





Predicting Players' Salaries



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Objective



Salary Prediction

- Eye test versus advanced metrics.





Data Collection



Web Scrapping

Advanced

Share & more ▼ Glossary Hide Partial Rows

Rk	Player	Pos	Age	Tm	G	MP	PER	TS%	3PAr	FT%	ORB%	DRB%	TRB%	AST%	STL%	BLK%	TOV%	USG%	OWS	DWS	WS	WS/48	OBPM	DBPM	BPM	VORP
1	Tariq Abdul-Wahad	SG	25	TOT	61	1578	13.6	.477	.036	.299	7.0	13.1	10.0	10.0	1.8	1.2	12.7	22.5	0.4	1.8	2.2	.068	-1.6	0.1	-1.5	0.2
1	Tariq Abdul-Wahad	SG	25	ORL	46	1205	14.4	.484	.041	.293	7.0	14.6	10.8	9.7	2.2	0.9	13.0	23.3	0.4	1.6	2.0	.082	-1.3	0.4	-0.8	0.4
1	Tariq Abdul-Wahad	SG	25	DEN	15	373	10.8	.448	.015	.321	6.9	8.2	7.6	11.0	0.8	2.2	11.3	19.7	0.0	0.2	0.2	.023	-2.8	-1.0	-3.8	-0.2
2	Shareef Abdur-Rahim	SF	23	VAN	82	3223	20.2	.547	.075	.431	8.0	22.7	15.3	15.5	1.5	1.9	14.1	25.0	6.2	2.6	8.8	.132	1.8	0.5	2.3	3.5

