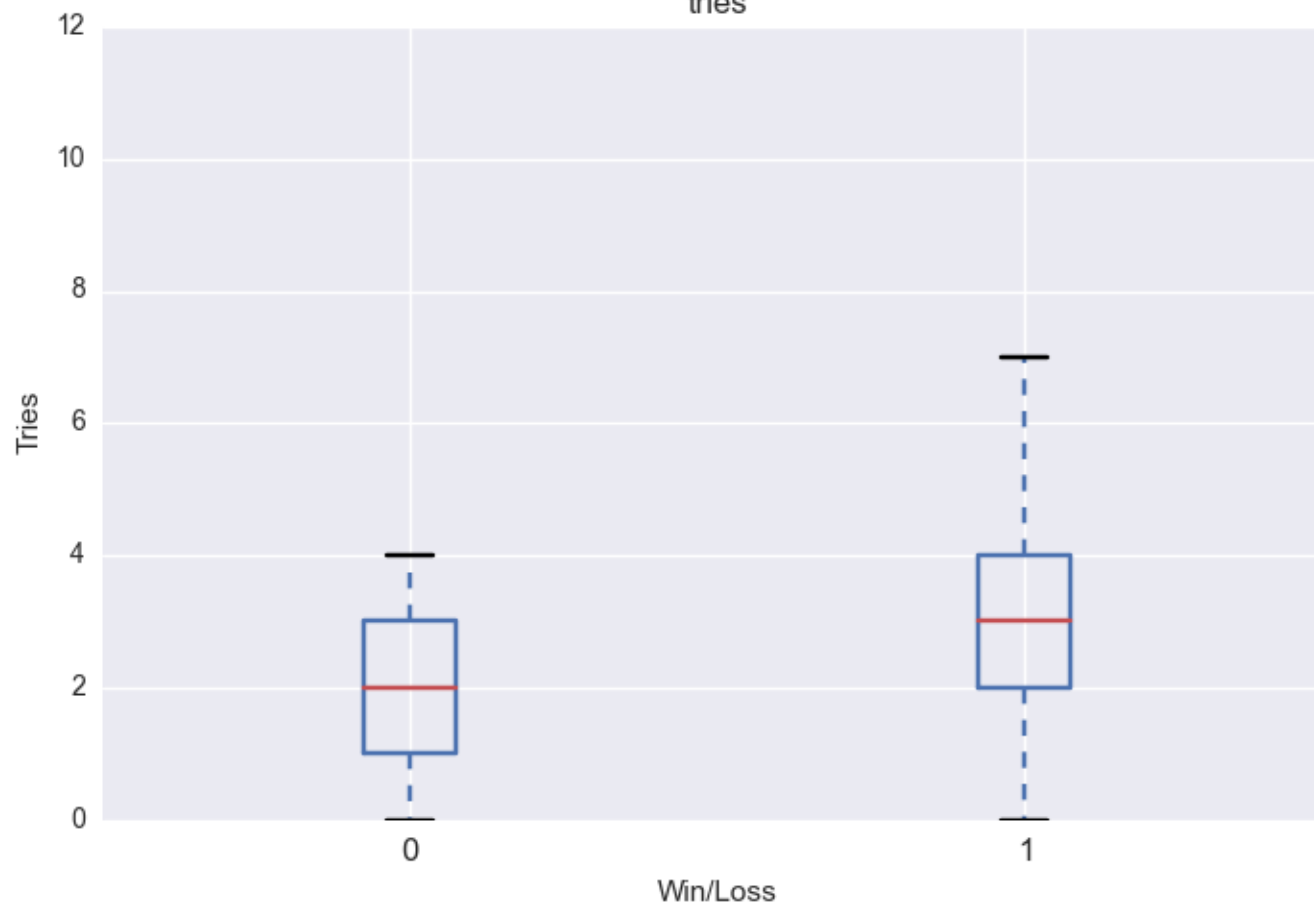
New Columns

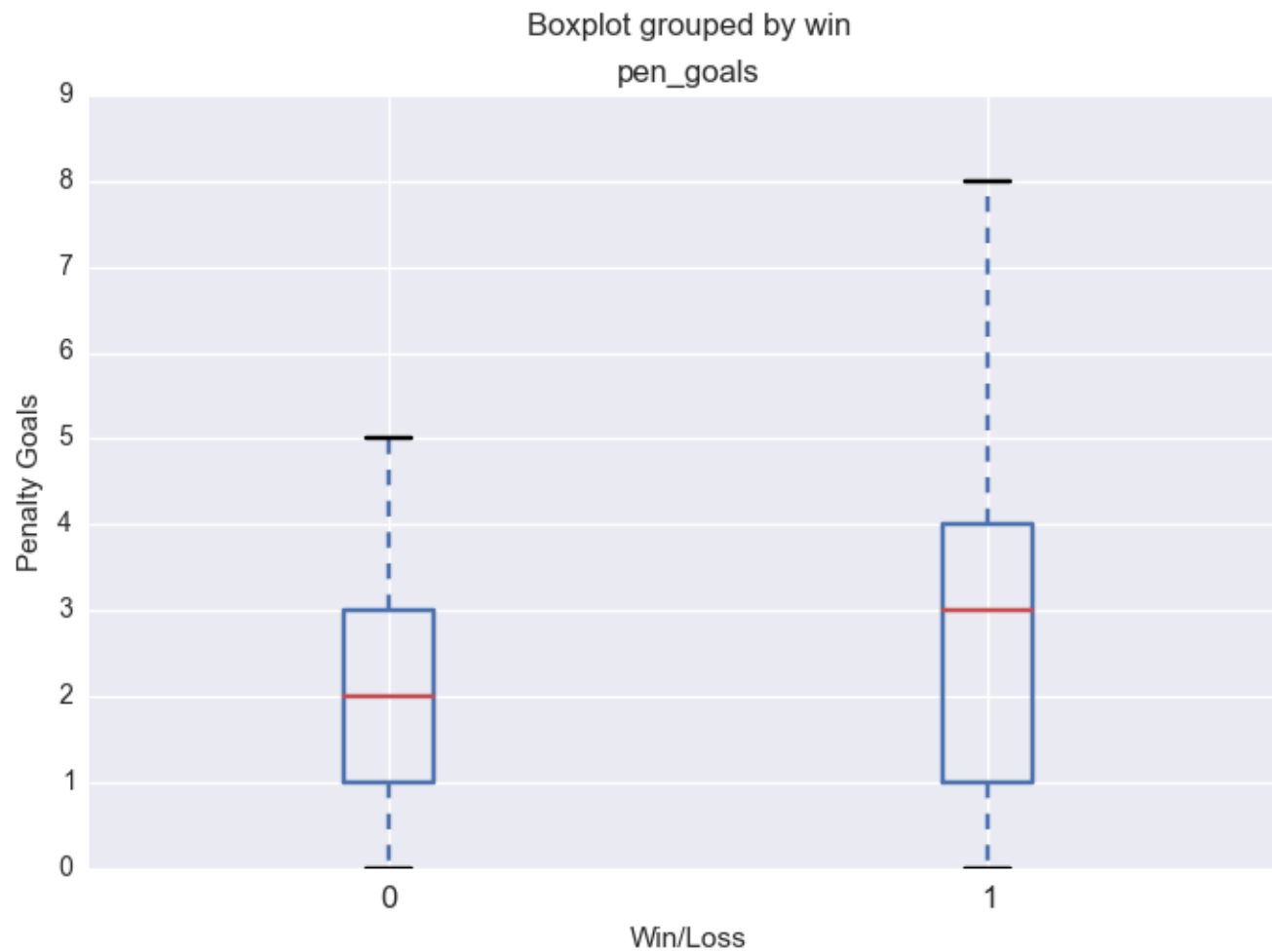
- points
 - Made up of new columns: try_points, pen_points, con_points
- meters_per_run
 - Made by dividing meters_run / runs
- point_diff
 - Should help show the 'strength' of a win
 - Still working on this

Visualizations

- Tons of variables to compare
- Do I want to predict Win T/F?

