```
In [92]: import numpy as np
           import pandas as pd
           import matplotlib.pyplot as plt
           import seaborn as sns
           import chart_studio.plotly as py
           from plotly import __version__
           import cufflinks as cf
           from plotly.offline import download_plotlyjs, init_notebook_mode, plot, iplot
           init_notebook_mode(connected = True)
           cf.go_offline()
           %matplotlib inline
           MVPsteph = pd.read_csv("MVPseason")
           preSteph = pd.read_csv("players_stats(08-09).csv")
           current = pd.read_csv("players_stats(18-19).csv") # Loading Base Data and Libraries
          2008 metrics
 In [93]: Attempts2008 = preSteph["3PA"].sum()
           made2008 = preSteph["3P"].sum()
           percent2008 = made2008 / Attempts2008
          2018 Metrics
 In [94]: | Attempts2018 = current["3PA"].sum()
           made2018 = current["3P"].sum()
           percent2018 = made2018 / Attempts2018
          Increase Percentage over 10-year span
 In [95]: increase = ((Attempts2018-Attempts2008) / (Attempts2008))*100
          Average threes attempted by centers before and after the decade
 In [96]: | preSteph[preSteph["Pos"] == "C"]["3PA"].mean()
           current[current["Pos"] == "C"]["3PA"].mean()
 Out[96]: 46.09166666666667
          Plotting threes attempted per position, 2008 and 2018
 In [97]: sns.swarmplot(x="Pos", y="3PA", data=preSteph,palette='rainbow')
           plt.ylim(0,1000)
           plt.title("3PA per position in 2008") # 2008 positions swarmplot
 Out[97]: Text(0.5, 1.0, '3PA per position in 2008')
                             3PA per position in 2008
             1000
              800
              600
                                     SG-PGPG-SG SF-PF SF-SG PF-C PF-SF
                                      Pos
 In [98]: sns.swarmplot(x="Pos", y="3PA", data=current,palette='rainbow')
           plt.ylim(0,1000)
           plt.title("3PA per position in 2018") # 2018 positions swarmplot
 Out[98]: Text(0.5, 1.0, '3PA per position in 2018')
                             3PA per position in 2018
             1000
              800
              600
                                     PF-SF SF-SG SG-PF C-PF SG-SF PF-C
          Point guard scoring and rebounding increases over 10-year span
          (current[current["Pos"] == "PG"]["TRB"].sum() - preSteph[preSteph["Pos"] == "PG"]["TRB"].sum()) / preSteph[preSteph[
           "Pos"] == "PG"]["TRB"].sum() * 100
           # Increase in PG TRB %
 Out[99]: 32.93163891323401
          (current[current["Pos"] == "PG"]["PTS"].sum() - preSteph[preSteph["Pos"] == "PG"]["PTS"].sum()) / preSteph[preSteph[
           "Pos"] == "PG"]["PTS"].sum() * 100
           # Increase in PG PTS %
Out[100]: 23.62299039883214
          Cumulative Statistics since 1980
In [101]: totalStats = pd.read_csv("totalLeague-80to19")
In [102]:
          totalStats
Out[102]:
                         Lg Age Ht Wt
                                                               FGA ...
                                                                         PTS FG% 3P%
                                                                                              Pace eFG% TOV% ORB% FT/FGA ORtg
               Rk Season
               1 2019-20 NBA 26.0 6-6 216 971 469380
                                                        79292 172463 ... 216429 0.460 0.357 0.771 100.2 0.528
                                                                                                                        0.199 110.4
               2 2018-19 NBA 26.3 6-6 217 1230 594450 101062 219458 ... 273573 0.461 0.355 0.766 100.0 0.524
                                                                                                                        0.198 110.4
                  2017-18 NBA 26.4 6-7 219 1230 593850
                                                        97435 211709 ... 261580 0.460 0.362 0.767
                                                                                                           13.0
                                                                                                                        0.193 108.6
                  2016-17 NBA 26.6 6-7 220 1230
                                                                    ... 259753 0.457
                                                                                                                        0.209 108.8
                                                       94065 208049 ... 252572 0.452 0.354 0.757 95.8 0.502
                                                                                                                        0.209 106.4
               5 2015-16 NBA 26.7 6-7 221 1230 594850
                                                                                                                        0.215 106.6
               7 2013-14 NBA 26.5 6-7 223 1230 595200
                                                        92779 204172 ... 248482 0.454 0.360 0.756
                                                                                                    0.501
                                                                                                           13.6
                  2012-13 NBA 26.7 6-7 223 1229 594470
                                                       91282 201609
                                                                                                                        0.204 105.8
                                                                    ... 241223 0.453 0.359
                                                                                                           13.7
                                                                                                                  26.5
                  2011-12 NBA 26.6 6-7 223
                                           990 479050
                                                                                                                        0.208 104.6
                                                        72218 161225 ... 190594 0.448
                                                                                   0.349 0.752
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                                                                                                    0.487
                                                                                                           13.8
                                                                                               92.1 0.498
               10 2010-11 NBA 26.6 6-7 223 1230 595050
                                                        91624 199790
                                                                    ... 244894 0.459
                                                                                   0.358 0.763
                                                                                                           13.4
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                                                                                                                        0.229 107.3
           10 11 2009-10 NBA 26.6 6-7 222 1230 594500
                                                       92730 200989
                                                                    ... 247100 0.461 0.355 0.759
                                                                                                                        0.228 107.6
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           11 12 2008-09 NBA 26.6 6-7 221 1230
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           12 13 2007-08 NBA 26.8 6-7 220 1230 594100
                                                        91669 200501 ... 245811 0.457 0.362 0.755
                                                                                               92.4 0.497
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                                                                                                                        0.246 106.5
               14 2006-07 NBA 26.6 6-7 219 1230 595750
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                                                        89860
                                                                    ... 242899
                                                                             0.458
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                  2005-06 NBA 26.5 6-7 220 1230 595550
                                                        88166 194315