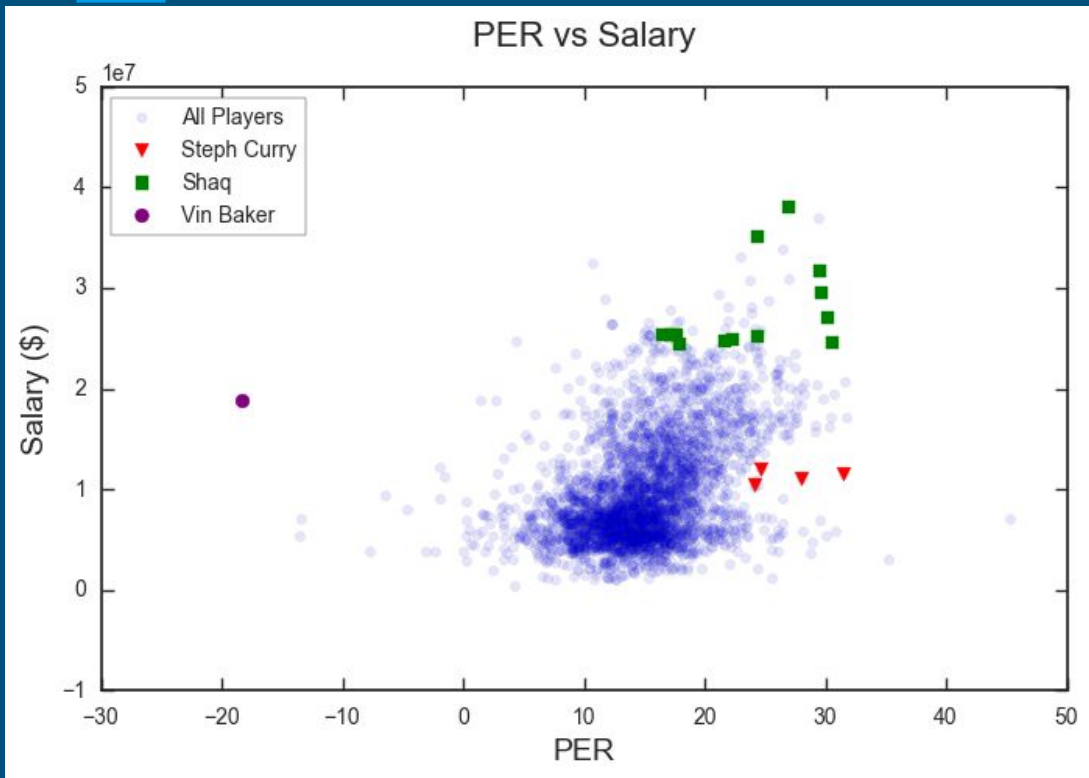
1999-2000 Player Salaries

RK	NAME	TEAM	SALARY
1	Shaquille O'Neal, C	Los Angeles Lakers	\$17,142,000
2	Kevin Garnett, PF	Minnesota Timberwolves	\$16,806,000
3	Alonzo Mourning, C	Miami Heat	\$15,004,000
4	Juwan Howard, PF	Washington Wizards	\$15,000,000
5	Scottie Pippen, SF	Portland Trail Blazers	\$14,795,000
6	Karl Malone, PF	Utah Jazz	\$14,000,000
7	Larry Johnson, F	New York Knicks	\$11,910,000
8	Gary Payton, PG	Seattle SuperSonics	\$11,020,000
9	Rasheed Wallace, PF	Portland Trail Blazers	\$10,800,000
10	Shawn Kemp, C	Cleveland Cavaliers	\$10,780,000



Merge into one
dataframe

Preliminary Feature Selection



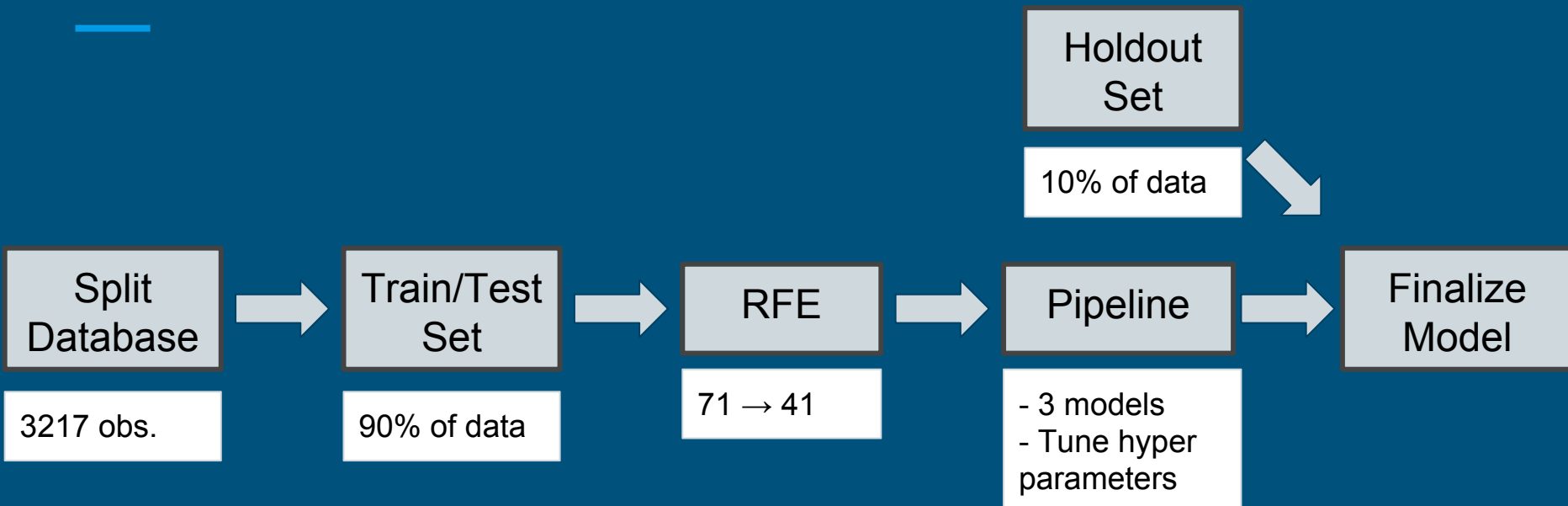
- **Outliers!**
- Vin Baker makes more money than Steph Curry?



