Soccer

October 12, 2019

```
[1]: import numpy as np
    import pandas as pd
    import matplotlib.pyplot as plt
    import sqlite3
    import seaborn as sns
    conn = sqlite3.connect('database.sqlite')
    c = conn.cursor()
    # Country Data COUNTRY table
    COUNTRY_df = pd.read_sql_query("select * from COUNTRY;", conn)
    # League data from LEAGUE
    LEAGUE_df = pd.read_sql_query("select * from LEAGUE;", conn)
    # Match data from Matches - just pulling 1 year for now -2015/2016 might be
    → latest year
    # You can remove restriction if you want
    #MATCH_df = pd.read_sql_query("select * from MATCH where SEASON = '2015/2016';
    \rightarrow", conn)
    # Match data from Matches - just pulling 1 and relevant data for now - we can
     →remove restriction later if we want
    MATCH_df = pd.read_sql_query("SELECT_DATE, LEAGUE_ID, HOME_TEAM_API_ID, L
     →AWAY_TEAM_API_ID, HOME_TEAM_GOAL, AWAY_TEAM_GOAL FROM MATCH WHERE SEASON = U
     \leftrightarrow '2015/2016';",
    conn)
    PLAYER_df = pd.read_sql_query("select * from PLAYER;", conn)
    PLAYER_ATTRIBUTES_df = pd.read_sql_query("select * from PLAYER_ATTRIBUTES;", __
     →conn)
    TEAM_df = pd.read_sql_query("select * from TEAM;", conn)
    TEAM_ATTRIBUTES_df = pd.read_sql_query("select * from TEAM_ATTRIBUTES;", conn)
```

1 We calculate the "differential" for both the home team and away team

```
[2]: MATCH_df["HOME_DIFF"] = MATCH_df["home_team_goal"] - MATCH_df["away_team_goal"]

MATCH_df["AWAY_DIFF"] = MATCH_df["away_team_goal"] - MATCH_df["home_team_goal"]
```

```
MATCH_home_df=MATCH_df.loc[:,["date","home_team_api_id",__
     →"HOME_DIFF","league_id","away_team_api_id"]]
   MATCH_away_df=MATCH_df.loc[:,["date","away_team_api_id",_
    →"AWAY DIFF", "league id", "home team api id"]]
[3]: MATCH_away_df['W'] = 0
   MATCH away df['L'] = 0
   MATCH_away_df['T'] = 0
   MATCH home df['W'] = 0
   MATCH_home_df['L'] = 0
   MATCH_home_df['T'] = 0
   MATCH_away_df.loc[MATCH_away_df.AWAY_DIFF >0, 'W'] = 1
   MATCH_away_df.loc[MATCH_away_df.AWAY_DIFF <0, 'L'] = 1
   MATCH_away_df.loc[MATCH_away_df.AWAY_DIFF ==0, 'T'] = 1
   MATCH_home_df.loc[MATCH_home_df.HOME_DIFF >0, 'W'] = 1
   MATCH_home_df.loc[MATCH_home_df.HOME_DIFF <0, 'L'] = 1
   MATCH_home_df.loc[MATCH_home_df.HOME_DIFF ==0, 'T'] = 1
   MATCH_away_df.head(5)
[3]:
                           away_team_api_id AWAY_DIFF
                     date
                                                        league id \
   0 2015-07-24 00:00:00
                                        8342
                                                     -1
                                                                 1
   1 2015-07-25 00:00:00
                                        9985
                                                     -1
                                                                 1
   2 2015-07-25 00:00:00
                                                    -2
                                                                 1
                                        1773
   3 2015-07-25 00:00:00
                                        8203
                                                     -2
                                                                 1
   4 2015-07-25 00:00:00
                                                     -2
                                                                 1
                                        9994
      home_team_api_id W L T
   0
                  9997 0 1 0
                  8571 0 1 0
   1
   2
                  9987 0 1 0
   3
                  8573 0 1
   4
                  10000 0 1 0
```

