```
#!/usr/bin/env python
# coding: utf-8
# In[714]:
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
# In[715]:
get_ipython().run_line_magic('matplotlib', 'inline')
# In[716]:
df13 = pd.read_csv('FB_Data/cfb13.csv')
# In[717]:
df14 = pd.read_csv('FB_Data/cfb14.csv')
# In[718]:
df15 = pd.read_csv('FB_Data/cfb15.csv')
# In[719]:
df16 = pd.read_csv('FB_Data/cfb16.csv')
# In[720]:
df17 = pd.read_csv('FB_Data/cfb17.csv')
# In[721]:
df18 = pd.read_csv('FB_Data/cfb18.csv')
# In[722]:
df19 = pd.read_csv('FB_Data/cfb19.csv')
# In[723]:
df20 = pd.read_csv('FB_Data/cfb20.csv')
# In[724]:
df21 = pd.read_csv('FB_Data/cfb21.csv')
# In[725]:
df22 = pd.read_csv('FB_Data/cfb22.csv')
# In[726]:
df_combined = pd.concat([df13, df14, df15, df16, df17, df18, df19, df20, df21, df22], axis=0)
# In[727]:
df_combined
# In[728]:
x = df_combined[['Games',
'Win',
'Loss',
 'Off.Rank',
'Off.Plays',
 'Off.Yards',
 'Off.Yards.Play',
'Off.TDs',
'Total.TDs',
 'Off.Yards.per.Game',
```

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'Def.Rank',
'Def.Plays',
'Yards.Allowed',
'Yards.Play.Allowed',
'Off.TDs.Allowed',
'Total.TDs.Allowed',
'Yards.Per.Game.Allowed',
'First.Down.Rank',
'First.Down.Runs',
'First.Down.Passes',
'First.Down.Penalties',
'First.Downs',
'First.Down.Def.Rank',
'Opp.First.Down.Runs',
'Opp.First.Down.Passes'
'Opp.First.Down.Penalties',
'Opp.First.Downs',
'X4th.Down.Rank',
'X4th.Attempts',
'X4th.Conversions',
'X4th.Percent',
'X4rd.Down.Def.Rank',
'Opp.4th.Conversion',
'Opp.4th.Attempt',
'Opponent.4th.Percent',
'Kickoff.Return.Rank',
'Kickoffs.Returned',
'Kickoff.Return.Yards',
'Kickoff.Return.Touchdowns',
'Avg.Yard.per.Kickoff.Return',
'Passing.Off.Rank',
'Pass.Attempts',
'Pass.Completions',
'Interceptions.Thrown.x',
'Pass.Yards',
'Pass.Yards.Attempt',
'Yards.Completion',
'Pass.Touchdowns',
'Pass.Yards.Per.Game',
'Pass.Def.Rank',
'Opp.Completions.Allowed',
'Opp.Pass.Attempts',
'Opp.Pass.Yds.Allowed',
'Opp.Pass.TDs.Allowed',
'Yards.Attempt.Allowed',
'Yards.Completion.Allowed',
'Pass.Yards.Per.Game.Allowed',
'Penalty.Rank',
'Penalties',
'Penalty.Yards',
'Penalty.Yards.Per.Game',
'Punt.Return.Rank',
'Punt.Returns',
'Net.Punt.Return.Yards',
'Punt.Return.Touchdowns',
'Avg.Yards.Per.Punt.Return',
'Punt.Return.Def.Rank',
'Opp.Punt.Returns',
'Opp.Net.Punt.Return.Yards',
'Opp.Punt.Return.Touchdowns.Allowed',
'Avg.Yards.Allowed.per.Punt.Return',
'Redzone.Off.Rank',
'Redzone.Attempts',
'Redzone.Rush.TD',
'Redzone.Pass.TD',
'Redzone.Field.Goals.Made',
'Redzone.Scores',
'Redzone.Points',
'Redzone.Def.Rank',
'Opp.Redzone.Attempts',
'Opp.Redzone.Rush.TD.Allowed',
'Opp.Redzone.Pass.Touchdowns.Allowed',
'Opp.Redzone.Field.Goals.Made',
'Opp.Redzone.Scores',
'Redzone.Points.Allowed',
'Rushing.Off.Rank',
'Rush.Attempts',
'Rush.Yds',
'Yards.Rush',
'Rushing.TD',
'Rushing.Yards.per.Game',
'Rushing.Def.Rank',
'Opp.Rush.Attempts',
'Opp.Rush.Yards.Alloweed',
'Yds.Rush.Allowed',
'Opp.Rush.Touchdowns.Allowed',
'Rush.Yards.Per.Game.Allowed',
'Sack.Rank',
'Sacks',
'Sack.Yards',
'Average.Sacks.per.Game',
'Scoring.Def.Rank',
'Touchdowns.Allowed',
'Opponent.Extra.Points',
'X2.Point.Conversions.Allowed',
'Opp.Deflected.Extra.Points',
'Opp.Feild.Goals.Made',
'Opp.Safety',
'Points.Allowed',
'Avg.Points.per.Game.Allowed',
'Scoring.Off.Rank',
'Touchdowns',
'PAT',
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'X2.Point.Conversions',
'Defensive.Points',
'Feild.Goals',
 'Safety',
'Total.Points',
'Points.Per.Game',
 'Tackle.for.Loss.Rank',
'Solo.Tackle.For.Loss',