Boxplot grouped by win
tries



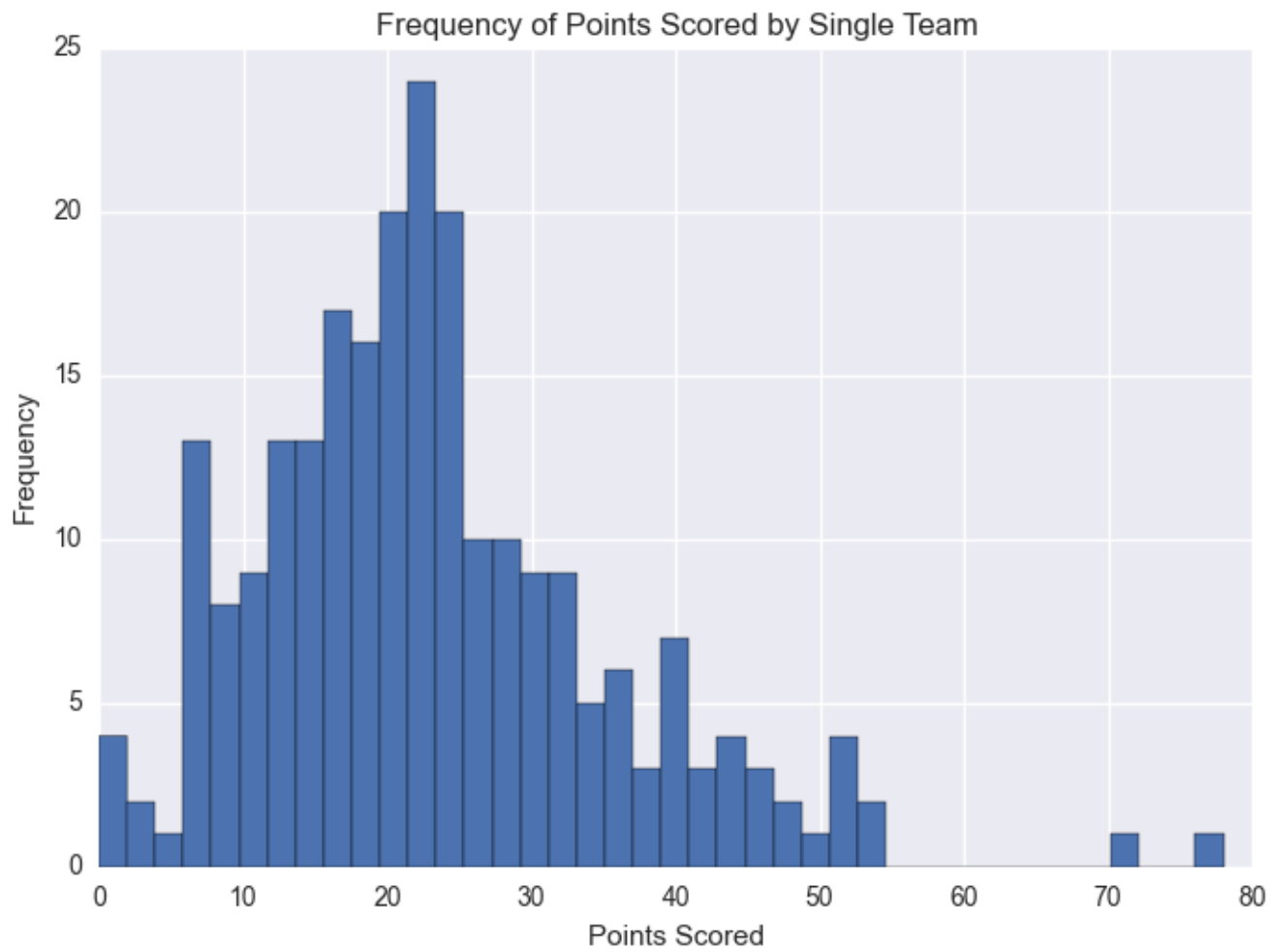