2 We combine the home team data with the away team data to create 1 list of games, with the differential

```
[4]: MATCH_home_df = MATCH_home_df.rename(columns={"home_team_api_id":_\

→"team_api_id","HOME_DIFF":"DIFF","away_team_api_id":"opponent"})

MATCH_away_df = MATCH_away_df.rename(columns={"away_team_api_id":_\

→"team_api_id","AWAY_DIFF":"DIFF","home_team_api_id":"opponent"})

MATCH_away_df.head()
```

```
frames = [MATCH_home_df, MATCH_away_df]
    all_games_unsorted = pd.concat(frames)
    all_games = all_games_unsorted.sort_values(by=["team_api_id","date"])
    all_games.reset_index(inplace=True)
    all_games.head()
[4]:
       index
                             date
                                   team_api_id DIFF
                                                       league_id opponent W
                                                                               L
        1995
             2015-07-18 00:00:00
                                           1601
                                                   -2
                                                           15722
                                                                      8019 0
                                                                               1
                                                                                  0
        2084 2015-07-24 00:00:00
                                           1601
                                                    2
                                                           15722
                                                                      8028 1
    1
                                                                               0
                                                                                  0
    2
        2173 2015-08-03 00:00:00
                                           1601
                                                    1
                                                           15722
                                                                      8245 1
                                                                               0
                                                                                  0
        2188 2015-08-10 00:00:00
                                                                      8033 0
    3
                                           1601
                                                    0
                                                           15722
                                                                               0
                                                                                  1
        2197 2015-08-16 00:00:00
                                           1601
                                                   -1
                                                           15722
                                                                      1957 0 1 0
[5]: ### We want to figure out the what the differential was for the next game as
    ⇔well.
    ### We will make a copy of the table, and add "ng_" as a suffix to the columns_{\sqcup}
    → for "next game"
    next_game_unsorted = all_games.copy()
    next game unsorted = next game unsorted.rename(columns={"DIFF": "ng DIFF",
    "team_api_id": "ng_team_api_id2",
    "league_id": "ng_league_id",
    "date": "ng_date",
    "W": "ng_W",
    "L": "ng_L",
    "T": "ng_T" })
    next_game = next_game unsorted.sort_values(by=["ng team_api_id2","ng date"])
    next_game.head()
[5]:
       index
                          ng_date ng_team_api_id2 ng_DIFF ng_league_id \
        1995 2015-07-18 00:00:00
                                               1601
                                                          -2
                                                                     15722
    0
        2084 2015-07-24 00:00:00
                                               1601
                                                           2
                                                                     15722
    1
    2
        2173 2015-08-03 00:00:00
                                               1601
                                                           1
                                                                     15722
        2188 2015-08-10 00:00:00
                                               1601
                                                           0
                                                                     15722
    3
        2197 2015-08-16 00:00:00
                                               1601
                                                          -1
                                                                     15722
       opponent ng_W ng_L ng_T
    0
           8019
                    0
                          1
                                0
    1
           8028
                    1
                          0
                                0
    2
           8245
                          0
                                0
                    1
    3
           8033
                    0
                          0
                                1
    4
           1957
                    0
                          1
                                0
```

