

Predicting Future NFL Player Performance and Team Success: A Data-Driven Study in Fantasy Football

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Team Roles

David

• Background Research, Gathering Datasets, Data Analysis

Sai

• Data Cleansing, Model Training, Research Question 1

Balakrishna

Data Visualization, Research Question 2

*Everybody stepped in to each role a bit as the project progressed, excellent teamwork between teammates



Background



Setting the Stage

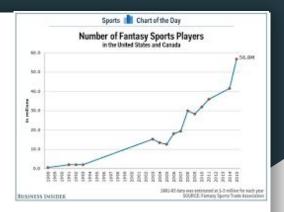
- A new frontier—the world of fantasy football—emerges as sports betting becomes legal in more and more states.
- Casual fans and armchair quarterbacks can become master strategists, building dream teams out of National Football League players.
- The NFL offers a wealth of opportunities and interest, especially with online sports betting expected to soar to an astounding \$9.65 billion annual revenue by 2024.
- Predicting player performance and team success is crucial in this dynamic arena.





Implications

- Considering the rapid growth and expansion of the sports gambling industry, more studies to be done into sports betting to examine the efficacy and further assist in educating the population about how they can best enjoy this new entertainment avenue.
- The patterns, trends, and analyses established in this paper can greatly affect strategies used by new and seasoned fantasy football managers alike, as managers are constantly trying to establish a competitive edge over one another.
- Given that the scoring methods for traditional football and fantasy football are inherently different, combining the two scoring standards has seldom been done. This project aims to do exactly that in an attempt to establish new patterns and trends for predicting a team's on-field performance.





NFL vs. Fantasy Football





San Francisco 49ers

Final/OT



25 Kansas City Chiefs

Differing Scoring Methods

San Francisco Passing SACKS QBR AVG TD INT RTG Brock Purdy 23/38 255 89.3 Jauan Jennings 21 21.0 1 0-0 99.2 158.3 TEAM -- 99.9

63	San	Francisco	Rushing

	CAR	YDS	AVG	TD	LONG
Christian McCaffrey	22	80	3.6	0	11
Brock Purdy	3	12	4.0	0	9
Elijah Mitchell	2	8	4.0	0	7
Deebo Samuel	3	8	2.7	0	9
Kyle Juszczyk	1	2	2.0	0	2
TEAM	31	110	3.5	0	11

San Francisco Receiving

	REC	YDS	AVG	TD	LONG	TGTS
Christian McCaffrey	8	80	10.0	1	24	8
Brandon Aiyuk	3	49	16.3	0	20	6
Jauan Jennings	4	42	10.5	1	23	5
Deebo Samuel	3	33	11.0	0	12	11
Kyle Juszczyk	2	31	15.5	0	18	2
Ray-Ray McCloud III	1	19	19.0	0	19	1
Chris Conley	-1	18	18.0	0	18	1
George Kittle	2	4	2.0	0	4	3
TEAM	24	276	11.5	2	24	37

Mansas City Passing

	C/ATT	YDS	AVG	TD	INT	SACKS	QBR	RTG
Patrick Mahomes	34/46	333	7.2	2	1	3-8	75.8	99.3
TEAM	34/46	325	7.2	2	1	3-8		99.3

Mansas City Rushing

	CAR	YDS	AVG	TD	LONG
Patrick Mahomes	9	66	7.3	0	22
Isiah Pacheco	18	59	3.3	0	10
Rashee Rice	2	5	2.5	0	3
Clyde Edwards-Helaire	1	0	0.0	0	0
TEAM	30	130	4.3	0	22

Mansas City Receiving

	REC	YDS	AVG	TD	LONG	TGTS
Travis Kelce	9	93	10.3	0	22	10
Mecole Hardman	3	57	19.0	1	52	3
Justin Watson	3	54	18.0	0	25	5
Rashee Rice	6	39	6.5	0	13	8
Isiah Pacheco	6	33	5.5	0	8	6
Noah Gray	2	22	11.0	0	12	2
Marquez Valdes-Scantling	3	20	6.7	1	16	5
Jerick McKinnon	2	15	7.5	0	8	2
Richie James	0	0	0.0	0	0	1
TEAM	34	333	9.8	2	52	42

Research Questions

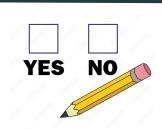
This study sets out on a data-driven expedition, exploring two crucial questions:

- Can the NFL's future stars be accurately predicted, and can a player's individual performance predict the destiny of his team as a whole?
- Do aggregated individual fantasy football performances serve as a good indicator of real-life NFL team success?





The whole is greater than the sum of its parts. Aristotle





Research Question 1



Research Question 1

Looking back at the last 20 years of top-200 player fantasy football data, can we predict which players are most likely to be the highest performing players (in both standard and points-per-reception formats) in the next year?