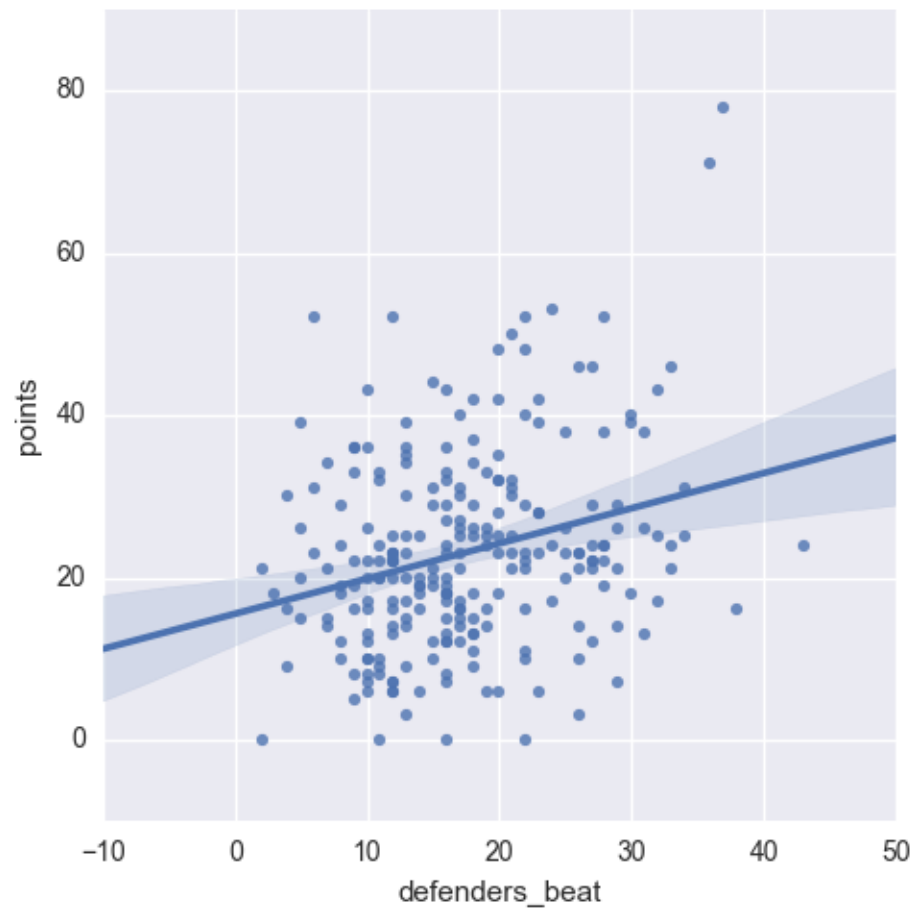
Visualizations

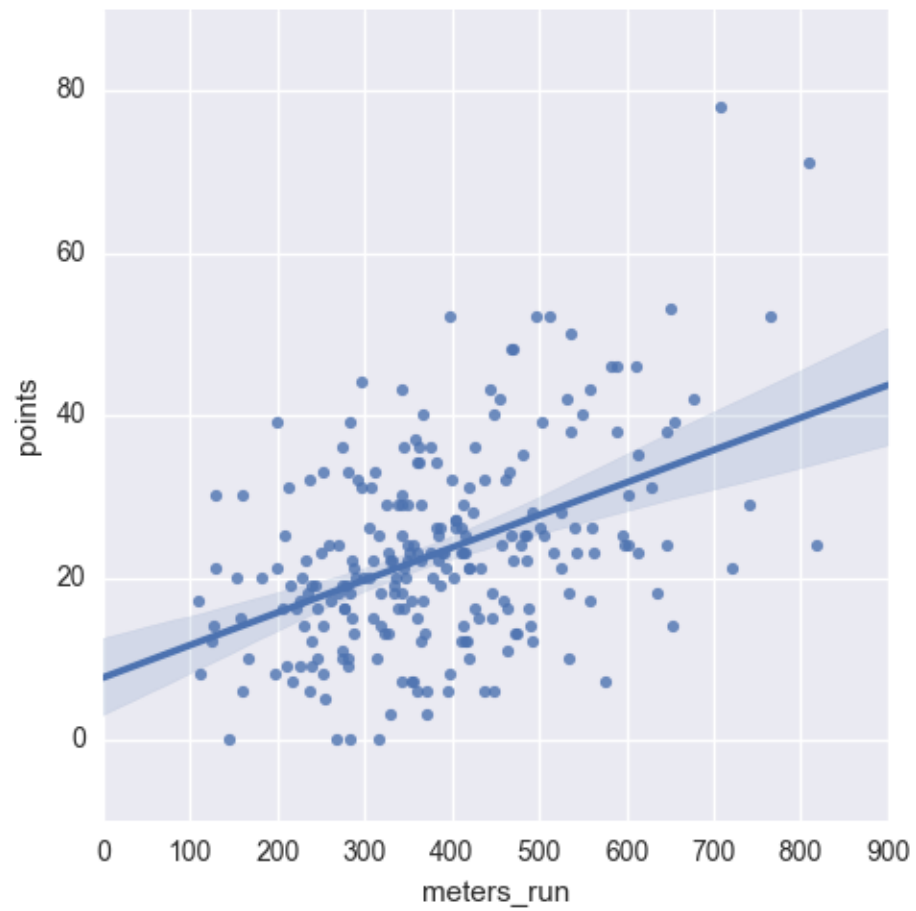