Modeling



Approach

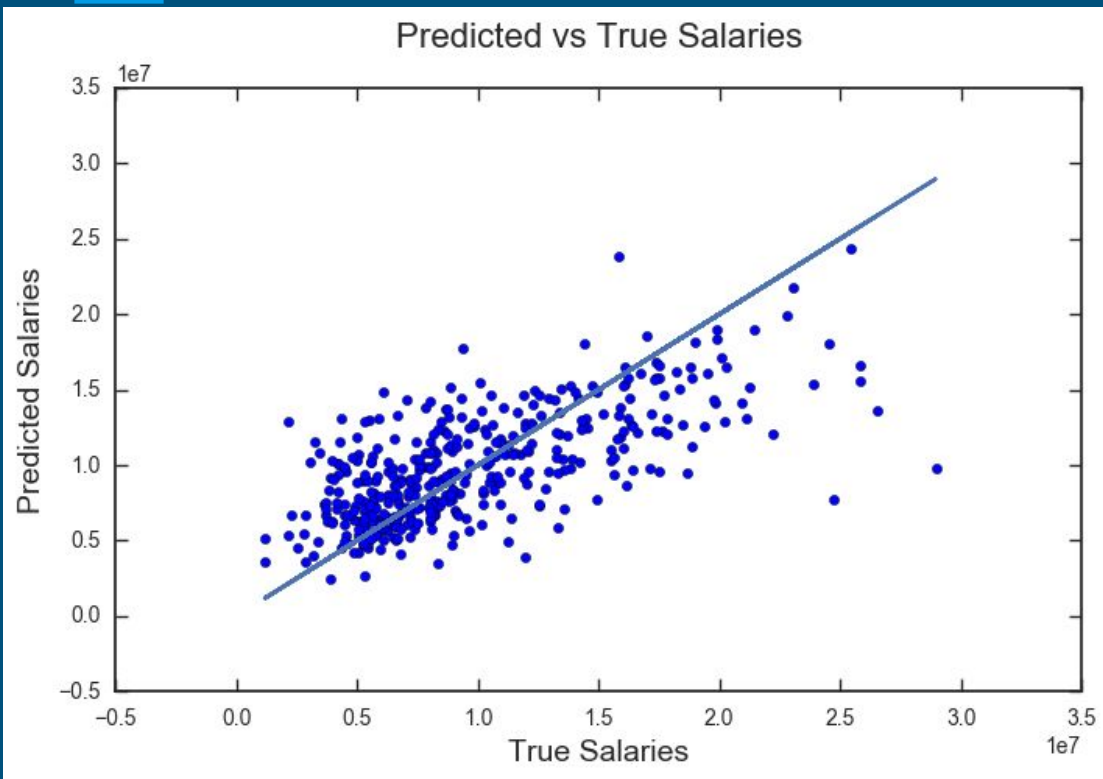


Model Scores

<u>Model:</u>	<u>Score:</u>
Lasso	0.433
Random Forest	0.369
Gradient Boost	0.465

Gradient Boost Regressor performed the best!

Gradient Boost Performance



Score = 0.465

Hyper Parameters:

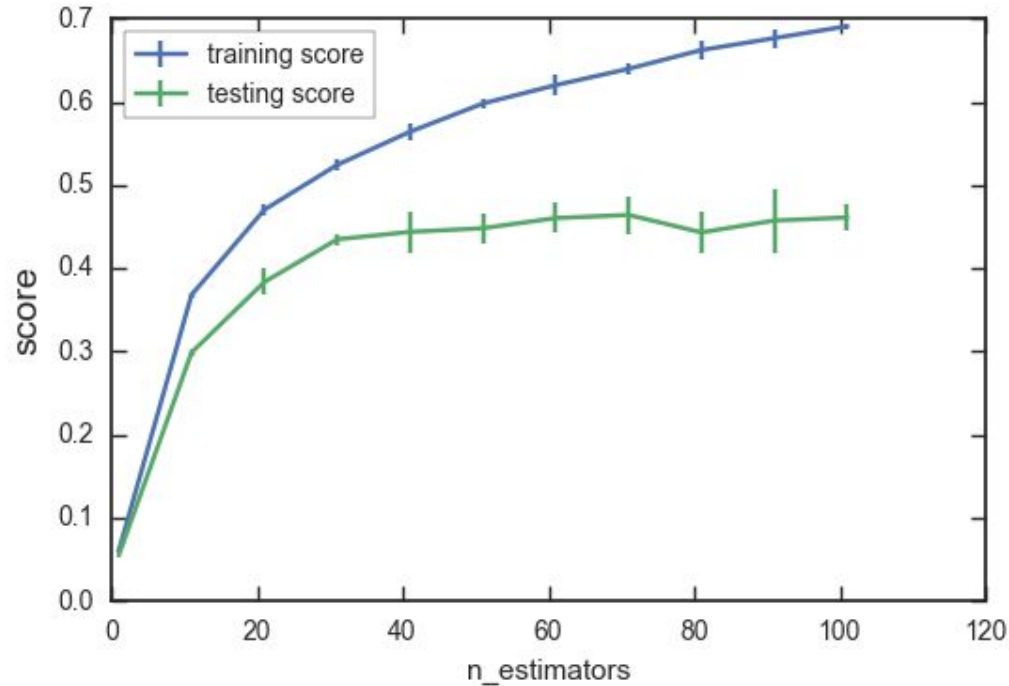
- *min_samples_split* = 20
- *max_depth* = 5
- *max_features* = 'sqrt'
- *n_estimators* = 100