3 We will merge the original data to the copy, but shift the copy data by one row, so it will line up with the next game

```
[6]: \#df\_complete = pd.merge(all\_games, next\_game.shift(-1).fillna(0).astype(int),_{\sqcup}
    → left_index=True, right_index=True)
   df complete = pd.merge(all games, next game.shift(-1).fillna(0),
     →left_index=True, right_index=True)
   df_complete.head()
[6]:
      index_x
                                     team_api_id DIFF
                                                        league_id opponent_x
   0
         1995 2015-07-18 00:00:00
                                            1601
                                                    -2
                                                            15722
                                                                         8019
                                                                               0
                                            1601
   1
         2084 2015-07-24 00:00:00
                                                     2
                                                            15722
                                                                         8028
                                                                               1
   2
         2173 2015-08-03 00:00:00
                                            1601
                                                     1
                                                            15722
                                                                         8245
   3
         2188 2015-08-10 00:00:00
                                            1601
                                                     0
                                                            15722
                                                                         8033
                                                                               0
         2197 2015-08-16 00:00:00
                                            1601
                                                    -1
                                                            15722
                                                                         1957 0
            index y
                                  ng_date ng_team_api_id2 ng_DIFF ng_league_id \
             2084.0 2015-07-24 00:00:00
                                                    1601.0
                                                                2.0
                                                                          15722.0
   1
             2173.0 2015-08-03 00:00:00
                                                    1601.0
                                                                1.0
                                                                          15722.0
             2188.0 2015-08-10 00:00:00
                                                    1601.0
                                                                0.0
                                                                          15722.0
   3 0 1
             2197.0 2015-08-16 00:00:00
                                                    1601.0
                                                               -1.0
                                                                          15722.0
   4 1 0
             2204.0 2015-08-22 00:00:00
                                                                3.0
                                                    1601.0
                                                                          15722.0
      opponent_y ng_W ng_L ng_T
   0
          8028.0
                    1.0
                          0.0
                                0.0
   1
          8245.0
                   1.0
                          0.0
                                0.0
   2
          8033.0
                   0.0
                         0.0
                                1.0
   3
          1957.0
                   0.0
                         1.0
                                0.0
        177361.0
                    1.0
                         0.0
                                0.0
```

4 Oops! For the last game of the season (where we don't have a next game), checking the next game would have returned the next team's first game. We should just zero that out.

```
[7]: #df.loc[df.First_name == 'Bill', 'name_match'] = 'Match'
    df_complete.sort_values(by=["team_api_id","date"]).head()
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng_DIFF"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng_league_id"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "opponent_y"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng_date"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng_date"] = 0
```

```
"ng W"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng L"] = 0
    df_complete.loc[df_complete.team_api_id != df_complete.ng_team_api_id2,
    "ng T"] = 0
    df_complete.head()
[7]:
       index_x
                                date
                                      team_api_id DIFF
                                                         league_id opponent_x
                                                                                 W
          1995 2015-07-18 00:00:00
                                             1601
                                                     -2
                                                              15722
                                                                           8019
                                                                                 0
                2015-07-24 00:00:00
                                             1601
                                                      2
                                                              15722
    1
          2084
                                                                           8028
                                                                                 1
    2
          2173 2015-08-03 00:00:00
                                             1601
                                                      1
                                                              15722
                                                                           8245
                                                                                 1
          2188 2015-08-10 00:00:00
                                             1601
                                                      0
                                                                           8033
                                                                                 0
    3
                                                              15722
    4
          2197 2015-08-16 00:00:00
                                             1601
                                                     -1
                                                              15722
                                                                           1957
                                                                                 0
       L
         Τ
             index_y
                                   ng_date ng_team_api_id2 ng_DIFF ng_league_id \
    0
       1
          0
              2084.0
                      2015-07-24 00:00:00
                                                     1601.0
                                                                  2.0
                                                                            15722.0
       0
          0
              2173.0
                      2015-08-03 00:00:00
                                                     1601.0
                                                                  1.0
                                                                            15722.0
    1
                                                                  0.0
    2
      0
         0
              2188.0
                      2015-08-10 00:00:00
                                                     1601.0
                                                                            15722.0
                                                                            15722.0
    3
      0
         1
              2197.0
                      2015-08-16 00:00:00
                                                     1601.0
                                                                 -1.0
              2204.0 2015-08-22 00:00:00
                                                                  3.0
                                                                            15722.0
       1
          0
                                                     1601.0
       opponent_y ng_W
                         ng_L
                              ng_T
    0
           8028.0
                    1.0
                          0.0
                                0.0
    1
           8245.0
                    1.0
                          0.0
                                0.0
    2
           8033.0
                    0.0
                          0.0
                                1.0
    3
           1957.0
                    0.0
                          1.0
                                0.0
    4
         177361.0
                          0.0
                                0.0
                    1.0
```