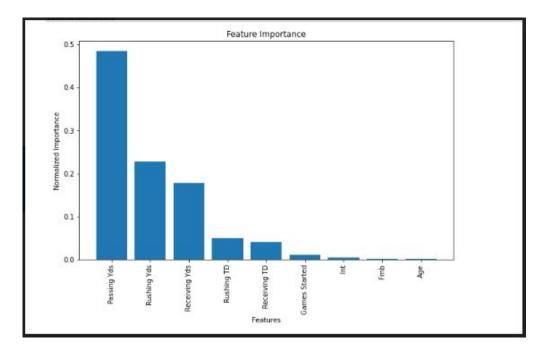
Standard Fantasy Football Scoring

QB	1	4	-1
	25 Passing Yards	Passing Touchdown	Interceptions
RB	10 Rushing Yards	6 Touchdowns	0.5 Receptions
WR	10 Receiving Yards	6 Touchdowns	0.5 Receptions
TE	1	6	0.5
	10 Receiving Yards	Touchdown	Receptions

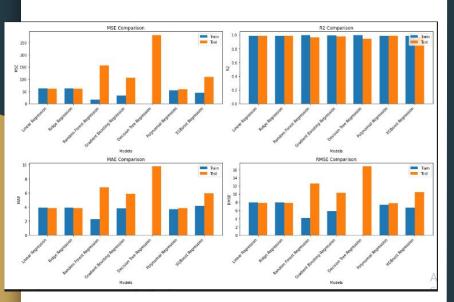
Points Per Reception

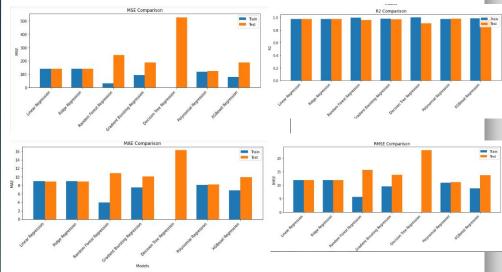
Feature Importance

Feature set decreased slightly by eliminating collinear variables to enhance model accuracy

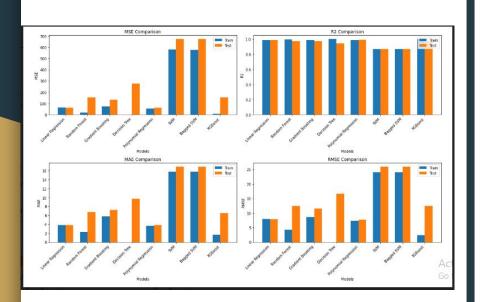


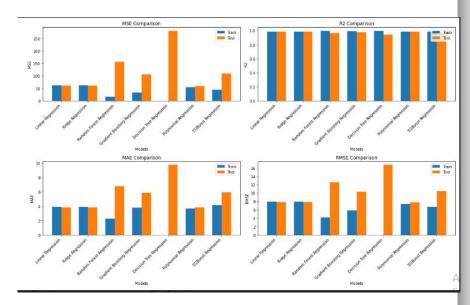
Standard Scoring vs. Points per Reception (with Hyperparameter Tuning)



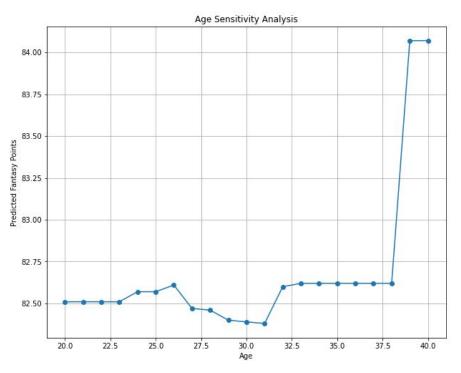


Models Before Tuning vs. Models After Tuning (Standard Scoring Method)





Why Linear and Polynomial Regressions are Effective



Age Sensitivity Analysis

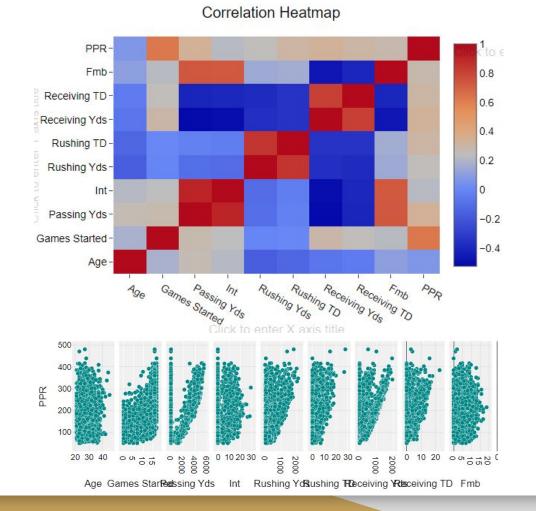
- Majority of players improve until age 27, then dip until age 30 when they retire
- Those with the talent to remain players past age 30 sustain a higher level of success, often until age 37
- Those players that make it past age 37 and make the top 200 players list tend to do exceptionally well relative to the average player

Divided dataset into players less than 37 and greater than 37 years of age and re-ran models, but no significant change occurred

