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#!/usr/bin/env python
 # coding: utf-8
 # In[680]:
 import numpy as np
 import pandas as pd
import pandas as put
import seaborn as sns
import matplotlib.pyplot as plt
from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix
get_ipython().run_line_magic('matplotlib', 'inline')
# In[681]:
df = pd.read_csv('collegefootballbowl.csv')
 # In[682]:
df
 # In[683]:
df.shape
 # In[684]:
df.isnull()
 # In[685]:
sns.heatmap(df.isnull(), yticklabels=False, cbar=True, cmap='viridis')
 # In[686]:
df.head()
 # In[687]:
df.drop('winner_rank', axis=1, inplace=True)
 # In[688]:
df.drop('loser_rank', axis=1, inplace=True)
 # In[689]:
df.drop('sponsor', axis=1, inplace=True)
 # In[690]:
df.shape
 # In[691]:
sns.heatmap(df.isnull(), yticklabels=False, cbar=True, cmap='viridis')
 # In[692]:
df.dropna(inplace=True)
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# In[693]:
 winner_tie = pd.get_dummies(df['winner_tie'], drop_first=True)
 # In[694]:
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loser_tie = pd.get_dummies(df['loser_tie'], drop_first=True)
# In[695]:
mvp = pd.get_dummies(df['mvp'], drop_first=True)
# In[696]:
bowl_name = pd.get_dummies(df['bowl_name'], drop_first=True)
# In[697]:
df = pd.concat([df, day, winner_tie], axis=1)
# In[698]:
df.iloc[:,162] #Wyoming last winner tie col
# In[699]:
df = pd.concat([df, loser_tie], axis=1)
# In[700]:
df.iloc[:,315] #Wyoming last loser_tie col
# In[701]:
df = pd.concat([df, mvp, bowl_name], axis=1)
# In[702]:
df.drop('day',axis=1,inplace=True)
df.drop('winner_tie',axis=1,inplace=True)
df.drop('loser_tie',axis=1,inplace=True)
df.drop('mvp',axis=1,inplace=True)
df.drop('bowl_name',axis=1,inplace=True)
sns.heatmap(df.isnull(), yticklabels=False, cbar=True, cmap='viridis')
# In[703]:
df.isnull()
# In[704]:
df.dropna().shape
# In[705]:
df.shape
# In[706]:
# In[707]:
import datetime as dt
import time
def convDate(cols):
   dateComponents = cols[2].split('/')
   month = ""
     for v1 in dateComponents[0]:
         if v1 != "0":
month += v1
               print(month)
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date = ""
    for v2 in dateComponents[1]:
       if v2 != "0":
date += v2
           print(date)
    date_time = dt.datetime(int(dateComponents[2]), int(month), int(date))
    print(date_time)
    return time.mktime(date_time.timetuple())
df['date'] = df.apply(convDate, axis=1)
# In[708]:
df
# In[709]:
df.dropna().shape
# In[710]:
df.shape
# In[711]:
sns.heatmap(df.isnull(),cmap='viridis', yticklabels=False, cbar=True)
# In[712]:
from sklearn.model_selection import train_test_split
# In[713]:
df
# In[714]:
df.columns
# In[715]:
print(df.columns)
# In[716]:
def homeWin(cols):
   winPtn = cols[3]
losePtn = cols[4]
if winPtn > losePtn + 10:
        return 1
   else:
       return 0
df['landslide'] = df.apply(homeWin, axis=1)
# In[717]:
# In[718]:
x = df.drop('landslide', axis=1)
y = df['landslide']
# In[719]:
x_train, x_test, y_train, y_test = train_test_split(x,y,test_size=0.3, random_state=101)
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# In[720]:
from sklearn.linear_model import LogisticRegression
# In[721]:
logmodel = LogisticRegression(max iter=10000)
# In[722]:
logmodel.fit(x train, y train)
# In[7231:
predictions = logmodel.predict(x_test)
# In[724]:
predictions
# In[725]:
print(confusion_matrix(y_test, predictions))
print(classification_report(y_test, predictions))
# In[726]:
df.columns[12:158]
team_wins = []
for j in range(146):
    team_win = pd.DataFrame(columns=df.columns)
for i in range(1355):
   if df.iloc[i, j+12] == 1:
                 team_win.loc[len(team_win.index)] = df.iloc[i]
    print(team_win)
    print("\n")
    team_wins.append(team_win)
team_wins[1].iloc[:,13]
len(team_wins)
team_predictions_winner = []
    team_predictions_winner.append(logmodel.predict(team_wins[i].drop('landslide', axis=1)))
team loses = []
for j in range(146):