'Assist.Tackle.For.Loss',
 'Tackle.for.Loss.Yards',
'Total.Tackle.For.Loss',
 'Tackle.For.Loss.Per.Game',
'X3rd.Down.Rank',
'X3rd.Attempts',
 'X3rd.Conversions',
 'X3rd.Percent',
'X3rd.Down.Def.Rank',
 'Opp.3rd.Conversion',
 'Opp.3rd.Attempt',
'Opponent.3rd.Percent',
'Time.of.Possession.Rank',
 'Turnover.Rank',
 'Fumbles.Recovered',
'Opponents.Intercepted',
'Turnovers.Gain',
 'Fumbles.Lost',
 'Interceptions.Thrown.y',
'Turnovers.Lost',
'Turnover.Margin',
 'Avg.Turnover.Margin.per.Game']]
# In[729]:
df\_combined
# In[730]:
# In[731]:
y = df_combined['Win']
# In[732]:
df_combined
# In[733]:
for i in range(0,len(x.columns)):
    x.iloc[:,i] = x.iloc[:,i].fillna(x.iloc[:,i].mean())
# In[734]:
y = y.fillna(y.mean())
# In[735]:
x.isnull().sum()
# In[736]:
x.shape
# In[737]:
x.shape
# In[738]:
y.shape
# In[739]:
from sklearn.model_selection import train_test_split
# In[740]:
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```
from sklearn.linear_model import LinearRegression
# In[741]:
lm = LinearRegression()
# In[742]:
 \texttt{x\_train, x\_test, y\_train, y\_test = train\_test\_split(x, y, test\_size=0.3, random\_state=101) } 
# In[7431:
lm.fit(x_train, y_train)
# In[744]:
lm.coef
# In[745]:
lm.intercept_
# In[746]:
cdf = pd.DataFrame(lm.coef_,x.columns, columns=['Coefficients'])
# In[747]:
cdf
# In[748]:
sns.displot(y, stat='count', kde=True, discrete=True)
# In[749]:
predictions = lm.predict(x_test)
# In[750]:
predictions
# In[751]:
sns.displot(y_test-predictions)
# In[752]:
plt.scatter(y_test, predictions)
# In[753]:
predictComp = pd.DataFrame(zip(df_combined['Team'],y_test, predictions), columns=['Team','real value', 'predicted value'])
# In[754]:
predictComp
# In[755]:
predictComp.to_csv('FB_predictions/combinedFootballPrediction.csv')
# In[756]:
from sklearn.metrics import confusion_matrix, classification_report
# In[757]:
dfFb2 = pd.read_csv('FB_data/collegefootballbowl.csv')
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```
# In[758]:
pd.get_dummies(dfFb2['winner_tie'])
# In[759]:
pd.get_dummies(df_combined['Team'])
# In[760]:
shorter_team_list = []
for i in pd.get_dummies(df_combined['Team']).columns:
    team = ''
     for j in i:
    if j != '(':
        team += j
          else:
break
     shorter_team_list.append(team)
shorter_team_list
# In[761]:
same_team_list = []
for x in pd.get_dummies(dfFb2['winner_tie']).columns:
    for y in shorter_team_list:
    if x.replace(" ", "") == y.replace(" ", ""):
        same_team_list.append(x)
# In[762]:
pd.get_dummies(dfFb2['winner_tie']).columns
# In[763]:
filtered_teams = pd.DataFrame(columns=df_combined.columns)
no_paren_teams = []
for k in df_combined['Team']:
    team = ''
     for n in k:
    if n != '(':
        team+=n
          else:
     no_paren_teams.append(team)
# In[764]:
no_paren_teams
# In[765]:
for i in range(len(no_paren_teams)):
     for j in range(len(same_team ]ist)):
    if no_paren_teams[i].replace(" ", "") == same_team_list[j].replace(" ", ""):
        filtered_teams.loc[len(filtered_teams.index)] = df_combined.iloc[i, :]
# In[766]:
filtered_teams
teamList = filtered_teams['Team']
filtered_teams.isnull().count()
# In[768]:
df_combined.isnull().count()
# In[769]:
team_split = pd.get_dummies(filtered_teams['Team'], drop_first=True)
# In[770]:
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#filtered_teams = pd.concat([team_split, filtered_teams], axis=1)
# In[771]:
filtered_teams
# In[772]:
filtered_teams.drop('Team', inplace=True, axis=1)