- Do I want to look at “team strength”?

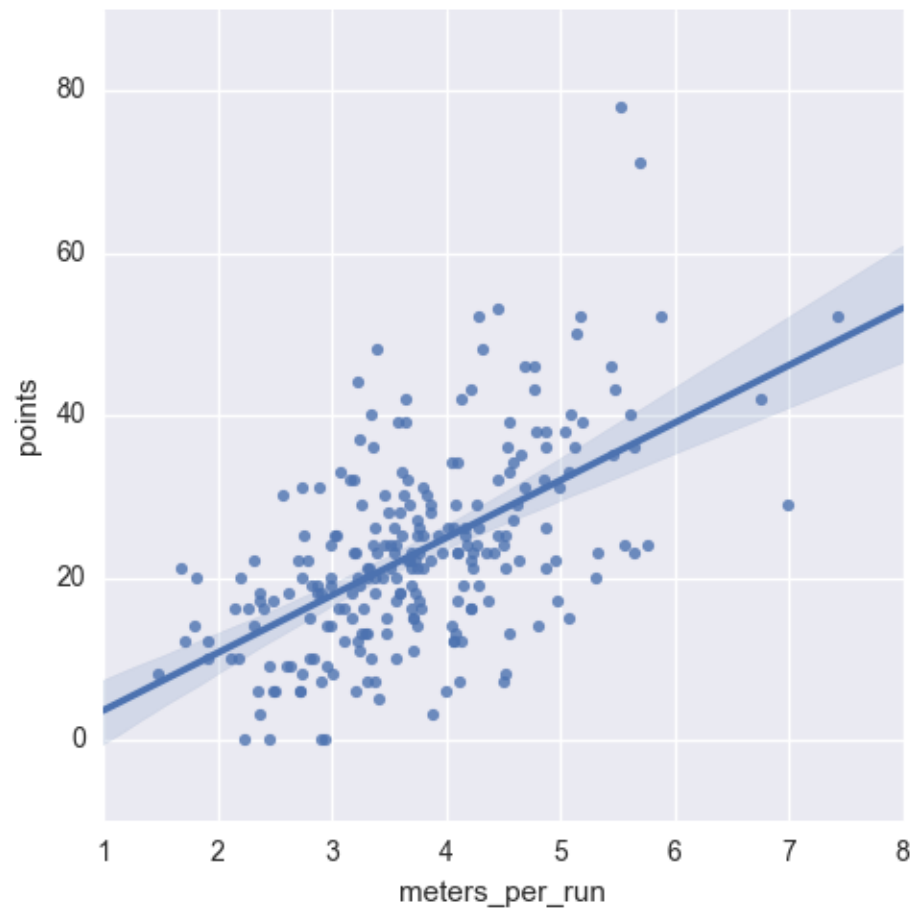
“Strength”