Features:

- Age, PF, USG%, AST%

N_Estimators (GB)

n_estimators tuning





Future Works



Additional Items

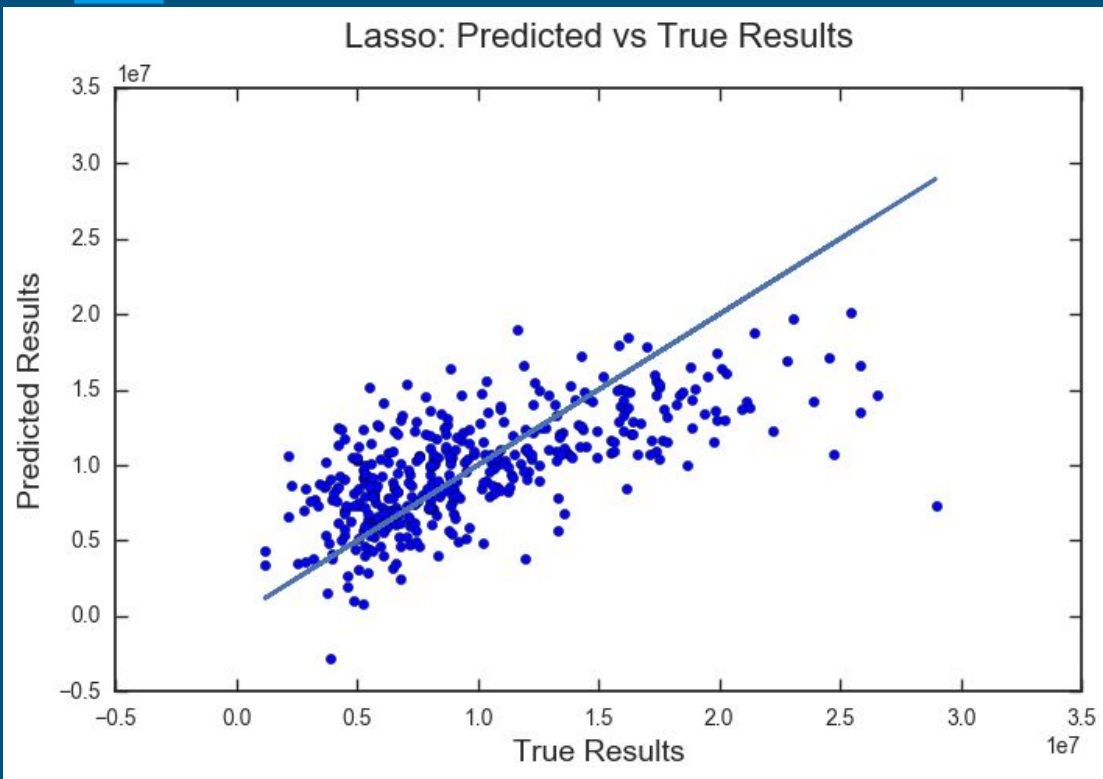
1. Continue feature engineering
2. Research other data sources to gain additional observations
3. Try more advanced models