Challenges

Alterations to Fix Regression Model Scores

- Simplified set of statistics
 - Removed passing TDs
 - Removed overall ranking
 - Used separate datasets for standard and points per reception target variables
- Narrowed focus on 2 stats per player type
- Correlations largely match initial hypotheses
 - Passing, rushing, and receiving features are slightly related to each other, but not enough to give collinearity issues
 - Exceptions: surprising age pattern discussed previously



Conclusions for Research Question #1

- 1. Best performing models
 - Linear, Polynomial, and Gradient Boosting
- 2. Standard vs. PPR
 - Standard scoring models performed better before and after hyperparameter tuning
- 3. Age sensitivity analysis
 - Considering the age trends, linear and polynomial models are able to predict results with great accuracy

Next Steps For Research Question #1

- 1. Further explore trends, breaking up the dataset by features
- 2. Conduct sensitivity analyses with more features to better characterize relationships between features
- 3. Develop UI for easy interactivity in building feature sets to analyze
- 4. Widening scope of players studied to include more than 200 per year to get wider understanding of game trends



Research Question 2



Research Question 2

Furthermore, if we group the players together by team, can we use their fantasy football statistics to predict their team's record in a given year?



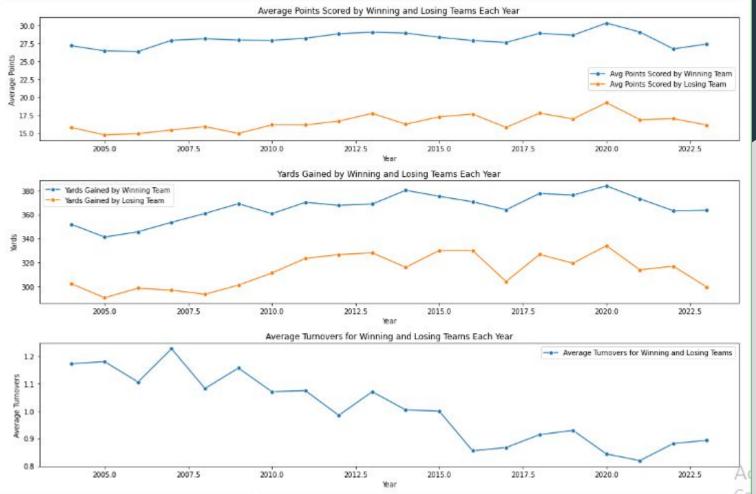
Fantasy Points as an Indicator of Winning NFL Games

For the most part, fantasy points is a good indicator for real-life NFL team success, but there are definite exceptions to the rule.

Can indicate a general range of team success, but variance of individual games is too much to overcome.



Additional Findings: Research Question 2



Challenges Question #2

- 1. Teams labelled differently across datasets (by Name vs. by City)
- 2. Difficulties joining/combining datasets
- 3. Without combining datasets, not enough features to make a predictive model

Conclusions for Research Question #2

- 1. Positive correlation between scoring fantasy points and winning NFL games
- 2. Over the last 20 years, offenses score the same amount of points, while defenses seem to be allowing more points
- 3. Over the years, the decrease in turnovers has led to more yards gained by winning teams because they possess the ball more often

Next Steps For Research Question #2

- 1. Relabel both datasets individually to be able to union/combine the feature sets for additional analysis
- 2. Find out why defenses are letting more points through: Identify features that support trend of defenses allowing more points in recent years
- 3. Explore NFL rules changes that might have impacted scoring as well over length of the study (2004-2023)
- 4. Explore additional datasets related to NFL games, teams, and player statistics to enrich analysis and gain deeper insights into performance trends.
- 5. Conduct in-depth analyses on individual players' performance metrics, injury histories, and career trajectories to identify trends and predict future success or decline.

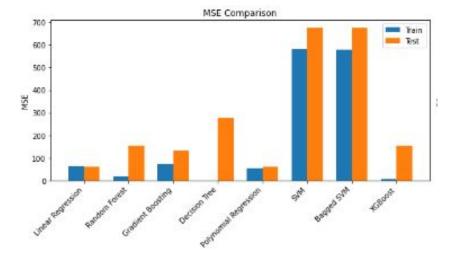


Takeaways



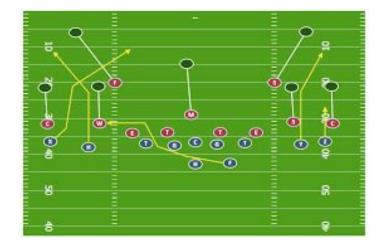
Emerging Trends from Question 1 and 2

- Greater success predicting standard scoring model
 - Most success with linear, polynomial, and Gradient/XGBoost methods
- Slight overall uptick in yardage gained by both winning and losing teams
- Fantasy points scored by individuals on the virtual gridiron are generally a good indicator of overall real-life NFL team success



Strategies to Consider Before Betting

- Positional importance matters
 - Quarterbacks > Running Backs
 - Running Backs > Wide Receivers
- Focus on young players with 3-4 years of experience in the league, or veterans with 7-8 years of experience to maximize point scoring potential
- Place less emphasis on turnover-induced statistics
 - League-wide decline in turnovers





Thank you!

Questions?

