

# Rise of the 3-Point Shot in the NBA

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# Problem Statement...

The popularity and usage of the 3 point shot has risen substantially in the NBA in the last 10+ years due in large part to higher reliance on analytics. The goal of my project is to see if this trend is accurate. Are 3 point shots more representative for success than 2 point shots? Are teams that attempt more 3 point shots than others more successful?





# Data Collection –

1. The library ``basketball_reference_webscraper`` for player statistics from [basketball-reference.com](https://basketball-reference.com)
2. The library ``selenium`` for player salary data from [hoopshype.com](https://hoopshype.com)
3. The library ``nba_api`` for full team statistics from [stats.nba.com](https://stats.nba.com)

# Modeling



# Linear Regression for Wins Prediction

## Attempt 1

- ❑ 2P% | 3P% | FT% | 2PA per game  
| 3PA per game | 3PA per 2PA
  - ❑ Train  $R^2$ : 0.4028
  - ❑ Test  $R^2$ : 0.2947



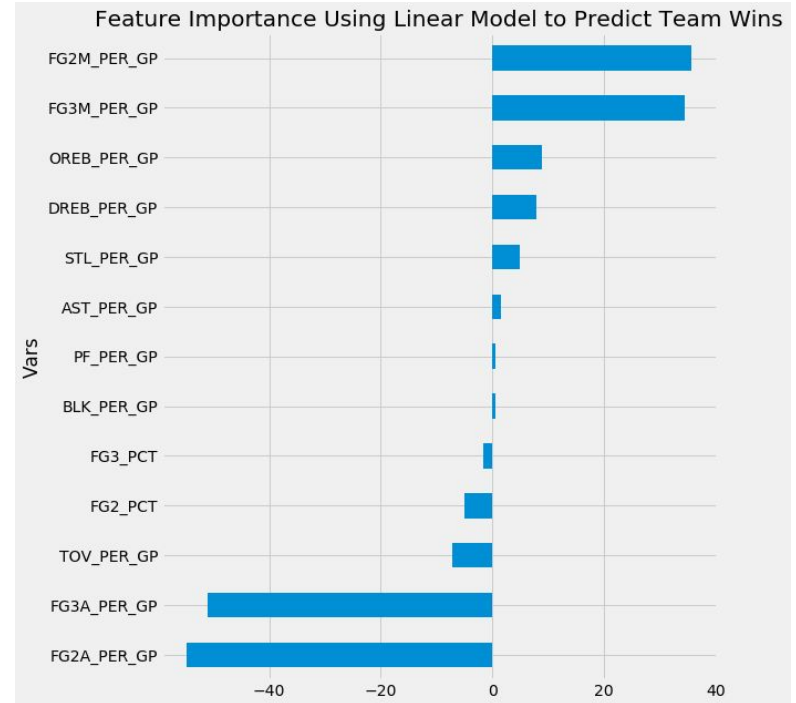
# Linear Regression for Wins Prediction

## Attempt 2

- ❑ 2P% | 3P% | FT% | 2PM per game | 2PA per game | 3PM per game | 3PA per game | FTM per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game