    team_lose = pd.DataFrame(columns=df.columns)
for i in range(1355):
    if df.iloc[i, j+158] == 1:
                 team_lose.loc[len(team_lose.index)] = df.iloc[i]
    print(team lose)
    team_loses.append(team_lose)
team_predictions_loser = []
for i in range (146):
    team_predictions_loser.append(logmodel.predict(team_loses[i].drop('landslide', axis=1)))
# In[727]:
df.iloc[:,12]
# In[728]:
team_predictions_winner
# In[729]:
def calc_landslide_rate(team_predictions):
   landslide_rate = []
for i in range(len(team_predictions)):
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avg = 0
         for j in range(len(team_predictions[i])):
         avg += team predictions[i][j]
avg /= len(team_predictions[i])
landslide_rate.append(avg)
    return landslide_rate
landslide_rate_win = calc_landslide_rate(team_predictions_winner)
landslide_rate_lose = calc_landslide_rate(team_predictions_loser)
# In[730]:
team_wins[3]
# In[731]:
len(landslide_rate_lose)
# In[732]:
print(landslide_rate_win, landslide_rate_lose)
# In[733]:
landslideLogDf = pd.DataFrame({'team_name': winner_tie.columns, 'prob_landslide_winning': landslide_rate_win,
                                  'prob_landslide_losing': landslide_rate_lose},
columns=['team_name','prob_landslide_winning', 'prob_landslide_losing'])
# In[734]:
landslideLogDf
# In[735]:
landslideLogDf.to_csv('FB_predictions/landslide_probability_logistic.csv', index=False)
# In[736]:
from sklearn.neighbors import KNeighborsClassifier
# In[737]:
from sklearn.preprocessing import StandardScaler
# In[738]:
scaler = StandardScaler()
# In[739]:
scaler.fit(df.drop('landslide', axis=1))
# In[740]:
scaled_features = scaler.transform(df.drop('landslide', axis=1))
# In[741]:
scaled_features
# In[742]:
df_feat = pd.DataFrame(scaled_features, columns=df.columns[:-1])
# In[743]:
x_KNN = df_feat
y_KNN = df['landslide']
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x_train_KNN, x_test_KNN, y_train_KNN, y_test_KNN = train_test_split(x,y, test_size=0.3, random_state=101)
# In[744]:
error_rate = []
for i in range(1,500):
    knn = KNeighborsClassifier(n_neighbors=i)
    knn.fit(x_train_KNN, y_train_KNN)
predictions = knn.predict(x_test_KNN)
    error_rate.append(np.mean(predictions != y_test_KNN))
# In[745]:
predictions = knn.predict(x_test_KNN)
# In[746]:
predictions
# In[747]:
plt.figure(figsize=(10,6))
plt.plot(range(1,500), error_rate, color='green', linestyle='dashed', marker='*', markerfacecolor='red',markersize='5') plt.title('Error Rate vs K Value')
plt.xlabel('K')
plt.ylabel('Error Rate')
# In[748]:
error_rate.index(min(error_rate))
# In[749]:
scaler2 = StandardScaler()
knn2 = KNeighborsClassifier(n_neighbors=118)
knn2.fit(x_train_KNN, y_train_KNN)
# In[750]:
landslide_predictions_win_knn = []
landslide_predictions_lose_knn = []
for i in range(len(team wins)):
    landslide predictions_win_knn.append(knn2.predict(team_wins[i].drop('landslide', axis=1)))
    landslide_predictions_lose_knn.append(knn2.predict(team_loses[i].drop('landslide', axis=1)))
# In[751]:
print(classification_report(team_wins[0]['landslide'], landslide_predictions_win_knn[0]))
# In[752]:
print(confusion_matrix(team_wins[0]['landslide'], landslide_predictions_win_knn[0]))
# In[753]:
landslide_rate_win_knn = calc_landslide_rate(landslide_predictions_win_knn)
landslide_rate_lose_knn = calc_landslide_rate(landslide_predictions_lose_knn)
# In[754]:
landslideKnnDf = pd.DataFrame({'team_name': winner_tie.columns, 'prob_landslide_winning': landslide_rate_win_knn,
                                    'prob_landslide_losing': landslide_rate_lose_knn},
                                 columns=['team_name','prob_landslide_winning', 'prob_landslide_losing'])
# In[7551:
landslideKnnDf
# In[756]:
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landslideKnnDf.to_csv('FB_predictions/landslide_probability_knn.csv', index=False)
# In[757]:
from sklearn.ensemble import RandomForestClassifier
# In[758]:
rfc = RandomForestClassifier(n_estimators=1000)
