

# Fantasy\_Football\_ML

October 14, 2024

```
[1]: # Imports
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model_selection import train_test_split, GridSearchCV
from sklearn.ensemble import RandomForestRegressor
from sklearn.metrics import mean_squared_error, r2_score
from sklearn.preprocessing import StandardScaler, OneHotEncoder
from sklearn.impute import SimpleImputer
from sklearn.decomposition import PCA
import numpy as np
import re
```

```
[2]: # Week 2 Start: Ingestion of the Dataset
```

```
# File paths for each year
file_2019 = 'FFRank 2019.csv'
file_2020 = 'FFRank 2020.csv'
file_2021 = 'FFRank 2021.csv'
file_2022 = 'FFRank 2022.csv'
```

```
[3]: # Read each CSV file into a pandas DataFrame
```

```
df_2019 = pd.read_csv(file_2019)
df_2020 = pd.read_csv(file_2020)
df_2021 = pd.read_csv(file_2021)
df_2022 = pd.read_csv(file_2022)
```

```
[4]: # Display the first few rows of each dataset to ensure they loaded correctly
```

```
print("2019 Data Preview:\n", df_2019.head())
print("2020 Data Preview:\n", df_2020.head())
print("2021 Data Preview:\n", df_2021.head())
print("2022 Data Preview:\n", df_2022.head())
```

2019 Data Preview:

|   | Rank | Player              | Team | Position | Age | Games Played | \ |
|---|------|---------------------|------|----------|-----|--------------|---|
| 0 | 1    | Christian McCaffrey | CAR  | RB       | 23  | 16           |   |
| 1 | 2    | Lamar Jackson       | BAL  | QB       | 22  | 15           |   |
| 2 | 3    | Derrick Henry       | TEN  | RB       | 25  | 15           |   |

|   |   |                 |     |    |    |    |
|---|---|-----------------|-----|----|----|----|
| 3 | 4 | Aaron Jones     | GNB | RB | 25 | 16 |
| 4 | 5 | Ezekiel Elliott | DAL | RB | 24 | 16 |

|   | Passing Completion | Passing Attempts | Passing Yards | Passing TDs | ... | \ |
|---|--------------------|------------------|---------------|-------------|-----|---|
| 0 | 0                  | 2                | 0             | 0           | ... |   |
| 1 | 265                | 401              | 3127          | 36          | ... |   |
| 2 | 0                  | 0                | 0             | 0           | ... |   |
| 3 | 0                  | 0                | 0             | 0           | ... |   |
| 4 | 0                  | 0                | 0             | 0           | ... |   |

|   | Rushing TDs | Targets | Recepotions | Receiving Yards | Yards per Reception | \ |
|---|-------------|---------|-------------|-----------------|---------------------|---|
| 0 | 15          | 142     | 116         | 1005            | 8.66                |   |
| 1 | 7           | 0       | 0           | 0               | NaN                 |   |
| 2 | 16          | 24      | 18          | 206             | 11.44               |   |
| 3 | 16          | 68      | 49          | 474             | 9.67                |   |
| 4 | 12          | 71      | 54          | 420             | 7.78                |   |

|   | Receiving TDs | Fumbles Lost | Total TD | Fantasy Points | PPR Fantasy Points |
|---|---------------|--------------|----------|----------------|--------------------|
| 0 | 4             | 0            | 19       | 355            | 471.2              |
| 1 | 0             | 2            | 7        | 416            | 415.7              |
| 2 | 2             | 3            | 18       | 277            | 294.6              |
| 3 | 3             | 2            | 19       | 266            | 314.8              |
| 4 | 2             | 2            | 14       | 258            | 311.7              |

[5 rows x 24 columns]

2020 Data Preview:

|   | Rank | Player        | Team | Position | Age | Games Played | Passing Completions | \ |
|---|------|---------------|------|----------|-----|--------------|---------------------|---|
| 0 | 1    | Derrick Henry | TEN  | RB       | 26  | 16           | 0                   |   |
| 1 | 2    | Alvin Kamara  | NOR  | RB       | 25  | 15           | 0                   |   |
| 2 | 3    | Dalvin Cook   | MIN  | RB       | 25  | 14           | 0                   |   |
| 3 | 4    | Davante Adams | GNB  | WR       | 28  | 14           | 0                   |   |
| 4 | 5    | Travis Kelce  | KAN  | TE       | 31  | 15           | 1                   |   |

|   | Passing Attempts | Passing Yards | Passing TD | ... | Rushing TD | Targets | \ |
|---|------------------|---------------|------------|-----|------------|---------|---|
| 0 | 0                | 0             | 0          | ... | 17         | 31      |   |
| 1 | 0                | 0             | 0          | ... | 16         | 107     |   |
| 2 | 0                | 0             | 0          | ... | 16         | 54      |   |
| 3 | 0                | 0             | 0          | ... | 0          | 149     |   |
| 4 | 2                | 4             | 0          | ... | 0          | 145     |   |

|   | Receptions | Receiving Yards | Yards Per Reception | Receiving TD | \ |
|---|------------|-----------------|---------------------|--------------|---|
| 0 | 19         | 114             | 6.00                | 0            |   |
| 1 | 83         | 756             | 9.11                | 5            |   |
| 2 | 44         | 361             | 8.20                | 1            |   |
| 3 | 115        | 1374            | 11.95               | 18           |   |
| 4 | 105        | 1416            | 13.49               | 11           |   |

| Fumbles Lost | Total TD | Fantasy Points | PPR Points |
|--------------|----------|----------------|------------|
|--------------|----------|----------------|------------|

|   |   |    |     |       |
|---|---|----|-----|-------|
| 0 | 2 | 17 | 314 | 333.1 |
| 1 | 0 | 21 | 295 | 377.8 |
| 2 | 3 | 17 | 294 | 337.8 |
| 3 | 1 | 18 | 243 | 358.4 |
| 4 | 1 | 11 | 208 | 312.8 |

[5 rows x 24 columns]

2021 Data Preview:

|   | Rank | Player          | Team | Position | Age | Games Played | \ |
|---|------|-----------------|------|----------|-----|--------------|---|
| 0 | 1    | Jonathan Taylor | IND  | RB       | 22  | 17           |   |
| 1 | 2    | Cooper Kupp     | LAR  | WR       | 28  | 17           |   |
| 2 | 3    | Deebo Samuel    | SFO  | WR       | 25  | 16           |   |
| 3 | 4    | Josh Allen      | BUF  | QB       | 25  | 17           |   |
| 4 | 5    | Austin Ekeler   | LAC  | RB       | 26  | 16           |   |

|   | Passing Completions | Passing Attempts | Passing Yards | Passing TDs | ... | \ |
|---|---------------------|------------------|---------------|-------------|-----|---|
| 0 | 0                   | 0                | 0             | 0           | ... |   |
| 1 | 0                   | 1                | 0             | 0           | ... |   |
| 2 | 1                   | 2                | 24            | 1           | ... |   |
| 3 | 409                 | 646              | 4407          | 36          | ... |   |
| 4 | 0                   | 0                | 0             | 0           | ... |   |

|   | Rushing TDs | Target | Receptions | Receiving Yards | Yards Per Reception | \ |
|---|-------------|--------|------------|-----------------|---------------------|---|
| 0 | 18          | 51     | 40         | 360             | 9.00                |   |
| 1 | 0           | 191    | 145        | 1947            | 13.43               |   |
| 2 | 8           | 121    | 77         | 1405            | 18.25               |   |
| 3 | 6           | 0      | 0          | 0               | NaN                 |   |
| 4 | 12          | 94     | 70         | 647             | 9.24                |   |

|   | Receiving Yards.1 | Fumbles Lost | Total TDs | Fantasy Points | PPR Points |
|---|-------------------|--------------|-----------|----------------|------------|
| 0 | 2                 | 2            | 20        | 333            | 373.1      |
| 1 | 16                | 0            | 16        | 295            | 439.5      |
| 2 | 6                 | 2            | 14        | 262            | 339.0      |
| 3 | 0                 | 3            | 6         | 403            | 402.6      |
| 4 | 8                 | 3            | 20        | 274            | 343.8      |

[5 rows x 24 columns]