Appendix



Lasso Performance

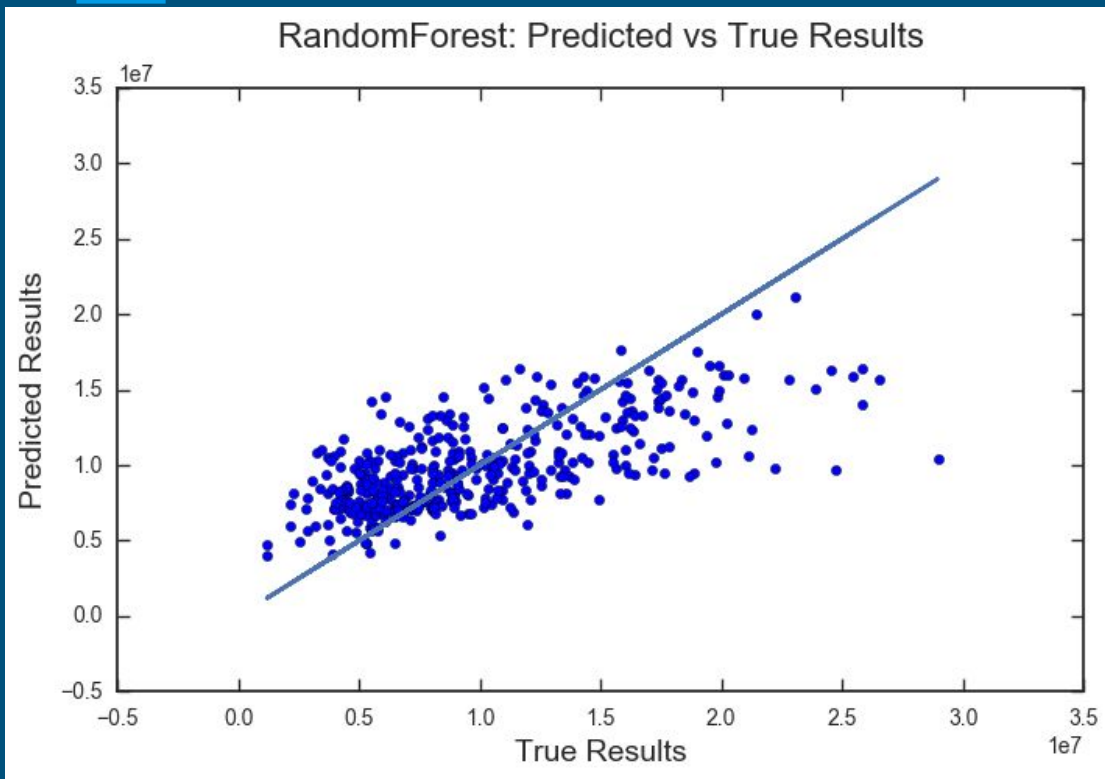


Score = 0.433

Hyper Parameters:

- $\alpha = 100$

Random Forest Performance



Score = 0.369

Hyper Parameters:

- min_samples_split = 5
- max_depth = 5
- max_features = 'auto'
- n_estimators = 300

Gradient Boosting Features

```
[ (0.039979288201189275, 'AST%'),
  (0.034430834077222035, 'PF'),
  (0.03269383653901576, 'Age_cube'),
  (0.030205956306421169, 'FGA'),
  (0.029652310877804493, 'USG%'),
  (0.02957027807958075, 'BLK%'),
  (0.029388523589018594, 'Age'),
  (0.029101000300381846, 'TOV%'),
  (0.028110336549877175, 'DRB%'),
  (0.027743156826659378, 'FG'),
  (0.027681541879088792, 'BPM'),
  (0.027285327422077968, 'MP'),
  (0.026464547758716619, 'FG%'),
  (0.026423264635552043, 'DRB'),
  (0.02630417727828049, 'USG%_sq'),
  (0.02627463138497501, 'AST'),
  (0.025771241214545899, 'WS/48'),
  (0.025737486040819848, 'ORB%'),
  (0.025582074786042165, 'ORB'),
  (0.025436920757196144, '2PA'),
  (0.025210471898029149, 'PER'),
  (0.0240735454101354, '3PAr'),
  (0.023922390005604567, 'FT'),
  (0.02330981074539569, 'FTA'),
  (0.022759560808408495, 'PER_sq'),
  (0.022472003945057332, 'DBPM'),
  (0.022354467928711642, 'OWS'),
  (0.022068454392837111, 'G_sq'),
  (0.021581501886616498, 'TRB%'),
  (0.021188718958678125, '2P'),
  (0.020696583701643682, 'GS'),
  (0.02026503876609427, 'FTr'),
  (0.020185112752095669, '2P%'),
  (0.019390513515883386, 'G_cube'),
  (0.019249563510110625, 'GS_sq'),
  (0.018436926568250019, '3PA'),
  (0.018094805218174755, 'OBPM'),
  (0.017953431851572749, '3P%'),
  (0.01637450631553275, 'FT%'),
  (0.013738415910571662, 'TS%'),
  (0.012837441406130955, 'eFG%')] ]
```