# In[773]:
filtered_teams
# In[774]:
filtered_teams[['Time.of.Possession','Average.Time.of.Possession.per.Game']].dropna()
# In[775]:
filtered\_teams['Average.Time.of.Possession.per.Game'][0:111].apply(lambda cols: int(str(cols).split(':')[0])).mean(lambda co
# In[776]:
def convert time(cols):
         try:
                  dateComponents1 = cols[0].split(':')
dateComponents2 = cols[1].split(':')
                  index1 = 0
                  for j in dateComponents1[0]:
    if j == 0:
                                    index1 = dateComponents1[0].index(j)
                   for h in dateComponents1[1]:
                            if h == 0:
                                   index2 = dateComponents1[1].index(h)
                  index3 = 0
                   for k in dateComponents2[0]:
                            if k == 0:
   index3 = dateComponents2[0].index(k)
                  index4 = 0
                   for g in dateComponents2[1]:
                                     index3 = dateComponents2[1].index(g)
                  \textbf{return} \hspace{0.2cm} (\texttt{int}(\texttt{dateComponents1[0][index1:]}) * 60 + \texttt{int}(\texttt{dateComponents1[1][index2:]})), \hspace{0.2cm} (\texttt{int}(\texttt{dateComponents2[0][index3:]}) * 60 + \texttt{int}(\texttt{dateComponents2[1][index4:]})) \\
         except:
    return 381.3783783783784*60, 29.486486486486488*60
convTimes = filtered_teams[['Time.of.Possession','Average.Time.of.Possession.per.Game']].apply(convert_time, axis=1, result_type='expand')
# In[777]:
convTimes
# In[778]:
convTimes.rename(columns={0:'Time.of.Possession_sec', 1:'Average.Time.of.Possession.per.Game_sec'}, inplace=True)
# In[779]:
convTimes
# In[780]:
filtered_teams = pd.concat([filtered_teams, convTimes], axis=1)
# In[781]:
filtered_teams.drop(['Time.of.Possession','Average.Time.of.Possession.per.Game'], axis=1, inplace=True)
# In[782]:
sns.heatmap(filtered_teams.isnull(),yticklabels=False, cbar=False, cmap='viridis')
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# In[783]:
filtered_teams_y = filtered_teams['Win']
filtered_teams_y = filtered_teams_y.fillna(filtered_teams_y.mean())
# In[7841:
filtered_teams.drop(['Kickoff.Return.Def.Rank'], axis=1, inplace=True)
# In[7851:
filtered teams['Avg.Turnover.Margin.per.Game']
# In[786]:
filtered teams x = filtered teams.drop('Win', axis=1)
#filtered_teams_x = filtered_teams_x.iloc[:,:285]
dropIndex = []
for i in range(0,len(filtered teams x.columns)):
        filtered_teams_x.iloc[:,i].fillna(filtered_teams_x.iloc[:,i].mean(), inplace=True)
    except:
        dropIndex.append(filtered_teams_x.columns[i])
# In[787]:
for j in dropIndex:
    filtered_teams_x.drop(j, inplace=True, axis=1)
# In[788]:
dropIndex
# In[789]:
len(filtered_teams_x.columns)
# In[790]:
sns.heatmap(filtered_teams_x.isnull(),yticklabels=False, cbar=False, cmap='viridis')
# In[791]:
def convert_time(cols):
    try:
        dateComponents1 = cols[0].split(':')
dateComponents2 = cols[1].split(':')
        index1 = 0
        for j in dateComponents1[0]:
    if j == 0:
        index1 = dateComponents1[0].index(j)
index2 = 0
        for h in dateComponents1[1]:
                index2 = dateComponents1[1].index(h)
        index3 = 0
        for k in dateComponents2[0]:
                 index3 = dateComponents2[0].index(k)
        for g in dateComponents2[1]:
             if g == 0:
                 index3 = dateComponents2[1].index(g)