# In[759]:
rfc.fit(x_train, y_train)
# In[760]:
landslide_predictions_win_rfc = []
landslide_predictions_lose_rfc = []
for i in range(len(team_wins)):
    landslide_predictions_win_rfc.append(rfc.predict(team_wins[i].drop('landslide', axis=1)))
    landslide_predictions_lose_rfc.append(rfc.predict(team_loses[i].drop('landslide', axis=1)))
# In[761]:
landslide_rate_win_rfc = calc_landslide_rate(landslide_predictions_win_rfc)
landslide_rate_lose_rfc = calc_landslide_rate(landslide_predictions_lose_rfc)
# In[762]:
landslide_rate_win_rfc
# In[763]:
landslideRFCDf = pd.DataFrame({'team_name': winner_tie.columns, 'prob_landslide_winning': landslide_rate_win_rfc,
                                'prob_landslide_losing': landslide_rate_lose_rfc},
                              columns=['team_name','prob_landslide_winning', 'prob_landslide_losing'])
# In[764]:
landslideKnnDf
# In[765]:
landslideKnnDf.to_csv('FB_predictions/landslide_probability_rfc.csv', index=False)
# In[766]:
from sklearn.svm import SVC
# In[767]:
c = []
gamma = []
for i in range(1,1001,5):
   c.append(0.001*i)
    gamma.append(1/i)
param_grid = {'C': c, 'gamma': gamma}
# In[768]:
param_grid
# In[769]:
from sklearn.model_selection import GridSearchCV
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# In[770]:
grid = GridSearchCV(SVC(), {'C':[0.1,1,10,100,1000], 'gamma':[1,0.1,0.01,0.001,0.0001]}, verbose=10000, refit=True)
# In[771]:
grid.fit(x_train, y_train)
# In[772]:
grid.best_estimator_
# In[773]:
grid.best_params_
# In[774]:
from sklearn.cluster import KMeans
# In[7751:
kmeans = KMeans(n_clusters=2)
# In[776]:
kmeans.fit(x_train, y_train)
# In[777]:
print(classification_report(y_train, kmeans.labels_))
# In[778]:
landslide_predictions_win_svc = []
landslide_predictions_lose_svc = []
for i in range(len(team_wins)):
    landslide predictions_win_svc.append(grid.predict(team_wins[i].drop('landslide', axis=1)))
landslide_predictions_lose_svc.append(grid.predict(team_loses[i].drop('landslide', axis=1)))
landslide_rate_win_svc = calc_landslide_rate(landslide_predictions_win_svc)
landslide_rate_lose_svc = calc_landslide_rate(landslide_predictions_lose_svc)
# In[779]:
landslide_rate_win_svc
# In[780]:
landslide_rate_lose_svc
# In[781]:
# In[782]:
landslideSVCDf
# In[783]:
landslideSVCDf.to_csv('FB_predictions/landslide_probability_SVC.csv', index=False)
# In[784]:
```

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team loses
# In[785]:
team_wins
# In[786]:
landslideKnnDf.rename(columns={
     'prob_landslide_winning':'prob_landslide_winning_knn',
'prob_landslide_losing': 'prob_landslide_losing_knn'), inplace=True)
landslideLogDf.rename(columns={
    'prob_landslide_winning':'prob_landslide_winning_log',
'prob_landslide_losing': 'prob_landslide_losing_log'}, inplace=True)
landslideRFCDf.rename(columns={
     'prob landslide winning': 'prob_landslide_winning_rfc',
'prob_landslide_losing': 'prob_landslide_losing_rfc'}, inplace=True)
landslideSVCDf.rename(columns={
     'prob_landslide_winning':'prob_landslide_winning_svc',
'prob_landslide_losing': 'prob_landslide_losing_svc'}, inplace=True)
# In[787]:
landslideCombined = pd.concat([landslideKnnDf, landslideLoqDf.iloc[:, 1:3], landslideRFCDf.iloc[:, 1:3], landslideSVCDf.iloc[:, 1:3]], axis=1)
# In[788]:
DLlandslideDf = pd.read_csv("FB_predictions/DL_football_prediction_winner.csv")
landslideCombined = pd.concat([landslideCombined, DLlandslideDf], axis=1)
# In[789]:
DLlandslideDf
# In[790]:
landslide_win_ori = []
for i in range(len(team_wins)):
    landslide_ori_single = []
    for j in range(len(team_wins[i])):
         landslide_ori_single.append(team_wins[i].loc[j, 'landslide'])
    landslide_win_ori.append(landslide_ori_single)
# In[791]:
landslide_rate_win_ori = calc_landslide_rate(landslide_win_ori)
# In[792]:
landslide rate win ori
# In[793]:
landslide_lose_ori = []
for i in range(len(team_loses)):
    landslide_ori_single = []
    for j in range(len(team_loses[i])):