2022 Data Preview:

|   | Rank | Player              | Team | Position | Age | Games Played | \ |
|---|------|---------------------|------|----------|-----|--------------|---|
| 0 | 1    | Patrick Mahomes     | KAN  | QB       | 27  | 17           |   |
| 1 | 2    | Josh Jacobs         | LVR  | RB       | 24  | 17           |   |
| 2 | 3    | Christian McCaffrey | 2TM  | RB       | 26  | 17           |   |
| 3 | 4    | Derrick Henry       | TEN  | RB       | 28  | 16           |   |
| 4 | 5    | Justin Jefferson    | MIN  | WR       | 23  | 17           |   |

|   | Passing Completions | Passing Attempts | Passing Yards | Passing Touchdowns | \ |
|---|---------------------|------------------|---------------|--------------------|---|
| 0 | 435                 | 648              | 5250          | 41                 |   |
| 1 | 0                   | 0                | 0             | 0                  |   |

|   |   |   |    |   |
|---|---|---|----|---|
| 2 | 1 | 1 | 34 | 1 |
| 3 | 2 | 2 | 4  | 1 |
| 4 | 2 | 2 | 34 | 0 |

|   | Rushing TD | Targets | Receptions | Receiving Yards | \ |
|---|------------|---------|------------|-----------------|---|
| 0 | 4          | 1       | 1          | 6               |   |
| 1 | 12         | 64      | 53         | 400             |   |
| 2 | 8          | 108     | 85         | 741             |   |
| 3 | 13         | 41      | 33         | 398             |   |
| 4 | 1          | 184     | 128        | 1809            |   |

|   | Yards per Receptions | Receiving Touchdowns | Fumbles Lost | Total TD2 | \ |
|---|----------------------|----------------------|--------------|-----------|---|
| 0 | 6.00                 | 0                    | 5            | 4         |   |
| 1 | 7.55                 | 0                    | 3            | 12        |   |
| 2 | 8.72                 | 5                    | 1            | 13        |   |
| 3 | 12.06                | 0                    | 6            | 13        |   |
| 4 | 14.13                | 8                    | 0            | 9         |   |

|   | Fantasy Points | PPR Fantasy Points |
|---|----------------|--------------------|
| 0 | 416            | 417.4              |
| 1 | 275            | 328.3              |
| 2 | 271            | 356.4              |
| 3 | 270            | 302.8              |
| 4 | 241            | 368.7              |

[5 rows x 24 columns]

```
[5]: # Check for missing values and data types for each year
print("2019 Data Information:")
print(df_2019.info())
print("\n2020 Data Information:")
print(df_2020.info())
print("\n2021 Data Information:")
print(df_2021.info())
print("\n2022 Data Information:")
print(df_2022.info())
```

2019 Data Information:

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 200 entries, 0 to 199

Data columns (total 24 columns):

| #   | Column   | Non-Null Count | Dtype  |
|-----|----------|----------------|--------|
| --- | -----    | -----          | -----  |
| 0   | Rank     | 200 non-null   | int64  |
| 1   | Player   | 200 non-null   | object |
| 2   | Team     | 200 non-null   | object |
| 3   | Position | 200 non-null   | object |
| 4   | Age      | 200 non-null   | int64  |

|    |                     |              |         |
|----|---------------------|--------------|---------|
| 5  | Games Played        | 200 non-null | int64   |
| 6  | Passing Completion  | 200 non-null | int64   |
| 7  | Passing Attempts    | 200 non-null | int64   |
| 8  | Passing Yards       | 200 non-null | int64   |
| 9  | Passing TDs         | 200 non-null | int64   |
| 10 | Interceptions       | 200 non-null | int64   |
| 11 | Rushing Attempts    | 200 non-null | int64   |
| 12 | Rushing Yards       | 200 non-null | int64   |
| 13 | Yards per Attempt   | 156 non-null | float64 |
| 14 | Rushing TDs         | 200 non-null | int64   |
| 15 | Targets             | 200 non-null | int64   |
| 16 | Receptions          | 200 non-null | int64   |
| 17 | Receiving Yards     | 200 non-null | int64   |
| 18 | Yards per Reception | 167 non-null | float64 |
| 19 | Receiving TDs       | 200 non-null | int64   |
| 20 | Fumbles Lost        | 200 non-null | int64   |
| 21 | Total TD            | 200 non-null | int64   |
| 22 | Fantasy Points      | 200 non-null | int64   |
| 23 | PPR Fantasy Points  | 200 non-null | float64 |

dtypes: float64(3), int64(18), object(3)  
memory usage: 37.6+ KB  
None

2020 Data Information:

<class 'pandas.core.frame.DataFrame'>

RangeIndex: 200 entries, 0 to 199

Data columns (total 24 columns):

| #  | Column              | Non-Null Count | Dtype   |
|----|---------------------|----------------|---------|
| 0  | Rank                | 200 non-null   | int64   |
| 1  | Player              | 200 non-null   | object  |
| 2  | Team                | 200 non-null   | object  |
| 3  | Position            | 200 non-null   | object  |
| 4  | Age                 | 200 non-null   | int64   |
| 5  | Games Played        | 200 non-null   | int64   |
| 6  | Passing Completions | 200 non-null   | int64   |
| 7  | Passing Attempts    | 200 non-null   | int64   |
| 8  | Passing Yards       | 200 non-null   | int64   |
| 9  | Passing TD          | 200 non-null   | int64   |
| 10 | Interceptions       | 200 non-null   | int64   |
| 11 | Rushing Attempts    | 200 non-null   | int64   |
| 12 | Rushing Yards       | 200 non-null   | int64   |
| 13 | Yards Per Attempt   | 155 non-null   | float64 |
| 14 | Rushing TD          | 200 non-null   | int64   |
| 15 | Targets             | 200 non-null   | int64   |
| 16 | Receptions          | 200 non-null   | int64   |
| 17 | Receiving Yards     | 200 non-null   | int64   |
| 18 | Yards Per Reception | 172 non-null   | float64 |

```

19 Receiving TD          200 non-null    int64
20 Fumbles Lost          200 non-null    int64
21 Total TD              200 non-null    int64
22 Fantasy Points        200 non-null    int64
23 PPR Points            200 non-null    float64
dtypes: float64(3), int64(18), object(3)
memory usage: 37.6+ KB
None

```

#### 2021 Data Information:

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 200 entries, 0 to 199
Data columns (total 24 columns):
#   Column                      Non-Null Count  Dtype
---  -
0   Rank                        200 non-null    int64
1   Player                     200 non-null    object
2   Team                       200 non-null    object
3   Position                   200 non-null    object
4   Age                        200 non-null    int64
5   Games Played               200 non-null    int64
6   Passing Completions        200 non-null    int64
7   Passing Attempts           200 non-null    int64
8   Passsing Yards             200 non-null    int64
9   Passing TDs                200 non-null    int64
10  Interceptions              200 non-null    int64
11  Rushing Attempts           200 non-null    int64
12  Rushing Yards              200 non-null    int64
13  Yards Per Attempt          162 non-null    float64
14  Rushing TDs                200 non-null    int64
15  Target                     200 non-null    int64
16  Receptions                 200 non-null    int64
17  Receiving Yards            200 non-null    int64
18  Yards Per Reception        164 non-null    float64
19  Receiving Yards.1          200 non-null    int64
20  Fumbles Lost               200 non-null    int64
21  Total TDs                  200 non-null    int64
22  Fantasy Points             200 non-null    int64
23  PPR Points                 200 non-null    float64
dtypes: float64(3), int64(18), object(3)
memory usage: 37.6+ KB
None

```

#### 2022 Data Information:

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 200 entries, 0 to 199
Data columns (total 24 columns):
#   Column                      Non-Null Count  Dtype

```

```

---  -----
0   Rank                200 non-null    int64
1   Player              200 non-null    object
2   Team                200 non-null    object
3   Position            200 non-null    object
4   Age                 200 non-null    int64
5   Games Played        200 non-null    int64
6   Passing Completions 200 non-null    int64
7   Passing Attempts    200 non-null    int64
8   Passing Yards       200 non-null    int64
9   Passing Touchdowns  200 non-null    int64
10  Interceptions       200 non-null    int64
11  Rushing Attempts    200 non-null    int64
12  Rushing Yards       200 non-null    int64
13  Yards per Attempt   157 non-null    float64
14  Rushing TD          200 non-null    int64
15  Targets             200 non-null    int64
16  Receptions          200 non-null    int64
17  Receiving Yards     200 non-null    int64
18  Yards per Receptions 166 non-null    float64
19  Reciving Touchdowns 200 non-null    int64
20  Fumbles Lost        200 non-null    int64
21  Total TD2           200 non-null    int64
22  Fantasy Points      200 non-null    int64
23  PPR Fantasy Points  200 non-null    float64
dtypes: float64(3), int64(18), object(3)
memory usage: 37.6+ KB
None

```

```

[6]: # Basic statistics for numerical columns (mean, min, max, etc.)
print("\n2019 Summary Statistics:")
print(df_2019.describe())
print("\n2020 Summary Statistics:")
print(df_2020.describe())
print("\n2021 Summary Statistics:")
print(df_2021.describe())
print("\n2022 Summary Statistics:")
print(df_2022.describe())