        return (int(dateComponents1[0][index1:])*60+int(dateComponents1[1][index2:])), (int(dateComponents2[0][index3:])*60+int(dateComponents2[1][index4:]))
        return 381.3783783783784*60, 29.486486486486488*60
convTimes = df_combined[['Time.of.Possession','Average.Time.of.Possession.per.Game']].apply(convert_time, axis=1, result_type='expand')
convTimes.rename(columns={0:'Time.of.Possession_sec', 1:'Average.Time.of.Possession.per.Game_sec'}, inplace=True)
df_combined = pd.concat([df_combined, convTimes], axis=1)
df_combined.drop(['Time.of.Possession','Average.Time.of.Possession.per.Game'], axis=1, inplace=True)
# In[792]:
df_combined.drop('Team', axis=1, inplace=True)
# In[793]:
```

```
dropIndex = []
for i in range(0,len(df_combined.columns)):
    try:
       df_combined.iloc[:,i].fillna(df_combined.iloc[:,i].mean(), inplace=True)
    except:
    dropIndex.append(df_combined.columns[i])
for j in dropIndex:
    df_combined.drop(j, inplace=True, axis=1)
# In[794]:
sns.heatmap(df_combined.isnull(),yticklabels=False, cbar=False, cmap='viridis')
# In[7951:
x2 = df_combined.drop(['Win','Kickoff.Return.Def.Rank'] , axis=1).iloc[:,:280]
y2 = df_combined['Win']
x_train2, x_test2, y_train2, y_test2 = train_test_split(x2, y2, test_size=0.01, random_state=101)
# In[796]:
linmo = LinearRegression()
# In[797]:
{\tt linmo.fit(x\_train2,\ y\_train2)}
# In[798]:
filtered_teams_x
# In[799]:
# In[800]:
prediction2 = linmo.predict(filtered_teams_x.iloc[:,:280])
# In[801]:
list(set(x2.columns) - set(filtered_teams_x.columns))
# In[802]:
predictComp2 = pd.DataFrame(zip(teamList,filtered_teams_y, prediction2), columns=['Team','real value', 'predicted value'])
# In[803]:
predictComp2
# In[804]:
\verb|predictComp2.to_csv('FB_predictions/linearMergedPrediction', index=True)| \\
# In[805]:
import math
math.sqrt(24*0.76)
# In[806]:
len(teamList)
# In[807]:
len(no_paren_teams)
# In[808]:
len(prediction2)
```

```
# In[809]:
no_paren_TeamList = []
for k in teamList:
    team =
    for n in k:
        if n != '(':
            team+=n
        else:
            break
    no paren TeamList.append(team)
predictComp2 = pd.DataFrame(zip(no paren TeamList,filtered teams y, prediction2), columns=['Team','# of wins real value', '# of wins predicted value'])
# In[810]:
predictComp2.to_csv('FB_predictions/linearMergedPrediction.csv', index=False)
# In[811]:
predictComp2
# In[812]:
filtered_teams_x2 = filtered_teams.drop('Loss', axis=1)
for i in range(0,len(filtered_teams_x2.columns)):
    try:
        filtered_teams_x2.iloc[:,i].fillna(filtered_teams_x2.iloc[:,i].mean(), inplace=True)
    except:
    dropIndex.append(filtered_teams_x2.columns[i])
for j in dropIndex:
    filtered_teams_x2.drop(j, inplace=True, axis=1)
sns.heatmap(filtered_teams_x2.isnull(),yticklabels=False, cbar=False, cmap='viridis')
# In[813]:
x3 = df_combined.drop(['Loss','Kickoff.Return.Def.Rank'] , axis=1).iloc[:,:280]
y3 = df_combined['Loss']
x_train3, x_test3, y_train3, y_test3 = train_test_split(x3, y3, test_size=0.01, random_state=101)
linmo2 = LinearRegression()
limmo2.fit(x_train3, y_train3)
prediction3 = linmo2.predict(filtered_teams_x2.iloc[:,:280])
predictComp3 = pd.DataFrame(zip(filtered_teams_y2, prediction3), columns=['#_of_losses_real value', '#_of_losses_predicted value'])
# In[814]:
df_combined
# In[815]:
predictComp2 = pd.concat([predictComp2, predictComp3],axis=1)
# In[816]:
predictComp3
# In[817]:
predictComp2.to_csv('FB_predictions/linearMergedPrediction.csv', index=False)
# In[ ]:
# In[ ]:
```