    landslide_ori_single.append(team_loses[i].loc[j, 'landslide'])
    landslide_lose_ori.append(landslide_ori_single)
# In[794]:
landslide rate lose ori = calc landslide rate(landslide lose ori)
# In[795]:
len(landslide_rate_win_ori)
# In[796]:
```

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landslideRateActualDf = pd.DataFrame(columns = ['actual\_landslide\_winning', 'actual\_landslide\_losing'], \\
                                       data={'actual_landslide_winning': landslide_rate_win_ri, 'actual_landslide_losing': landslide_rate_lose_ori})
landslideCombined = pd.concat([landslideCombined, landslideRateActualDf], axis=1)
# In[797]:
landslideRateActualDf
# In[7981:
landslideCombined.rename(columns={'team_name':'Team'}, inplace=True)
# In[799]:
winNumDf = pd.read_csv('FB_predictions/linearMergedPrediction.csv')
# In[800]:
winNumDf
# In[801]:
landslideCombined.to_csv('FB_predictions/landslideRatePredictions.csv', index=False)
# In[802]:
newTeamName1 = []
for i in landslideCombined['Team']:
    \verb"newTeamName1.append(i.strip().replace("", "").lower())"
newTeamName2 = []
for i in winNumDf['Team']:
    newTeamName2.append(i.strip().replace(" ", "").lower())
# In[803]:
newTeamName1
# In[804]:
newTeamName2
# In[805]:
{\tt landslideCombined = pd.concat([pd.Series(newTeamName1), landslideCombined], axis=1)}
landslideCombined.rename(columns={0:'Team_trim'}, inplace=True)
# In[806]:
landslideCombined
# In[807]:
winNumDf = pd.concat([pd.Series(newTeamName2), winNumDf], axis=1)
winNumDf.rename(columns={0:'Team_trim'}, inplace=True)
# In[808]:
mergedDf = pd.merge(landslideCombined, winNumDf, how='inner', on='Team_trim')
# In[809]:
mergedDf
# In[810]:
```

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mergedDfFinal = mergedDf.drop('Team_trim', inplace=False, axis=1)
# In[811]:
mergedDfFinal.rename(columns={'Team_x':'Team_Name'}, inplace=True)
# In[812]:
mergedDfFinal.drop('Team_y', axis=1, inplace=True)
# In[813]:
mergedDfFinal = pd.concat([mergedDf['Team_trim'], mergedDfFinal], axis=1)
mergedDfFinal.head(25)
# In[814]:
mergedDfFinal.to_csv('FB_predictions/combined_all_predictions.csv', index=False)
# In[815]:
import math
def calculate team perf(cols):
   winning_landslide_rates = 1 + np.mean(np.array([cols[1],cols[3],cols[5],cols[7], cols[9]]).astype(float))
   losing_landslide_rates = 1 + np.mean(np.array([cols[2],cols[4],cols[6],cols[8], cols[10]]).astype(float))
   win_predicted = 1 + cols[13]
loss_predicted = 1 + cols[15]
   return 1 / (1 + math.exp(-(
       (win_predicted * winning_landslide_rates)/(loss_predicted*losing_landslide_rates)
teamPerf = mergedDfFinal.iloc[:, 1:].apply(calculate_team_perf, axis=1)
# In[816]:
mergedDfFinal
# In[817]:
teamPerf
# In[818]:
# In[819]:
teamPerfDf
# In[820]:
teamPerfDf = pd.concat([teamPerfDf.iloc[:,-1:], teamPerfDf.iloc[:, 1], teamPerfDf.iloc[:,0]], axis=1)
# In[821]:
teamPerfDf
# In[822]:
teamPerfDfCombined = pd.DataFrame(columns=teamPerfDf.columns)
teamPerfArr = []
rowInitial = teamPerfDf.iloc[0,:]
for i in range(0, teamPerfDf.shape[0]):
    if rowInitial[0] == teamPerfDf.iloc[i,0]:
       teamPerfArr.append(teamPerfDf.iloc[i,2])
       print(teamPerfArr)
       teamPerfDfCombined.loc[len(teamPerfDfCombined.index)] = [rowInitial[0], rowInitial[1], np.mean(teamPerfArr)]
       teamPerfArr = []
       rowInitial = teamPerfDf.iloc[i,:]
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# In[823]:
teamPerfDfCombined
# In[824]:
teamPerfDf
# In[825]:
teamPerfDfCombined.to_csv('FB_predictions/combinedPerfIndicators.csv', index=False)
# In[826]:
np.exp(1)
# In[827]:
mergedDfFinal
# In[828]:
pd.get_dummies(mergedDfFinal['Team_trim'], drop_first=True)
# In[829]:
teamPerfDfCombined
# In[830]:
x_train
# In[831]:
y_train.to_csv('FB_predictions/y_train(landslide_rate).csv', index=False)
# In[832]:
x_train.to_csv('FB_predictions/x_train.csv', index=False)
# In[833]:
df.to_csv('FB_predictions/df.csv', index=False)
# In[ ]:
# In[ ]:
```