```

2019 Summary Statistics:

|       | Rank       | Age        | Games Played | Passing Completion \ |
|-------|------------|------------|--------------|----------------------|
| count | 200.000000 | 200.000000 | 200.000000   | 200.000000           |
| mean  | 100.500000 | 26.330000  | 14.105000    | 51.680000            |
| std   | 57.879185  | 3.846437   | 2.460538     | 115.946174           |
| min   | 1.000000   | 21.000000  | 3.000000     | 0.000000             |
| 25%   | 50.750000  | 24.000000  | 13.000000    | 0.000000             |
| 50%   | 100.500000 | 25.500000  | 15.000000    | 0.000000             |

|     |            |           |           |            |
|-----|------------|-----------|-----------|------------|
| 75% | 150.250000 | 28.000000 | 16.000000 | 0.000000   |
| max | 200.000000 | 42.000000 | 17.000000 | 408.000000 |

|       | Passing Attempts | Passing Yards | Passing TDs | Interceptions \ |
|-------|------------------|---------------|-------------|-----------------|
| count | 200.000000       | 200.000000    | 200.000000  | 200.000000      |
| mean  | 80.795000        | 592.350000    | 3.775000    | 1.755000        |
| std   | 181.237935       | 1334.654668   | 8.575082    | 4.454682        |
| min   | 0.000000         | 0.000000      | 0.000000    | 0.000000        |
| 25%   | 0.000000         | 0.000000      | 0.000000    | 0.000000        |
| 50%   | 0.000000         | 0.000000      | 0.000000    | 0.000000        |
| 75%   | 1.000000         | 0.000000      | 0.000000    | 0.000000        |
| max   | 626.000000       | 5109.000000   | 36.000000   | 30.000000       |

|       | Rushing Attempts | Rushing Yards | ... | Rushing TDs | Targets \  |
|-------|------------------|---------------|-----|-------------|------------|
| count | 200.000000       | 200.000000    | ... | 200.000000  | 200.000000 |
| mean  | 55.970000        | 246.340000    | ... | 1.960000    | 59.705000  |
| std   | 81.342066        | 366.605212    | ... | 3.163612    | 44.292404  |
| min   | 0.000000         | -12.000000    | ... | 0.000000    | 0.000000   |
| 25%   | 1.000000         | 0.000000      | ... | 0.000000    | 21.750000  |
| 50%   | 9.000000         | 40.500000     | ... | 0.000000    | 56.500000  |
| 75%   | 82.250000        | 374.250000    | ... | 3.000000    | 90.250000  |
| max   | 303.000000       | 1540.000000   | ... | 16.000000   | 185.000000 |

|       | Receptions | Receiving Yards | Yards per Reception | Receiving TDs \ |
|-------|------------|-----------------|---------------------|-----------------|
| count | 200.000000 | 200.000000      | 167.000000          | 200.000000      |
| mean  | 40.120000  | 471.120000      | 11.116766           | 3.055000        |
| std   | 29.785086  | 388.879547      | 3.683657            | 2.760448        |
| min   | 0.000000   | -4.000000       | -4.000000           | 0.000000        |
| 25%   | 14.750000  | 118.750000      | 8.325000            | 0.000000        |
| 50%   | 39.000000  | 424.500000      | 11.180000           | 3.000000        |
| 75%   | 59.000000  | 715.250000      | 13.720000           | 5.000000        |
| max   | 149.000000 | 1725.000000     | 20.690000           | 11.000000       |

|       | Fumbles Lost | Total TD   | Fantasy Points | PPR Fantasy Points |
|-------|--------------|------------|----------------|--------------------|
| count | 200.000000   | 200.000000 | 200.000000     | 200.000000         |
| mean  | 1.090000     | 5.040000   | 135.945000     | 176.032000         |
| std   | 1.585709     | 3.275982   | 70.621448      | 73.096789          |
| min   | 0.000000     | 0.000000   | 55.000000      | 58.100000          |
| 25%   | 0.000000     | 3.000000   | 79.750000      | 113.575000         |
| 50%   | 1.000000     | 5.000000   | 118.500000     | 164.550000         |
| 75%   | 2.000000     | 7.000000   | 168.000000     | 225.500000         |
| max   | 11.000000    | 19.000000  | 416.000000     | 471.200000         |

[8 rows x 21 columns]

2020 Summary Statistics:

|       | Rank       | Age        | Games Played | Passing Completions \ |
|-------|------------|------------|--------------|-----------------------|
| count | 200.000000 | 200.000000 | 200.000000   | 200.000000            |



|      |            |           |           |           |
|------|------------|-----------|-----------|-----------|
| mean | 100.500000 | 26.345000 | 14.040000 | 54.08000  |
| std  | 57.879185  | 3.932339  | 2.598492  | 118.08405 |
| min  | 1.000000   | 21.000000 | 3.000000  | 0.00000   |
| 25%  | 50.750000  | 24.000000 | 13.000000 | 0.00000   |
| 50%  | 100.500000 | 25.000000 | 15.000000 | 0.00000   |
| 75%  | 150.250000 | 28.000000 | 16.000000 | 0.25000   |
| max  | 200.000000 | 43.000000 | 16.000000 | 407.00000 |

|       | Passing Attempts | Passing Yards | Passing TD | Interceptions | \ |
|-------|------------------|---------------|------------|---------------|---|
| count | 200.000000       | 200.000000    | 200.000000 | 200.000000    |   |
| mean  | 82.13500         | 601.650000    | 4.085000   | 1.715000      |   |
| std   | 178.39076        | 1325.122438   | 9.709229   | 3.758244      |   |
| min   | 0.00000          | 0.000000      | 0.000000   | 0.000000      |   |
| 25%   | 0.00000          | 0.000000      | 0.000000   | 0.000000      |   |
| 50%   | 0.00000          | 0.000000      | 0.000000   | 0.000000      |   |
| 75%   | 1.00000          | 1.000000      | 0.000000   | 0.000000      |   |
| max   | 626.00000        | 4823.000000   | 48.000000  | 15.000000     |   |

|       | Rushing Attempts | Rushing Yards | ... | Rushing TD | Targets    | \ |
|-------|------------------|---------------|-----|------------|------------|---|
| count | 200.000000       | 200.000000    | ... | 200.000000 | 200.000000 |   |
| mean  | 54.825000        | 248.605000    | ... | 2.335000   | 59.025000  |   |
| std   | 74.243687        | 351.093982    | ... | 3.442678   | 44.046508  |   |
| min   | 0.000000         | -8.000000     | ... | 0.000000   | 0.000000   |   |
| 25%   | 1.000000         | 0.000000      | ... | 0.000000   | 19.000000  |   |
| 50%   | 11.500000        | 47.500000     | ... | 1.000000   | 59.000000  |   |
| 75%   | 97.000000        | 429.500000    | ... | 3.000000   | 92.250000  |   |
| max   | 378.000000       | 2027.000000   | ... | 17.000000  | 166.000000 |   |

|       | Receptions | Receiving Yards | Yards Per Reception | Receiving TD | \ |
|-------|------------|-----------------|---------------------|--------------|---|
| count | 200.00000  | 200.000000      | 172.000000          | 200.00000    |   |
| mean  | 40.38000   | 459.670000      | 10.541744           | 3.22000      |   |
| std   | 29.97764   | 385.912234      | 3.943376            | 3.32821      |   |
| min   | 0.00000    | -6.000000       | -6.000000           | 0.00000      |   |
| 25%   | 16.00000   | 122.250000      | 7.740000            | 0.00000      |   |
| 50%   | 38.00000   | 418.000000      | 10.760000           | 3.00000      |   |
| 75%   | 59.00000   | 723.750000      | 13.222500           | 5.00000      |   |
| max   | 127.00000  | 1535.000000     | 20.910000           | 18.00000     |   |

|       | Fumbles Lost | Total TD   | Fantasy Points | PPR Points |
|-------|--------------|------------|----------------|------------|
| count | 200.00000    | 200.000000 | 200.000000     | 200.000000 |
| mean  | 0.93000      | 5.580000   | 140.285000     | 180.623500 |
| std   | 1.39457      | 3.631742   | 74.926052      | 75.091079  |
| min   | 0.00000      | 0.000000   | 63.000000      | 64.300000  |
| 25%   | 0.00000      | 3.000000   | 86.000000      | 126.875000 |
| 50%   | 0.00000      | 5.000000   | 116.000000     | 164.200000 |
| 75%   | 1.00000      | 7.000000   | 166.000000     | 223.725000 |
| max   | 8.00000      | 21.000000  | 395.000000     | 396.100000 |

[8 rows x 21 columns]

# 2021 Summary Statistics:

|       | Rank       | Age        | Games Played | Passing Completions \ |
|-------|------------|------------|--------------|-----------------------|
| count | 200.000000 | 200.000000 | 200.000000   | 200.00000             |
| mean  | 100.500000 | 26.270000  | 14.570000    | 55.75000              |
| std   | 57.879185  | 3.663908   | 2.852329     | 123.65529             |
| min   | 1.000000   | 21.000000  | 6.000000     | 0.00000               |
| 25%   | 50.750000  | 24.000000  | 13.000000    | 0.00000               |
| 50%   | 100.500000 | 26.000000  | 16.000000    | 0.00000               |
| 75%   | 150.250000 | 28.000000  | 17.000000    | 0.25000               |
| max   | 200.000000 | 44.000000  | 17.000000    | 485.00000             |

|       | Passing Attempts | Passsing Yards | Passing TDs | Interceptions \ |
|-------|------------------|----------------|-------------|-----------------|
| count | 200.000000       | 200.000000     | 200.000000  | 200.000000      |
| mean  | 85.710000        | 614.010000     | 3.935000    | 1.945000        |
| std   | 188.009798       | 1365.233155    | 9.389975    | 4.304021        |
| min   | 0.000000         | 0.000000       | 0.000000    | 0.000000        |
| 25%   | 0.000000         | 0.000000       | 0.000000    | 0.000000        |
| 50%   | 0.000000         | 0.000000       | 0.000000    | 0.000000        |
| 75%   | 1.000000         | 1.000000       | 0.000000    | 0.000000        |
| max   | 719.000000       | 5316.000000    | 43.000000   | 17.000000       |