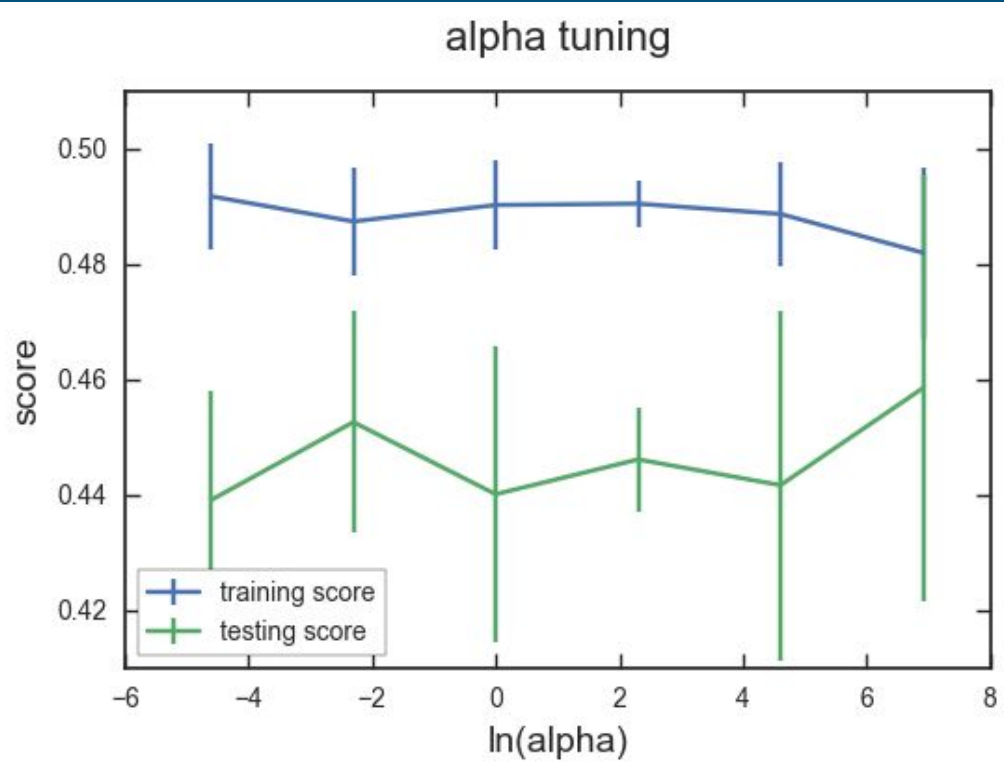
Random Forest Features

```
[ (0.21915235461482402, 'PER_sq'),
  (0.077377427094435097, 'Age_cube'),
  (0.074530022580351865, 'PER'),
  (0.073192445744582807, 'Age'),
  (0.072213724124162035, 'Age_sq'),
  (0.061163557920318919, 'USG%'),
  (0.058723019302410473, 'USG%_cube'),
  (0.046612430865444344, 'USG%_sq'),
  (0.041440574263541467, 'GS_sq'),
  (0.041292793464155784, 'GS'),
  (0.015446957957005712, '2P'),
  (0.015266474351825083, 'DRB%'),
  (0.014762796307324084, 'DRB'),
  (0.012752097753354423, 'DBPM'),
  (0.01086019809678147, 'FTA'),
  (0.010249971062386643, 'FG'),
  (0.0083056726266983426, '2P%'),
  (0.0061821467492086859, 'ORB'),
  (0.0059869100775622871, 'BLK'),
  (0.0053197784595053373, 'BLK/TRB'),
  (0.0048570375810426695, 'PTS'),
  (0.0046551494113846676, 'eFG%'),
  (0.0045737118879394679, 'PF'),
  (0.0045428038314191824, 'FG%'),
  (0.0043683383012614761, '2PA'),
  (0.0042526993208324964, 'WS/48'),
  (0.0041993980405974083, 'TRB%'),
  (0.0041785641064511388, 'FT%'),
  (0.0041639404033720828, 'WS/OVS'),
  (0.0040390172057284783, 'STL/AST'),
  (0.0040327966761899313, 'WS'),
  (0.0040279164362791052, 'FTr'),
  (0.003995060604004062, 'STL/TOV'),
  (0.0038356782518835825, 'BLK%'),
  (0.0037321619726945312, 'AST%'),
  (0.0037145982240704999, 'TRB'),
  (0.0035192936503895232, 'VORP'),
  (0.0035047935900841794, 'BPM'),
  (0.003344213892163511, 'DWS'),
  (0.0030674102005504161, 'AST/TOV'),
  (0.0030642881057164834, 'OWS') ]
```