❑ **Train  $R^2$ : 0.8049**

❑ **Test  $R^2$ : 0.8293**



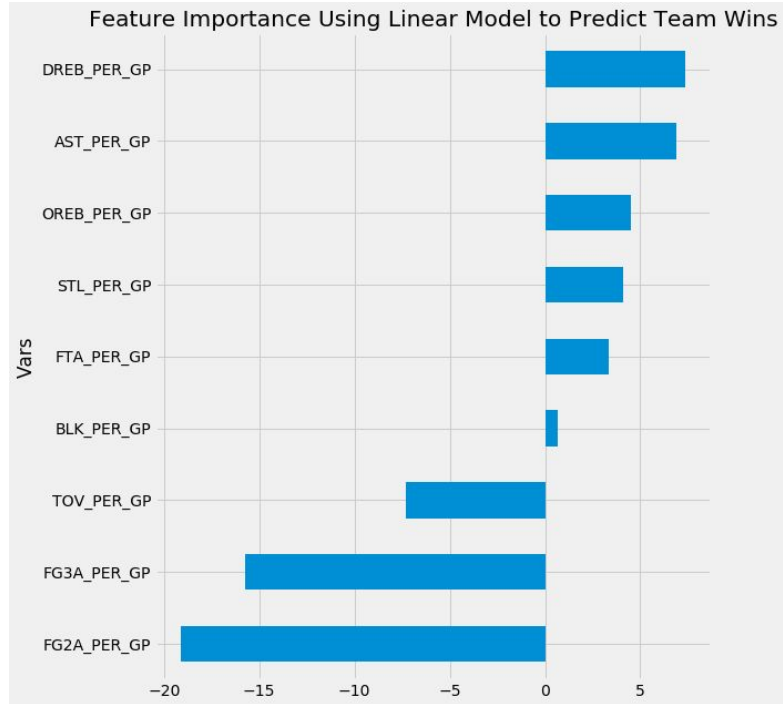
# Linear Regression for Wins Prediction

## Attempt 3

- ❑ 2PA per game | 3PA per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game

❑ **Train  $R^2$ : 0.6248**

❑ **Test  $R^2$ : 0.6649**



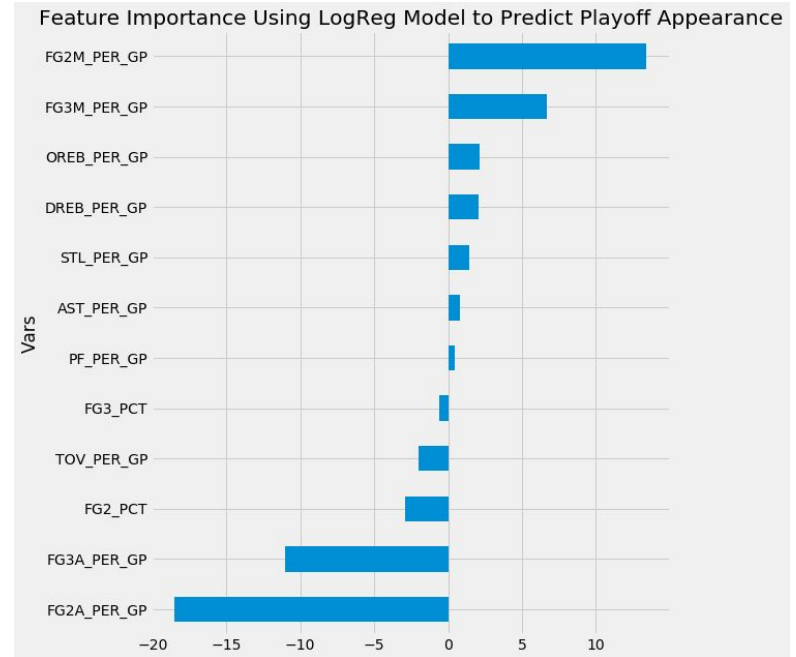
# Logistic Regression for Playoffs Classification

## Attempt 1: Predict Playoff Appearance

- ❑ 2P% | 3P% | FT% | 2PM per game | 2PA per game | 3PM per game | 3PA per game | FTM per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game