|       | Rushing Attempts | Rushing Yards ... | Rushing TDs | Target \   |
|-------|------------------|-------------------|-------------|------------|
| count | 200.000000       | 200.000000 ...    | 200.000000  | 200.000000 |
| mean  | 59.350000        | 263.215000 ...    | 2.190000    | 60.150000  |
| std   | 77.035184        | 342.780954 ...    | 3.20237     | 46.423737  |
| min   | 0.000000         | 0.000000 ...      | 0.000000    | 0.000000   |
| 25%   | 1.000000         | 5.000000 ...      | 0.000000    | 20.000000  |
| 50%   | 17.500000        | 78.500000 ...     | 1.000000    | 57.500000  |
| 75%   | 104.250000       | 435.250000 ...    | 3.000000    | 92.250000  |
| max   | 332.000000       | 1811.000000 ...   | 18.000000   | 191.000000 |

|       | Receptions | Receiving Yards | Yards Per Reception | Receiving Yards.1 \ |
|-------|------------|-----------------|---------------------|---------------------|
| count | 200.000000 | 200.000000      | 164.000000          | 200.000000          |
| mean  | 41.16500   | 465.720000      | 10.696951           | 3.015000            |
| std   | 30.97718   | 401.140274      | 3.520453            | 3.224401            |
| min   | 0.000000   | -4.000000       | -4.000000           | 0.000000            |
| 25%   | 18.000000  | 128.750000      | 7.977500            | 0.000000            |
| 50%   | 41.000000  | 430.500000      | 10.690000           | 2.000000            |
| 75%   | 61.000000  | 705.000000      | 13.122500           | 5.000000            |
| max   | 145.00000  | 1947.000000     | 19.540000           | 16.000000           |

|       | Fumbles Lost | Total TDs  | Fantasy Points | PPR Points |
|-------|--------------|------------|----------------|------------|
| count | 200.000000   | 200.000000 | 200.000000     | 200.000000 |
| mean  | 0.960000     | 5.220000   | 139.775000     | 180.869000 |
| std   | 1.306497     | 3.691849   | 73.146335      | 75.794843  |
| min   | 0.000000     | 0.000000   | 59.000000      | 62.500000  |

|     |          |           |            |            |
|-----|----------|-----------|------------|------------|
| 25% | 0.000000 | 3.000000  | 85.000000  | 121.700000 |
| 50% | 1.000000 | 5.000000  | 116.500000 | 164.200000 |
| 75% | 1.000000 | 7.000000  | 172.000000 | 227.350000 |
| max | 6.000000 | 20.000000 | 403.000000 | 439.500000 |

[8 rows x 21 columns]

#### 2022 Summary Statistics:

|       | Rank       | Age        | Games Played | Passing Completions \ |
|-------|------------|------------|--------------|-----------------------|
| count | 200.000000 | 200.000000 | 200.000000   | 200.000000            |
| mean  | 100.500000 | 26.385000  | 14.585000    | 50.680000             |
| std   | 57.879185  | 3.438881   | 2.760594     | 114.872346            |
| min   | 1.000000   | 21.000000  | 6.000000     | 0.000000              |
| 25%   | 50.750000  | 24.000000  | 13.000000    | 0.000000              |
| 50%   | 100.500000 | 26.000000  | 16.000000    | 0.000000              |
| 75%   | 150.250000 | 28.000000  | 17.000000    | 0.000000              |
| max   | 200.000000 | 45.000000  | 17.000000    | 490.000000            |

|       | Passing Attempts | Passing Yards | Passing Touchdowns | Interceptions \ |
|-------|------------------|---------------|--------------------|-----------------|
| count | 200.000000       | 200.000000    | 200.000000         | 200.000000      |
| mean  | 78.235000        | 558.965000    | 3.445000           | 1.675000        |
| std   | 175.443014       | 1256.461792   | 8.089759           | 3.744259        |
| min   | 0.000000         | 0.000000      | 0.000000           | 0.000000        |
| 25%   | 0.000000         | 0.000000      | 0.000000           | 0.000000        |
| 50%   | 0.000000         | 0.000000      | 0.000000           | 0.000000        |
| 75%   | 1.000000         | 0.000000      | 0.000000           | 0.000000        |
| max   | 733.000000       | 5250.000000   | 41.000000          | 15.000000       |

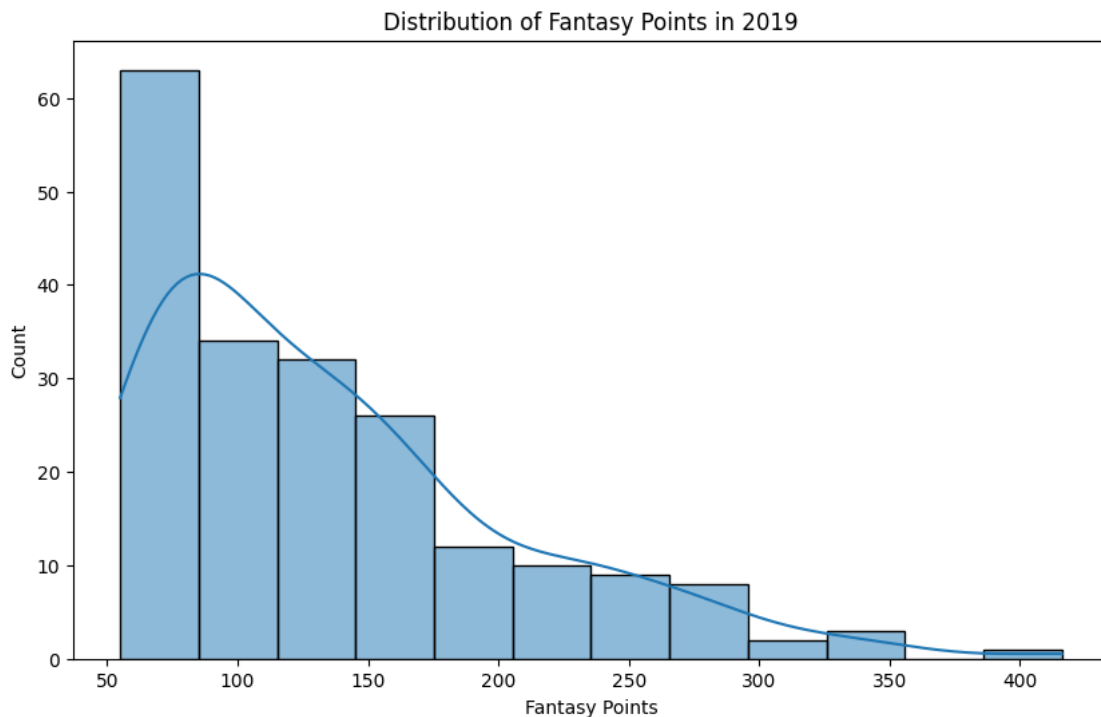
|       | Rushing Attempts | Rushing Yards | ... | Rushing TD | Targets \  |
|-------|------------------|---------------|-----|------------|------------|
| count | 200.000000       | 200.000000    | ... | 200.000000 | 200.000000 |
| mean  | 60.630000        | 274.515000    | ... | 2.110000   | 59.965000  |
| std   | 83.747845        | 388.655432    | ... | 3.210833   | 45.957089  |
| min   | 0.000000         | -15.000000    | ... | 0.000000   | 0.000000   |
| 25%   | 1.000000         | 0.000000      | ... | 0.000000   | 18.000000  |
| 50%   | 10.000000        | 53.500000     | ... | 1.000000   | 59.000000  |
| 75%   | 95.000000        | 462.250000    | ... | 3.000000   | 92.250000  |
| max   | 349.000000       | 1653.000000   | ... | 17.000000  | 184.000000 |

|       | Receptions | Receiving Yards | Yards per Receptions | Receiving Touchdowns \ |
|-------|------------|-----------------|----------------------|------------------------|
| count | 200.000000 | 200.000000      | 166.000000           | 200.000000             |
| mean  | 40.730000  | 456.14500       | 10.348193            | 2.765000               |
| std   | 30.634613  | 396.47656       | 3.571122             | 2.867208               |
| min   | 0.000000   | -10.00000       | -5.000000            | 0.000000               |
| 25%   | 15.750000  | 95.75000        | 7.682500             | 0.000000               |
| 50%   | 40.000000  | 423.50000       | 10.585000            | 2.000000               |
| 75%   | 60.250000  | 710.75000       | 12.872500            | 4.000000               |
| max   | 128.000000 | 1809.00000      | 18.080000            | 14.000000              |