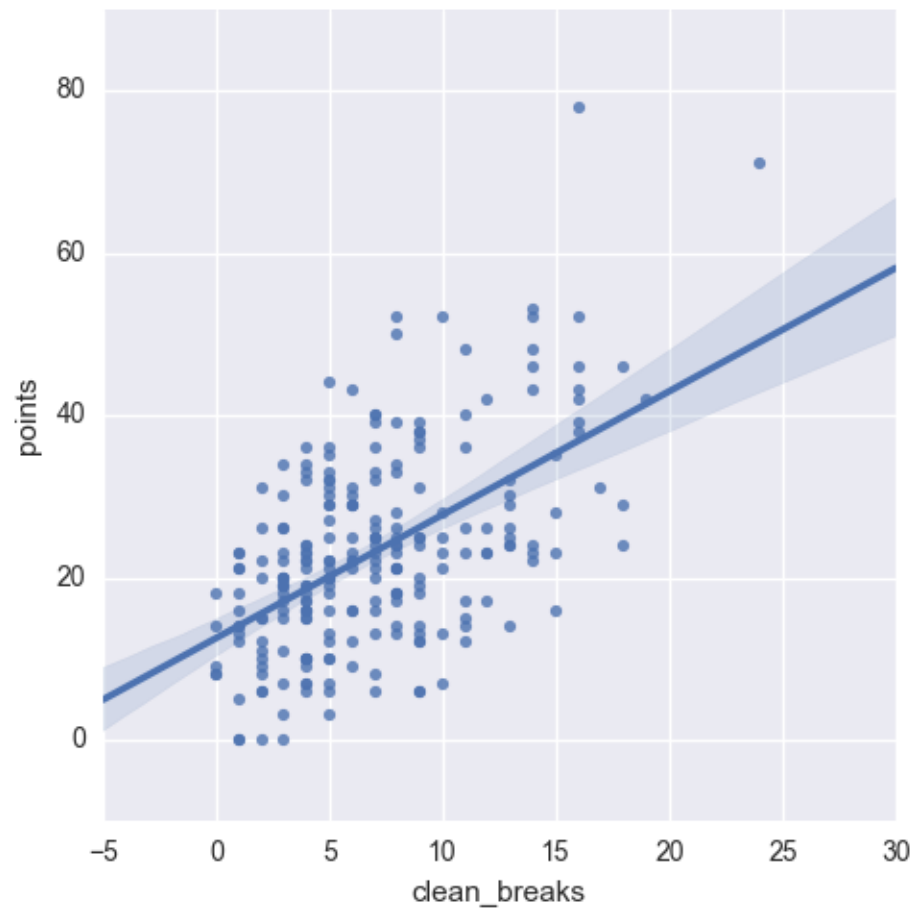
- This will simplify everything down to a single number, intended to predict the point dominance over opponent
- By comparing strengths, we can predict which of two teams will win











Where we're going

- “Strength” prediction model
 - Strength = point dominance over opponent
- Use results of first 8 games to predict game 9
 - Use results of first 9 games to predict game 10, and so on
 - Do this for all 5 seasons
- Compare this against using a blanket “win-loss” model
 - Team with more wins predicted to win