❑ **Train Accuracy: 0.8459**

❑ **Test Accuracy: 0.8307**





# Logistic Regression for Playoffs Classification

## **Attempt 2:** Predict NBA Championship

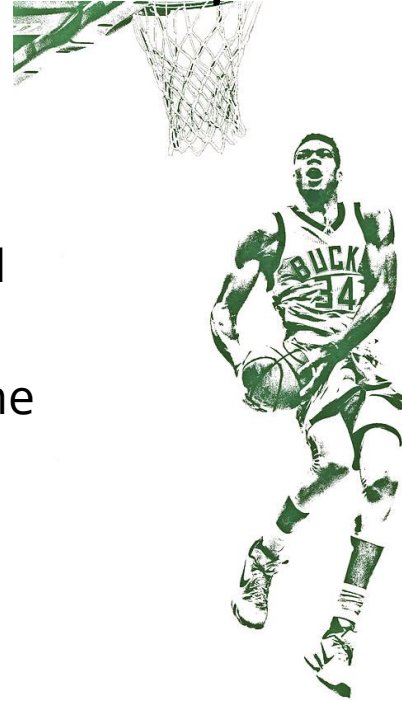
- ❑ 2P% | 3P% | FT% | 2PM per game | 2PA per game | 3PM per game | 3PA per game | FTM per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game
  - ❑ **Train Sensitivity: 0.0741**
  - ❑ **Test Sensitivity: 0.1111**



# Logistic Regression for Playoffs Classification

## **Attempt 3:** Predict NBA Finals Appearance

- ❑ 2P% | 3P% | FT% | 2PM per game | 2PA per game | 3PM per game | 3PA per game | FTM per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game
  - ❑ **Train Sensitivity: 0.0741**
  - ❑ **Test Sensitivity: 0.1111**



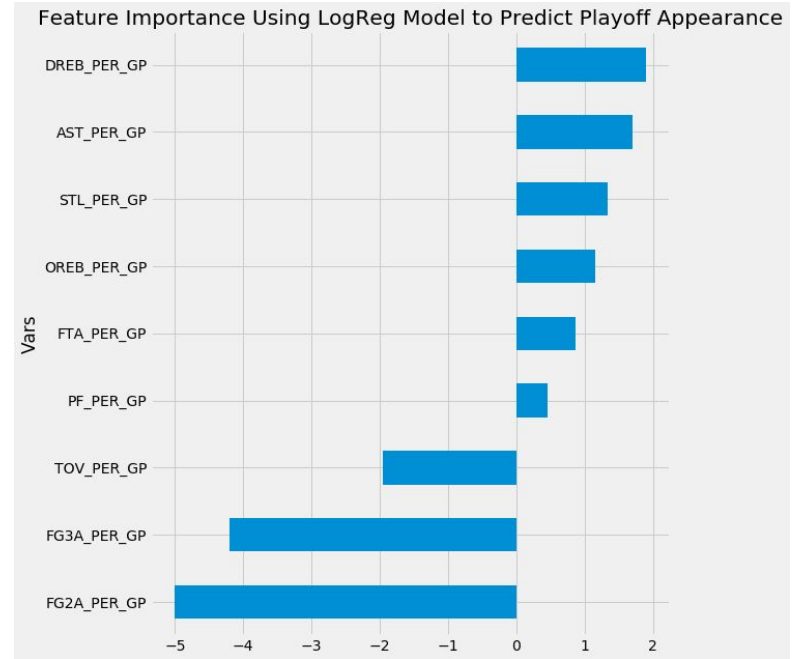
# Logistic Regression for Playoffs Classification

## Attempt 4: Predict Playoff Appearance

- ❑ 2PA per game | 3PA per game | FTA per game | OREB per game | DREB per game | AST per game | PF per game | STL per game | TOV per game | BLK per game