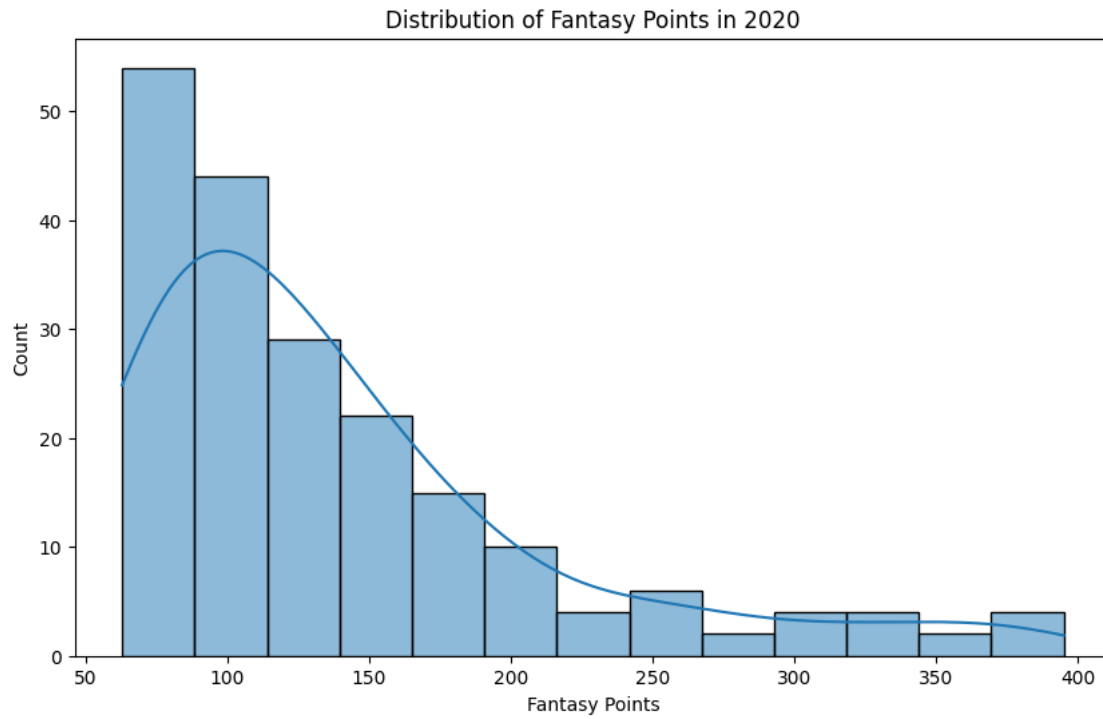
|       | Fumbles Lost | Total TD2  | Fantasy Points | PPR Fantasy Points |
|-------|--------------|------------|----------------|--------------------|
| count | 200.00000    | 200.000000 | 200.00000      | 200.000000         |
| mean  | 2.11000      | 4.905000   | 134.09000      | 174.766000         |
| std   | 2.79229      | 3.319801   | 71.48962       | 74.628082          |
| min   | 0.00000      | 0.000000   | 57.00000       | 56.600000          |
| 25%   | 0.00000      | 3.000000   | 79.75000       | 115.100000         |
| 50%   | 1.00000      | 4.000000   | 115.00000      | 162.600000         |
| 75%   | 3.00000      | 6.000000   | 165.75000      | 219.550000         |
| max   | 16.00000     | 18.000000  | 416.00000      | 417.400000         |

[8 rows x 21 columns]

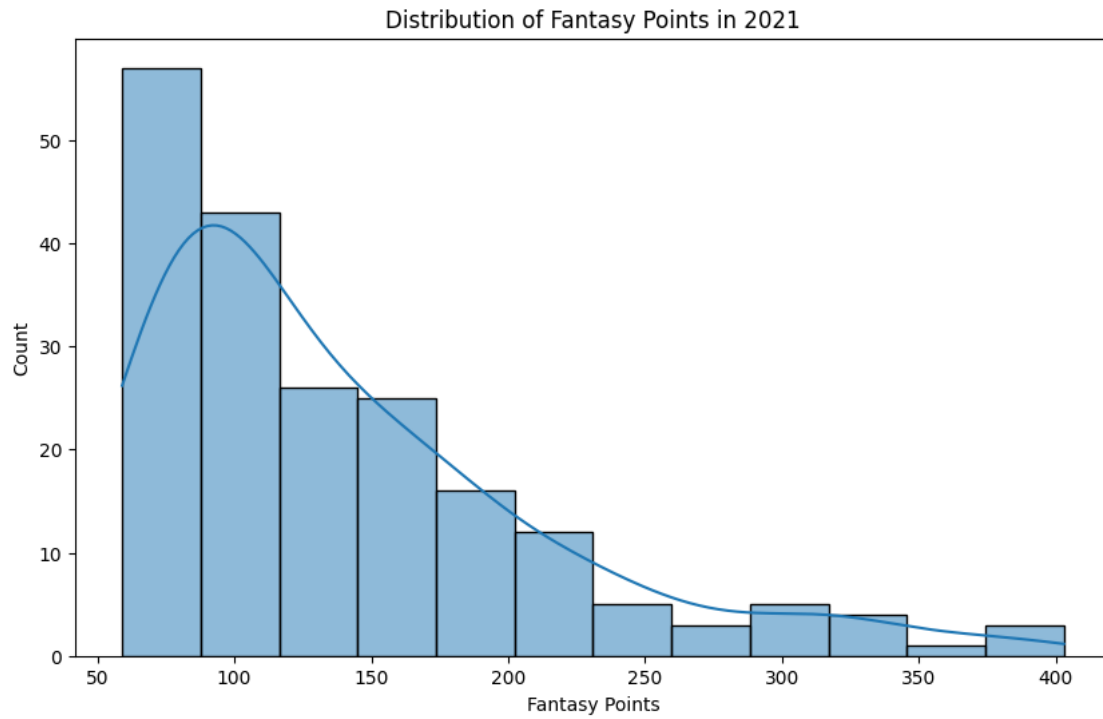
```
[7]: # Plot distribution of fantasy points
plt.figure(figsize=(10, 6))
sns.histplot(df_2019['Fantasy Points'], kde=True)
plt.title('Distribution of Fantasy Points in 2019')
plt.show()
```



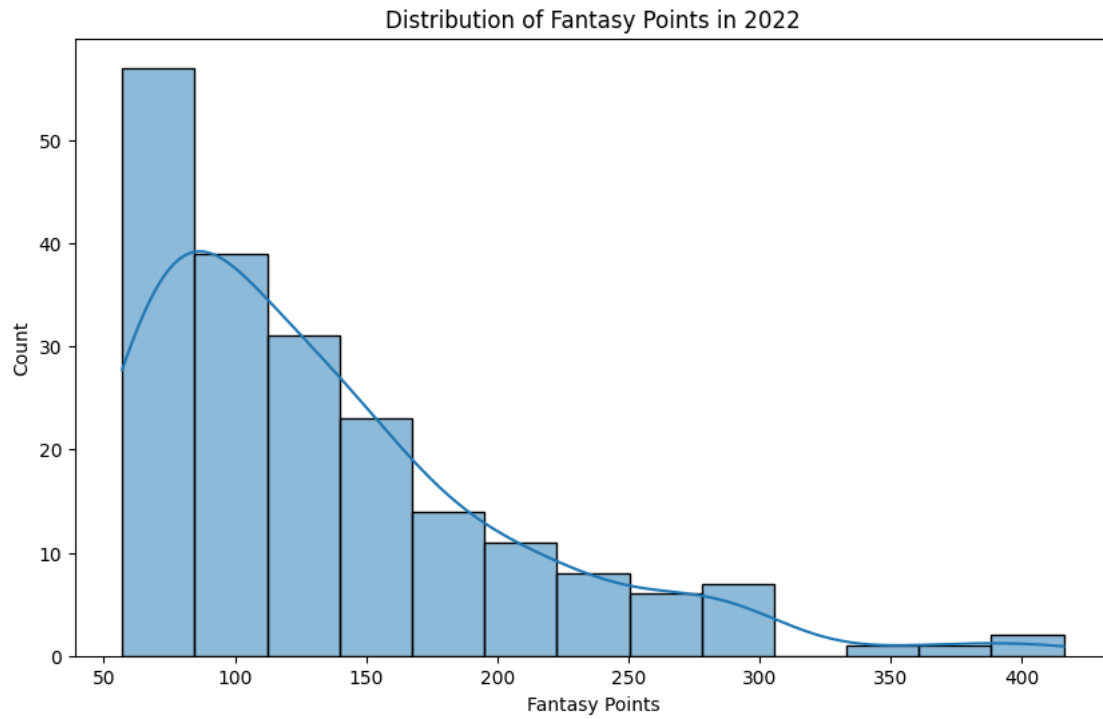
```
[8]: # Plot distribution of fantasy points
plt.figure(figsize=(10, 6))
sns.histplot(df_2020['Fantasy Points'], kde=True)
plt.title('Distribution of Fantasy Points in 2020')
plt.show()
```