Lasso Features

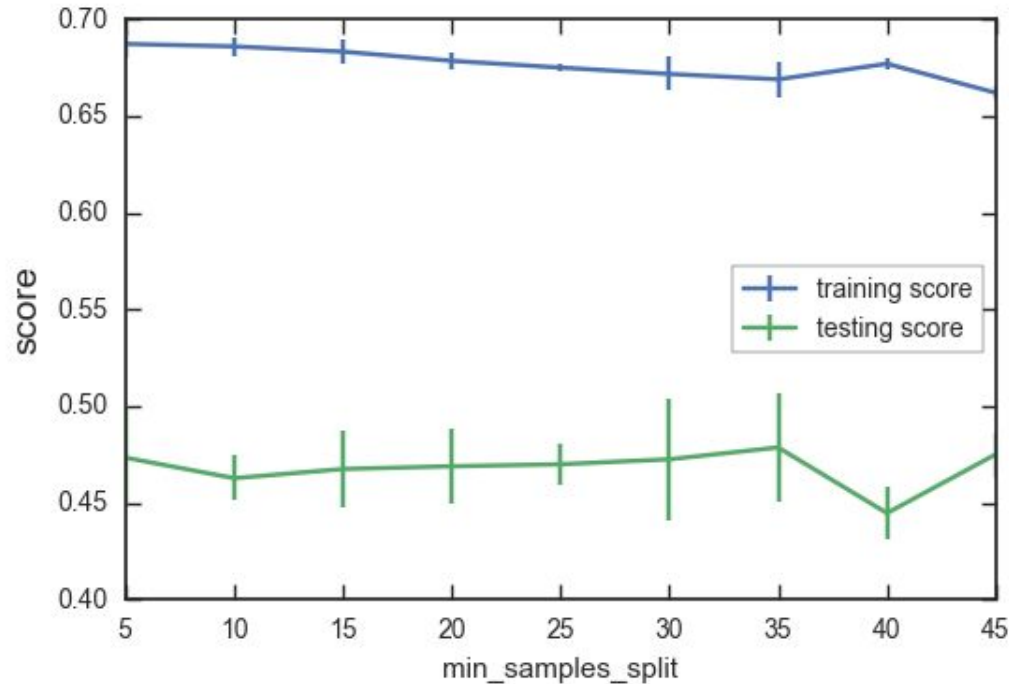
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[ (20809637.504010659, 'WS/48'),
  (4334278.801074787, 'WS/PER'),
  (3120097.2331944867, '3PAr'),
  (2764710.0896681128, 'FTr'),
  (2507781.2391417096, 'OWS/PER'),
  (2207568.7163218916, 'FG'),
  (1972058.4062925798, '2P'),
  (1853437.4721244236, 'TS'),
  (1607382.3668013043, 'Age'),
  (1276023.4507610183, 'TRB'),
  (953750.13401092729, 'DWS'),
  (921270.92150262278, 'STL'),
  (815237.27855895984, 'ORB'),
  (811037.81779628713, 'VORP'),
  (758613.42186131305, 'BPM'),
  (495054.41241291654, 'DRB'),
  (470071.99158422532, 'AST/TOV'),
  (464267.56190868397, 'OWS'),
  (437495.92518800939, 'Pos_PF'),
  (210418.3154952332, 'Pos_SG'),
  (192206.51616339243, 'WS'),
  (164279.412235503, 'BLK'),
  (119857.03346106537, 'PER'),
  (108920.78653531287, 'TOV_rk'),
  (102982.36834964711, 'PTS_rk'),
  (95680.679220600257, 'STL/TOV'),
  (76911.217136375781, 'G'),
  (75089.422737606175, 'USG'),
  (65938.969619748255, 'OBPM'),
  (65712.522192984514, 'BLK_rk'),
  (58244.034015487865, 'PTS/TOV'),
  (46010.286815258725, 'AST'),
  (45733.499460716477, 'MP_rk'),
  (33291.383126448854, 'DBPM'),
  (31492.089097692755, 'TRB_rk'),
  (26820.173146698609, 'GS'),
  (24772.558260432157, 'STL_rk'),
  (15520.243275691148, 'USG_sq'),
  (15247.170229498362, '3P'),
  (13524.328365056637, 'FG'),
  (13522.136851627827, '2P'),
```

Alpha Tuning (Lasso)



Min Samples Split (GB)

min_samples_split tuning



Max Features (GB)

max_features tuning