❑ **Train Accuracy: 0.8142**

❑ **Test Accuracy: 0.7717**



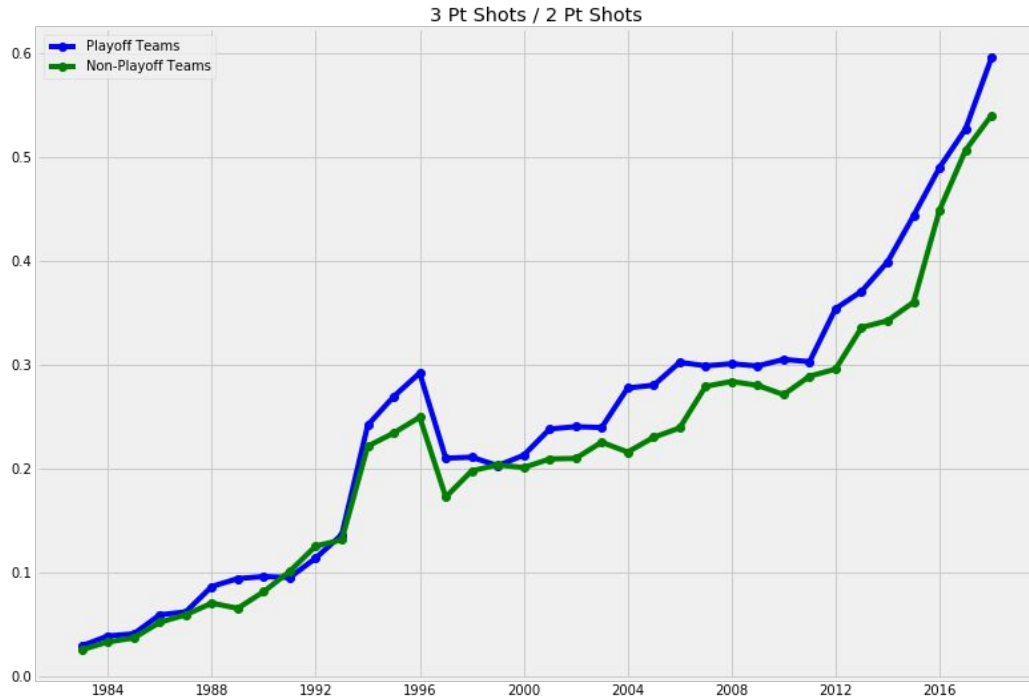
# Conclusions & Visualizations



# 3 Pointers Win!

- ❑ Logistic Regression model attempt 4 has best combination of interpretability and accuracy
  - ❑ 3 point attempts per game had a smaller negative impact on playoff appearance prediction than 2 point attempts per game
  - ❑ 3 pointers contribute more to success
  - ❑ Same evaluation was shown in Linear Regression example

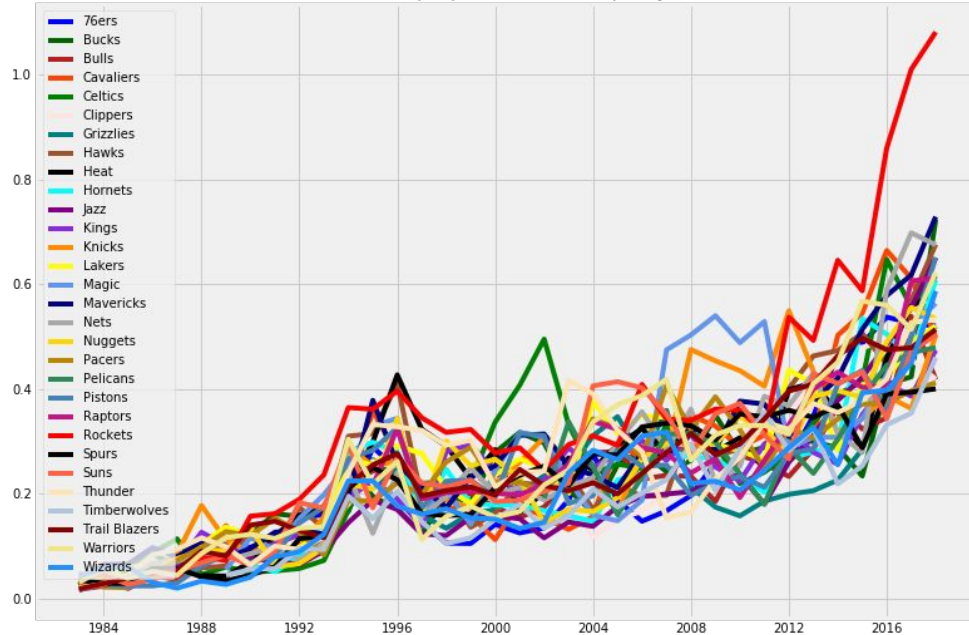
# The NBA Seems to Agree...