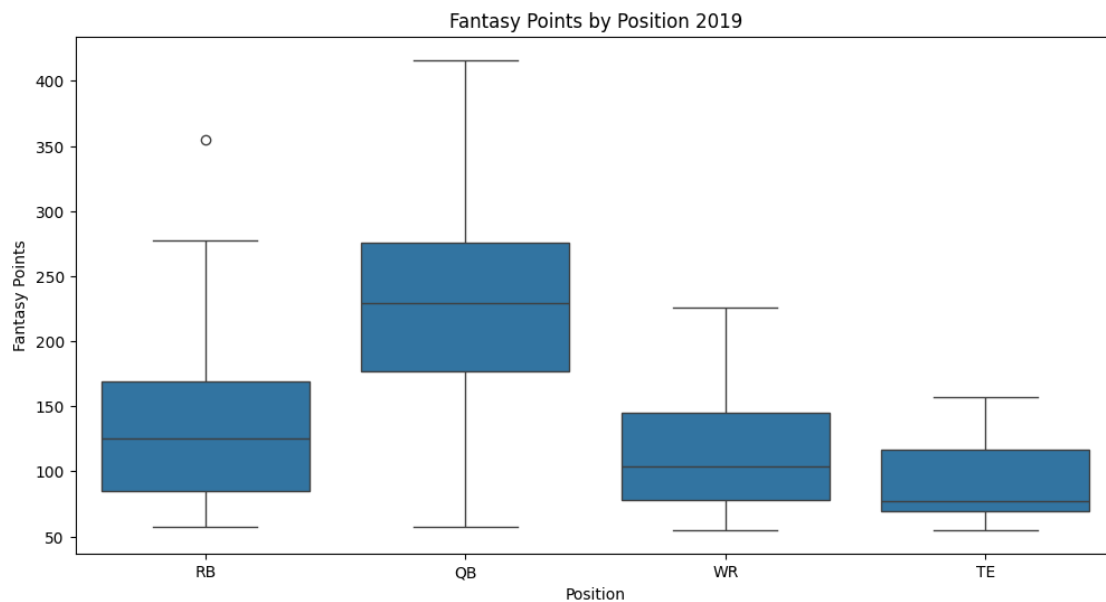
```
[9]: # Plot distribution of fantasy points
plt.figure(figsize=(10, 6))
sns.histplot(df_2021['Fantasy Points'], kde=True)
plt.title('Distribution of Fantasy Points in 2021')
plt.show()
```



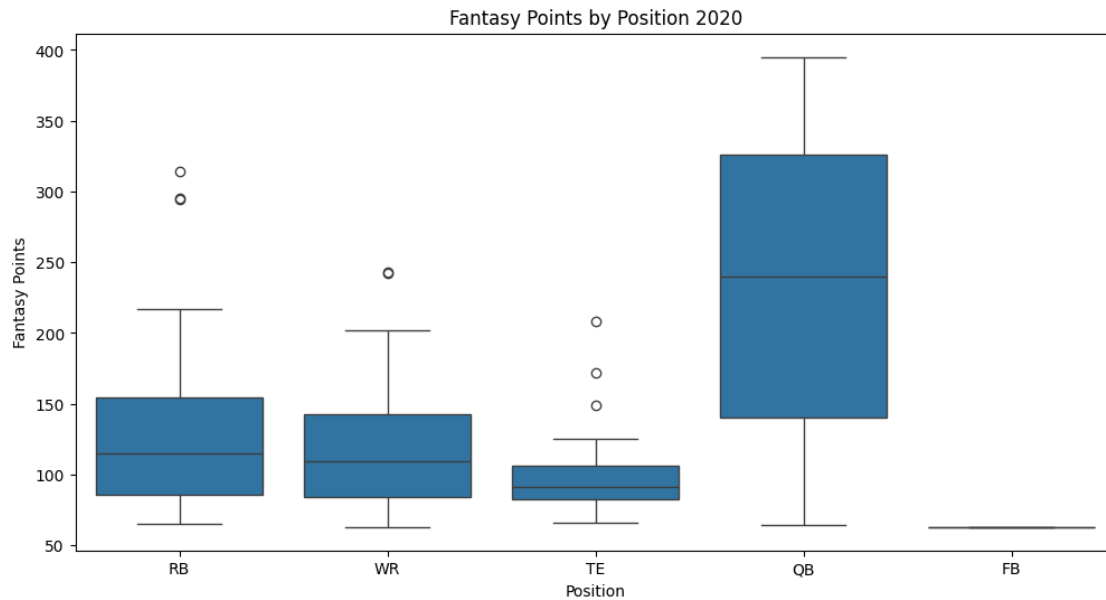
```
[10]: # Plot distribution of fantasy points
plt.figure(figsize=(10, 6))
sns.histplot(df_2022['Fantasy Points'], kde=True)
plt.title('Distribution of Fantasy Points in 2022')
plt.show()
```



```
[11]: # Boxplot to compare fantasy points across positions
plt.figure(figsize=(12, 6))
sns.boxplot(x='Position', y='Fantasy Points', data=df_2019)
plt.title('Fantasy Points by Position 2019')
plt.show()
```

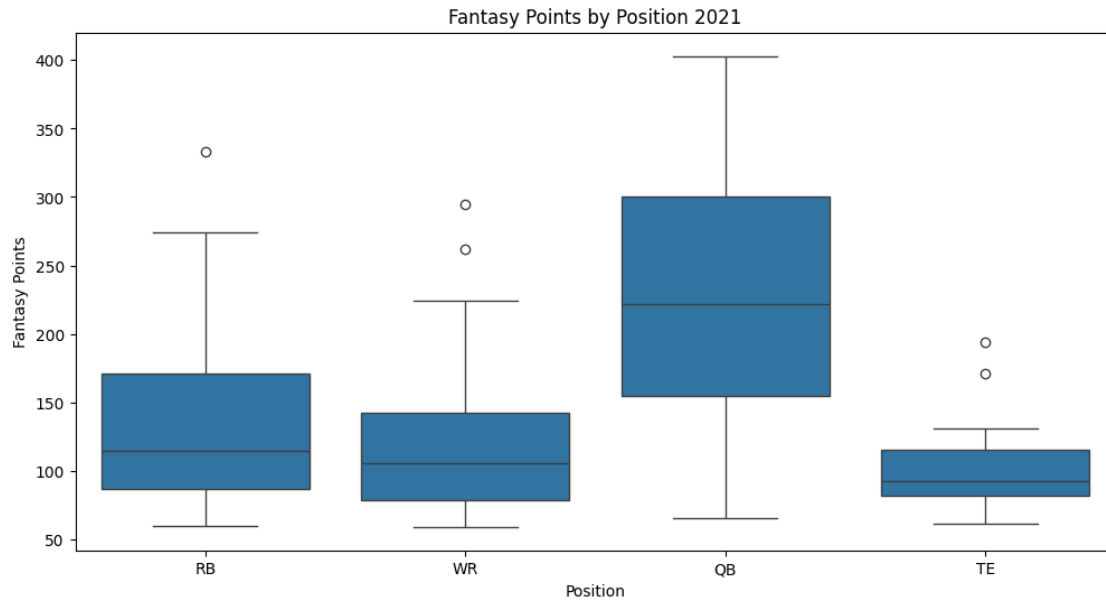


```
[12]: # Boxplot to compare fantasy points across positions
plt.figure(figsize=(12, 6))
sns.boxplot(x='Position', y='Fantasy Points', data=df_2020)
plt.title('Fantasy Points by Position 2020')
plt.show()
```