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           15 16 2004-05 NBA 26.9 6-7 220 1230 595000
                                                       88435 197626
                                                                    ... 239109 0.447 0.356 0.756
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                  2003-04 NBA 27.0 6-7 219 1189 574770
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                                                        83254 189802
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           17 18 2002-03 NBA 27.2 6-7 219 1189 575420
                                                        84937
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                  2001-02 NBA 27.4 6-7 218 1189 574670
                                                        86011 193263 ... 227043 0.445 0.354 0.752
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           19 20
                  2000-01 NBA 27.7 6-7 216 1189 575520
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           20 21 1999-00 NBA 27.8 6-7 216 1189 574270
                                                        87591 195220 ... 231789 0.449 0.353 0.750
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           21 22 1998-99 NBA 27.9 6-7 215
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                                           725 350650
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                                                                    ... 132792 0.437
                                                                                   0.339
                                                                                        0.728
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                  1997-98 NBA 27.7 6-7 214 1189 575120
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                  1996-97 NBA 27.7 6-7 213 1189 575170
                                                                    ... 230433 0.455 0.360
                                                        85777 188594
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                  1995-96 NBA 27.5 6-7 213 1189 574570
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                                                        88096 190675 ... 236619 0.462
                                                                                   0.367 0.740
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                  1994-95 NBA 27.2 6-7 212 1107 535610
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                  1993-94 NBA 27.2 6-7 211 1107 533810
                                                        87064 186951 ... 224737 0.466 0.333 0.734
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                  1992-93 NBA 27.1 6-7 210 1107
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                                                                                                                        0.232 108.2
                  1991-92 NBA 27.2 6-7 208 1107 535310
                                                        91371 193391 ... 233155 0.472 0.331 0.759
                                                                                                           13.6
                                                                    ... 235370 0.474 0.320 0.765
                                                                                                                        0.245 107.9
                  1990-91 NBA 27.2 6-7 209 1107 535260
                                                        91551 193059
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           30 31 1989-90 NBA 27.1 6-7 208 1107 534760
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                  1988-89 NBA 26.9 6-7 208 1025 495150
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                  1987-88 NBA 26.9 6-7 209
                                               455040
                                                        79473 165441 ... 203993
                                                                             0.480 0.316 0.766
                                                                                               99.6
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                  1986-87 NBA 26.6 6-7 209
                                           943 455590
                                                        80422 167455 ... 207338 0.480 0.301 0.763 100.8
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                                                                                                           14.3
                                                                                                                  33.4
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                  1985-86 NBA 26.8 6-7 208
                                            943 455640
                                                        81465 167166 ... 207875 0.487 0.282 0.756 102.1 0.493
                                                                                                           14.9
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                  1984-85 NBA 26.4 6-7
                                                             168048
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                  1983-84 NBA 26.4 6-7 206
                                            943 456490
                                                        82007 166638 ... 207668 0.492 0.250 0.760 101.4 0.495
                                                                                                           15.0
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                  1982-83 NBA 26.1 6-7 205
                                            943
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                                               455090
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               39 1981-82 NBA 26.2 6-7 205
                                           943 455690
                                                        81732 166418
                                                                       204776 0.491 0.262 0.746 100.9
                                                                                                                        0.241 106.9
           39 40 1980-81 NBA 26.2 6-7 205
                                           943 455340
                                                       81025 166769
                                                                    ... 203886 0.486 0.245 0.751 101.8 0.489
                                                                                                                        0.245 105.5
                                                                                                           15.6
           40 rows × 32 columns
In [103]: totalStats = totalStats.reindex(index=totalStats.index[::-1]) # Reversing row order for better visuals
           Linear regression prediction model (training, testing, fit, predictions)
          stephYearly = pd.read_csv("StephYearlyStats")
In [104]:
           stephAvgPredict = pd.read_csv("stephAvgPredict") # Loading more data sets
          from sklearn.linear_model import LinearRegression
           from sklearn.model_selection import train_test_split
           lm = LinearRegression()
           # Libraries and creating model
In [106]: X_train = stephYearly[['GS', 'MP', 'FG', 'FGA', 'FG%',
                   '3P', '3PA', '3P%', '2P', '2PA', '2P%', 'eFG%', 'FT', 'FTA', 'FT%',
                   'ORB', 'DRB', 'STL', 'BLK', 'TOV', 'PF']]
           y_train = stephYearly[["TRB", "AST", "PTS"]] # Training data is his 5-year compiledd statistics
           X_test = stephAvgPredict # Test data is an average set, used for prediction
In [107]: X_test = stephAvgPredict[['GS', 'MP', 'FG', 'FGA', 'FG%',
                   '3P', '3PA', '3P%', '2P', '2PA', '2P%', 'eFG%', 'FT', 'FTA', 'FT%',
                   'ORB', 'DRB', 'STL', 'BLK', 'TOV', 'PF']] # Test set, used to predict major statistical categories
In [108]: | lm.fit(X_train,y_train) # Fitting the model to the data set
Out[108]: LinearRegression(copy_X=True, fit_intercept=True, n_jobs=None, normalize=False)
In [109]: prediction = lm.predict(X_test) # Predicting based on adjusted coefficients
In [110]: for i in range(0, 3):
               prediction[0][i] = (prediction[0][i])/(71.6) # Standardizing to per-game statistics
```

**Final Prediction** 

Out[111]: array([[ 5.07857979, 10.7077409 , 23.29896939]])

In [111]: prediction

**Importing Libraries**