- ❑ 3 Point Attempts per 2 Point Attempt across the entire league, broken up by playoff teams and non-playoff teams
- ❑ Demonstrates an increasing trust in the 3 point shot
- ❑ Illustrates how playoff teams almost always almost always have the higher ratio

# ...With One Team Agreeing More Than Most

3 Pt FG Attempts per 2 Pt FG Attempts by Team



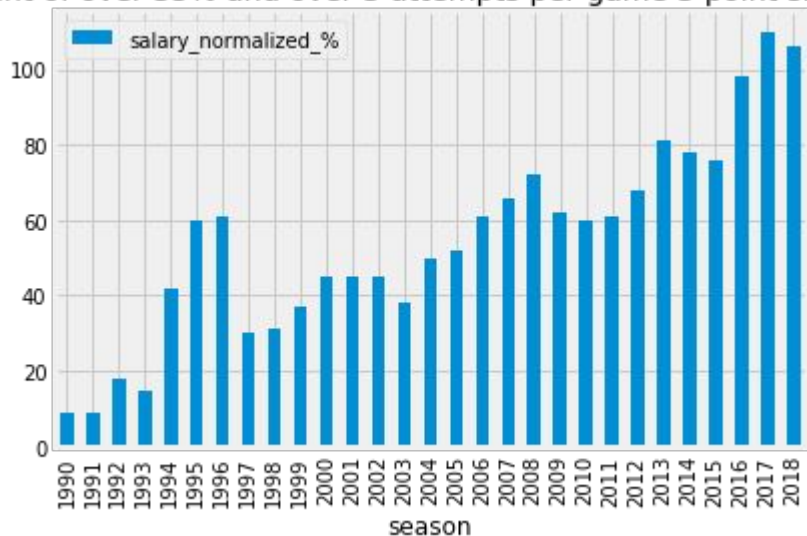
- ❑ Houston Rockets are leaps and bounds above the rest of the league
- ❑ First team ever to finish a season with more 3 point attempts than 2 point attempts
- ❑ Did so both of the last 2 seasons

	<b>All Teams</b>	<b>Top Ten FG3A/FG2A (All Seasons)</b>	<b>Top Ten FG3A/FG2A (Since 2010)</b>
<b>Make Playoffs</b>	57.35%	70.28%	72.22%
<b>Finals Appearance</b>	7.11%	11.67%	16.67%
<b>NBA Championship</b>	3.55%	5.28%	6.67%

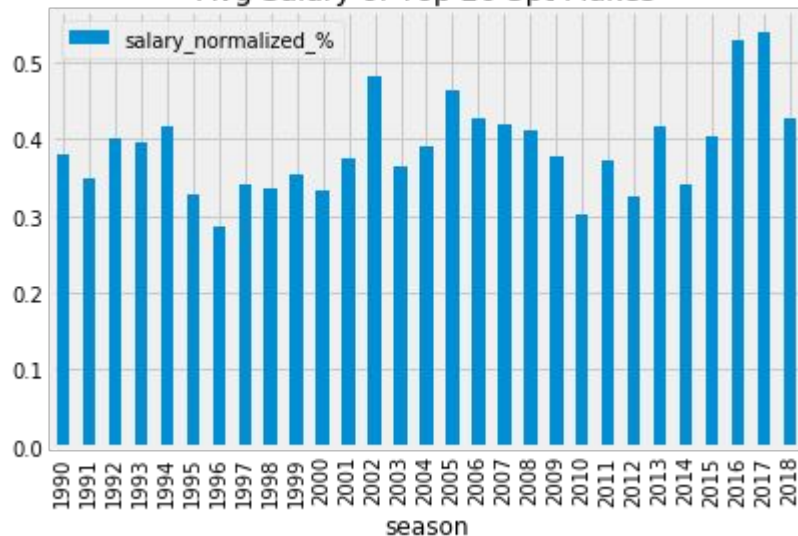


# 3 Point Specialists Are Increasing, But Their Salaries Aren't

Count of over 35% and over 3 attempts per game 3 point shooters



Avg Salary of Top 20 3pt Makes



Thanks!