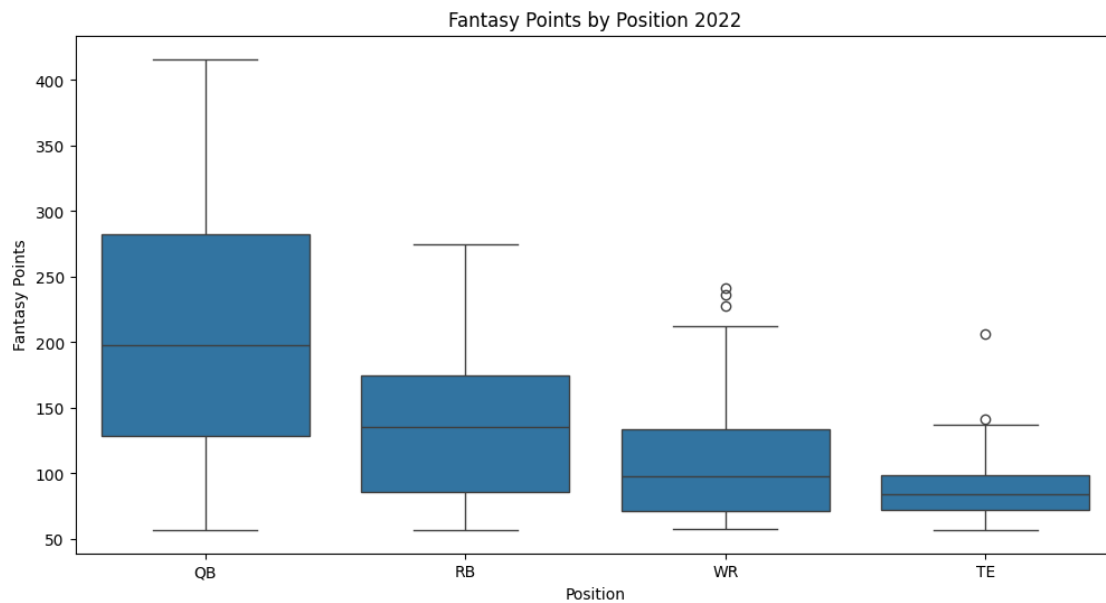


```
[13]: # Boxplot to compare fantasy points across positions
plt.figure(figsize=(12, 6))
sns.boxplot(x='Position', y='Fantasy Points', data=df_2021)
plt.title('Fantasy Points by Position 2021')
plt.show()
```





```
[14]: # Boxplot to compare fantasy points across positions
plt.figure(figsize=(12, 6))
sns.boxplot(x='Position', y='Fantasy Points', data=df_2022)
plt.title('Fantasy Points by Position 2022')
plt.show()
```



```
[15]: # Week 3 Start

# Concatenate all dataframes into a single dataframe
combined_df = pd.concat([df_2019, df_2020, df_2021, df_2022], ignore_index=True)

# Clean player names by removing special characters
combined_df['Player'] = combined_df['Player'].str.replace(r'[^a-zA-Z.\s]', '',
    ↪ regex=True)

# Group by 'Player' and aggregate relevant numerical columns
aggregated_df = combined_df.groupby('Player').agg({
    'Rushing Yards': 'sum',
    'Receiving Yards': 'sum',
    'Passing Yards': 'sum',
    'Total TD': 'sum',
    'Fantasy Points': 'sum',
    'Games Played': 'sum',
    'Position': 'first', # Get the first non-null position
}).reset_index()

# Calculate Yards from Scrimmage and Total Yards
aggregated_df['Yards_from_Scrimmage'] = aggregated_df['Rushing Yards'] +
    ↪ aggregated_df['Receiving Yards']
aggregated_df['Total_Yards'] = aggregated_df['Yards_from_Scrimmage'] +
    ↪ aggregated_df['Passing Yards']

# Calculate averages for aggregated statistics
aggregated_df['Avg_TD'] = aggregated_df['Total TD'] / aggregated_df['Games
    ↪ Played']
aggregated_df['Avg_Yards_from_Scrimmage'] =
    ↪ aggregated_df['Yards_from_Scrimmage'] / aggregated_df['Games Played']
aggregated_df['Avg_Passing_Yards'] = aggregated_df['Passing Yards'] /
    ↪ aggregated_df['Games Played']
aggregated_df['Avg_Total_Yards'] = aggregated_df['Total_Yards'] /
    ↪ aggregated_df['Games Played']

# Save the aggregated data to a new CSV file
aggregated_df.to_csv('aggregated_fantasy_data.csv', index=False)

[16]: # Split Data (Train/Test)
X = aggregated_df[['Yards_from_Scrimmage', 'Passing Yards', 'Total TD',
    ↪ 'Total_Yards']]
y = aggregated_df['Fantasy Points']

X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2,
    ↪ random_state=42)
```

```

# Confirm the split sizes
print("Train Feature Set Shape:", X_train.shape)
print("Test Feature Set Shape:", X_test.shape)
print("Train Target Set Shape:", y_train.shape)
print("Test Target Set Shape:", y_test.shape)

# Correlation heatmap
plt.figure(figsize=(8, 6))
corr = aggregated_df[['Yards_from_Scrimmage', 'Passing Yards', 'Total TD', 'Total_Yards', 'Fantasy Points']].corr()
sns.heatmap(corr, annot=True, cmap='coolwarm', fmt='.2f')
plt.title('Correlation Heatmap')
plt.show()

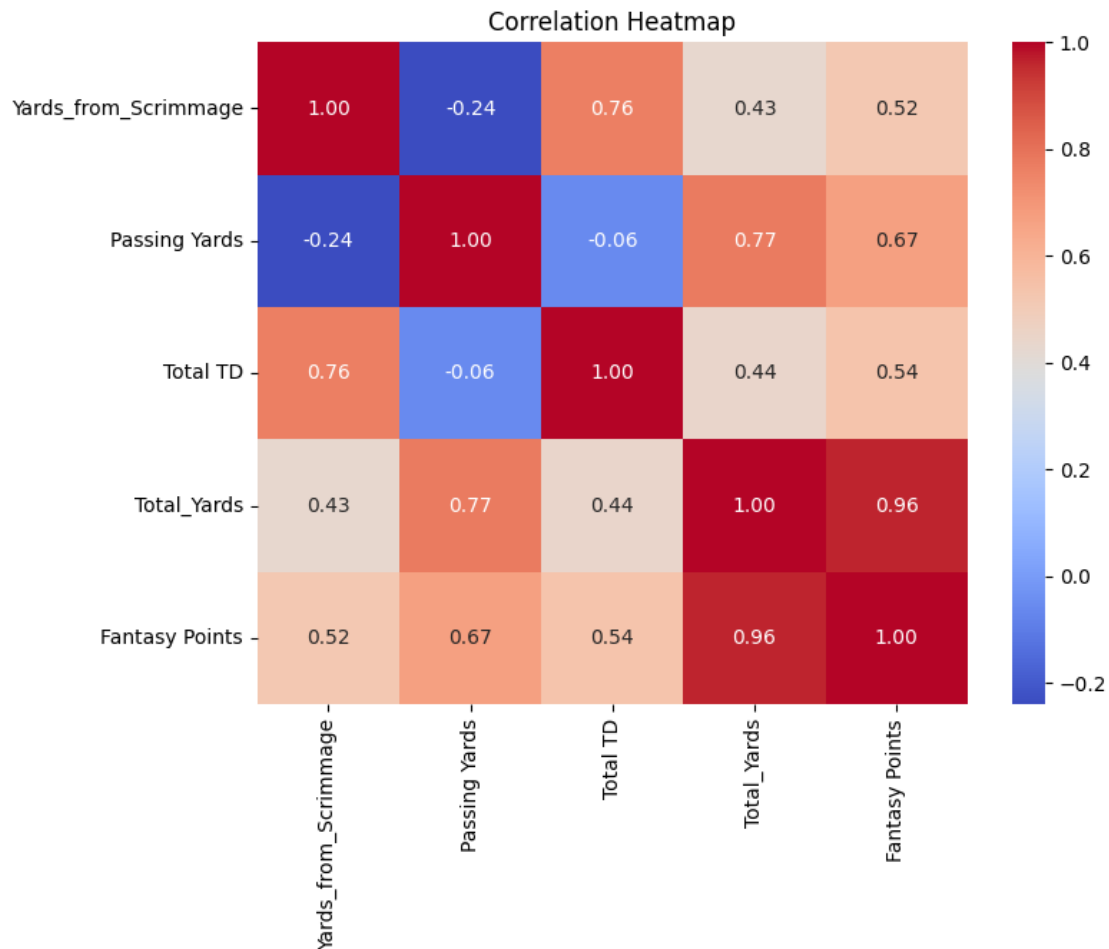
```

Train Feature Set Shape: (288, 4)

Test Feature Set Shape: (72, 4)

Train Target Set Shape: (288,)

Test Target Set Shape: (72,)



```
[17]: ##### Start of Week 4 #####
# Data Cleaning: Remove special characters from 'Player' column
aggregated_df['Player'] = aggregated_df['Player'].str.replace(r'[^a-zA-Z.\s]', ' ',
    ↪ regex=True)

[18]: # Handle missing data
imputer = SimpleImputer(strategy='mean') # You can change the strategy based
    ↪ on needs (mean, median, etc.)
aggregated_df['Fantasy Points'] = imputer.fit_transform(aggregated_df[['Fantasy
    ↪ Points']])

[19]: # Outlier Treatment: Using IQR to detect and remove outliers in Fantasy Points
Q1 = aggregated_df['Fantasy Points'].quantile(0.25)
Q3 = aggregated_df['Fantasy Points'].quantile(0.75)
IQR = Q3 - Q1
# Filtering out outliers beyond 1.5*IQR
aggregated_df = aggregated_df[~((aggregated_df['Fantasy Points'] < (Q1 - 1.5 *
    ↪ IQR)) | (aggregated_df['Fantasy Points'] > (Q3 + 1.5 * IQR)))]

[20]: # Normalize and Standardize numerical features
scaler = StandardScaler()
numerical_features = ['Yards_from_Scrimmage', 'Passing Yards', 'Total TD',
    ↪ 'Fantasy Points']
aggregated_df[numerical_features] = scaler.
    ↪ fit_transform(aggregated_df[numerical_features])

# One-hot Encoding for categorical variables
encoder = OneHotEncoder(sparse_output=False, drop='first') # Dropping first to
    ↪ avoid multicollinearity
encoded_position = encoder.fit_transform(aggregated_df[['Position']])
encoded_df = pd.DataFrame(encoded_position, columns=encoder.
    ↪ get_feature_names_out(['Position']))
aggregated_df = pd.concat([aggregated_df, encoded_df], axis=1)

[21]: # Remove unnecessary columns (e.g., 'Team' column if not needed)
aggregated_df.drop(columns=['Team'], inplace=True, errors='ignore')

# Handle duplicates by removing any duplicate rows
aggregated_df.drop_duplicates(inplace=True)

[22]: # Text Data Cleaning (if applicable): removing stop words, punctuation,
    ↪ lowercasing
# This is included as an example in case you have text data, modify if needed
```

```

aggregated_df['Player'] = aggregated_df['Player'].str.lower().str.
    ↪replace(r'[\w\s]', '', regex=True).str.strip()

# Aggregating relevant statistics (already done previously, no changes needed,
    ↪for now)
aggregated_df = aggregated_df.groupby('Player').agg({
    'Rushing Yards': 'sum',
    'Receiving Yards': 'sum',
    'Passing Yards': 'sum',
    'Total TD': 'sum',
    'Fantasy Points': 'sum',
    'Games Played': 'sum',
    'Position': 'first',
}).reset_index()

```

```

[23]: # Save processed data to a new CSV
aggregated_df.to_csv('processed_fantasy_data.csv', index=False)

print("Data processing complete. Here's the head of the cleaned dataframe:")
print(aggregated_df.head())

```

Data processing complete. Here's the head of the cleaned dataframe:

|   | Player          | Rushing Yards | Receiving Yards | Passing Yards | Total TD  | \ |
|---|-----------------|---------------|-----------------|---------------|-----------|---|
| 0 | aaron jones     | 2987.0        | 1615.0          | -0.311467     | 4.027857  |   |
| 1 | adam thielen    | 23.0          | 2785.0          | -0.311467     | 2.532938  |   |
| 2 | adrian peterson | 1502.0        | 243.0           | -0.311467     | 1.038018  |   |
| 3 | aj brown        | 70.0          | 4491.0          | -0.311467     | 2.532938  |   |
| 4 | aj dillon       | 803.0         | 519.0           | -0.311467     | -0.955208 |   |

|   | Fantasy Points | Games Played | Position |
|---|----------------|--------------|----------|
| 0 | 2.730606       | 62.0         | RB       |
| 1 | 1.126495       | 55.0         | WR       |
| 2 | -0.126419      | 31.0         | RB       |
| 3 | 1.914313       | 60.0         | WR       |
| 4 | 0.106129       | 34.0         | RB       |

```

[24]: ##### Start of Week 5 #####
import pandas as pd
import numpy as np
from sklearn.decomposition import PCA
from sklearn.preprocessing import StandardScaler

# Load your dataset
df = pd.read_csv('aggregated_fantasy_data.csv')

```

```

# Feature 1: Create a new feature 'Total_Yards' by adding rushing and receiving
↳yards
df['Total_Yards'] = df['Rushing Yards'] + df['Receiving Yards']

# Feature 2: Create 'Touchdown_Efficiency' by dividing total touchdowns by
↳total yards
df['Touchdown_Efficiency'] = df['Total TD'] / df['Total_Yards']

# Feature 3: Create 'Fantasy Points per Game (FP_per_Game)' by dividing fantasy
↳points by games played
df['FP_per_Game'] = df['Fantasy Points'] / df['Games Played']

# Drop NaN or infinite values that may result from division
df['Touchdown_Efficiency'].replace([np.inf, -np.inf], np.nan, inplace=True)
df.dropna(subset=['Touchdown_Efficiency'], inplace=True)

# View the new columns added
df[['Player', 'Rushing Yards', 'Receiving Yards', 'Total_Yards', 'Total TD',
↳'Touchdown_Efficiency', 'FP_per_Game']].head()

```

/tmp/ipykernel\_3829677/2416030159.py:21: FutureWarning: A value is trying to be set on a copy of a DataFrame or Series through chained assignment using an inplace method.  
The behavior will change in pandas 3.0. This inplace method will never work because the intermediate object on which we are setting values always behaves as a copy.

For example, when doing 'df[col].method(value, inplace=True)', try using 'df.method({col: value}, inplace=True)' or df[col] = df[col].method(value) instead, to perform the operation inplace on the original object.

```
df['Touchdown_Efficiency'].replace([np.inf, -np.inf], np.nan, inplace=True)
```

```
[24]:
```

|   | Player        | Rushing Yards | Receiving Yards | Total_Yards | Total TD | \ |
|---|---------------|---------------|-----------------|-------------|----------|---|
| 0 | A.J. Brown    | 70.0          | 4491            | 4561.0      | 21.0     |   |
| 1 | A.J. Green    | 0.0           | 1371            | 1371.0      | 2.0      |   |
| 2 | AJ Dillon     | 803.0         | 519             | 1322.0      | 0.0      |   |
| 3 | Aaron Jones   | 2987.0        | 1615            | 4602.0      | 30.0     |   |
| 4 | Aaron Rodgers | 433.0         | -10             | 423.0       | 4.0      |   |

|   | Touchdown_Efficiency | FP_per_Game |
|---|----------------------|-------------|
| 0 | 0.004604             | 11.216667   |
| 1 | 0.001459             | 5.218750    |
| 2 | 0.000000             | 8.588235    |
| 3 | 0.006519             | 13.629032   |
| 4 | 0.009456             | 18.938462   |

```
[26]: # Week 6: PCA

df = pd.read_csv('aggregated_fantasy_data.csv')
df['Total_Yards'] = df['Rushing Yards'] + df['Receiving Yards']
# Avoid division by zero
df['Touchdown_Efficiency'] = np.where(df['Total_Yards'] != 0, df['Total TD'] /
    ↪df['Total_Yards'], 0)
df['FP_per_Game'] = df['Fantasy Points'] / df['Games Played']

# Split data first to prevent leakage
X = df.drop(columns=['Fantasy Points'])
y = df['Fantasy Points']
X_train, X_val, y_train, y_val = train_test_split(X, y, test_size=0.2,
    ↪random_state=42)

# Feature Scaling and PCA
scaler = StandardScaler()
X_train_scaled = scaler.fit_transform(X_train.select_dtypes(include=['int64',
    ↪'float64']))
X_val_scaled = scaler.transform(X_val.select_dtypes(include=['int64',
    ↪'float64']))

pca = PCA(n_components=5)
X_train_pca = pca.fit_transform(X_train_scaled)
X_val_pca = pca.transform(X_val_scaled)

# Model
rf = RandomForestRegressor(random_state=42)
param_grid = {'n_estimators': [100, 200, 300], 'max_depth': [10, 20, None],
    ↪'min_samples_split': [2, 5, 10]}
grid_search = GridSearchCV(estimator=rf, param_grid=param_grid, cv=3,
    ↪scoring='r2', n_jobs=-1, verbose=2)
grid_search.fit(X_train_pca, y_train)

# Evaluate the model
y_val_pred = grid_search.best_estimator_.predict(X_val_pca)
val_rmse = np.sqrt(mean_squared_error(y_val, y_val_pred))
val_r2 = r2_score(y_val, y_val_pred)

print(f"Validation RMSE: {val_rmse}")
print(f"Validation R^2: {val_r2}")
```

Fitting 3 folds for each of 27 candidates, totalling 81 fits

Validation RMSE: 159.2263800401631

Validation R<sup>2</sup>: 0.7018433605794435

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=200; total time= 1.3s

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=300; total time= 2.0s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=200; total time= 1.1s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=100; total time= 0.5s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=100; total time= 0.9s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=100; total time= 0.7s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=300; total time= 2.0s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=200; total time= 1.2s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=300; total time= 2.1s  
 [CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=100; total time= 0.7s  
 [CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=300; total time= 2.3s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=300; total time= 1.9s  
 [CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=100; total time= 0.5s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=200; total time= 1.1s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=200; total time= 1.4s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=100; total time= 0.5s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=200; total time= 1.2s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=300; total time= 1.8s  
 [CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=200; total time= 1.2s  
 [CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=100; total time= 0.6s



[CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=200; total time= 1.3s

[CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=300; total time= 1.9s

[CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=200; total time= 1.3s

[CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=300; total time= 1.8s

[CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=300; total time= 1.3s

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=300; total time= 2.0s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=100; total time= 0.7s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=200; total time= 1.1s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=300; total time= 1.8s

[CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=300; total time= 1.7s

[CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=200; total time= 1.3s

[CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=300; total time= 1.9s

[CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=200; total time= 1.2s

[CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=200; total time= 1.1s

[CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=300; total time= 1.7s

[CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=200; total time= 1.2s

[CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=300; total time= 2.0s

[CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=300; total time= 1.8s

[CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=100; total time= 0.5s

[CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=200; total time= 1.1s

[CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=300; total time= 1.0s

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=100; total time= 0.7s

[CV] END max\_depth=10, min\_samples\_split=2, n\_estimators=200; total time= 1.3s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=100; total time= 0.6s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=200; total time= 1.2s

[CV] END max\_depth=10, min\_samples\_split=5, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=200; total time= 1.1s  
 [CV] END max\_depth=10, min\_samples\_split=10, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=20, min\_samples\_split=2, n\_estimators=300; total time= 2.0s  
 [CV] END max\_depth=20, min\_samples\_split=5, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=200; total time= 1.1s  
 [CV] END max\_depth=20, min\_samples\_split=10, n\_estimators=300; total time= 1.7s  
 [CV] END max\_depth=None, min\_samples\_split=2, n\_estimators=200; total time= 1.3s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=100; total time= 0.6s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=200; total time= 1.2s  
 [CV] END max\_depth=None, min\_samples\_split=5, n\_estimators=300; total time= 1.8s  
 [CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=200; total time= 1.1s  
 [CV] END max\_depth=None, min\_samples\_split=10, n\_estimators=300; total time= 0.9s