5 Let's delete all the extra columns we created

```
[8]: #df_complete.drop(['index_x', 'index_y', 'ng_date', 'ng_league_id'], axis=1,_
     → inplace=True)
    df_complete.drop(['ng_date', 'ng_league_id'], axis=1, inplace=True)
    df_complete.head()
[8]:
       index x
                                date
                                      team_api_id
                                                   DIFF
                                                          league_id
                                                                     opponent_x
                                                                                  W
    0
          1995
                2015-07-18 00:00:00
                                             1601
                                                      -2
                                                              15722
                                                                            8019
                                                                                  0
          2084 2015-07-24 00:00:00
                                             1601
                                                       2
    1
                                                              15722
                                                                            8028
                                                                                  1
    2
          2173 2015-08-03 00:00:00
                                             1601
                                                       1
                                                                            8245
                                                              15722
                                                                                  1
    3
          2188 2015-08-10 00:00:00
                                                       0
                                                                            8033
                                             1601
                                                              15722
                                                                                  0
                2015-08-16 00:00:00
          2197
                                             1601
                                                      -1
                                                              15722
                                                                            1957
                                                                                  0
      L T
             index_y ng_team_api_id2 ng_DIFF
                                                 opponent_y ng_W ng_L
                                                                          ng_T
       1
              2084.0
                                1601.0
                                            2.0
                                                      8028.0
                                                               1.0
                                                                     0.0
                                                                            0.0
    0
       0
          0
              2173.0
                                1601.0
                                            1.0
                                                      8245.0
                                                                     0.0
                                                                            0.0
    1
                                                               1.0
    2
       0
         0
              2188.0
                                1601.0
                                            0.0
                                                      8033.0
                                                               0.0
                                                                     0.0
                                                                            1.0
    3
       0
              2197.0
                                1601.0
                                           -1.0
                                                      1957.0
                                                               0.0
                                                                            0.0
         1
                                                                     1.0
```

6 Now, lets find the most dominant team. We will do that by grouping by the bext team

```
[9]: df_teams = df_complete.groupby(['league_id','team_api_id'], as_index=False).
    team_merge = pd.merge(df_teams, TEAM_df, on="team_api_id")
    team_merge.tail()
[9]:
         league_id
                   team_api_id
                                  index_x
                                           DIFF
                                                                   L
                                                                       Τ
                                                 opponent_x
                                                                           index_y
             24558
                                   116479
                                            -25
                                                     354444
                                                              10
                                                                          116478.0
    183
                          10190
                                                                  18
                                                                       8
    184
             24558
                          10191
                                   116489
                                             -9
                                                     354440 10
                                                                  15
                                                                          116491.0
                                                                      11
    185
             24558
                          10192
                                   116498
                                             31
                                                     354436
                                                             20
                                                                  7
                                                                          113596.0
    186
             24558
                          10199
                                   116463
                                              9
                                                     354408
                                                             15
                                                                  12
                                                                          116089.0
    187
             24558
                          10243
                                   116522
                                            -23
                                                     354232
                                                                  16
                                                                      13
                                                                          113997.0
         ng_team_api_id2 ng_DIFF opponent_y ng_W ng_L ng_T
                                                                      id \
    183
                366841.0
                            -27.0
                                      346548.0
                                                 9.0
                                                      18.0
                                                              8.0
                                                                   49479
                                      344484.0 10.0
                                                      14.0
                                                             11.0
    184
                366877.0
                             -7.0
                                                                   49837
    185
                             31.0
                                      344193.0 20.0
                                                       7.0
                                                              8.0
                366914.0
                                                                   49117
                               9.0
                                      344229.0 15.0 12.0
                                                              8.0
    186
                367170.0
                                                                   49121
                                                 7.0 16.0
                                                             12.0
    187
                368754.0
                            -23.0
                                      344040.0
                                                                  49124
         team_fifa_api_id team_long_name team_short_name
    183
                    898.0
                            FC St. Gallen
                                                       GAL
    184
                   1715.0
                                   FC Thun
                                                       THU
                                                        YΒ
    185
                    900.0 BSC Young Boys
    186
                    897.0
                                 FC Luzern
                                                       LUZ
    187
                    894.0
                                FC Zürich
                                                       ZUR
```

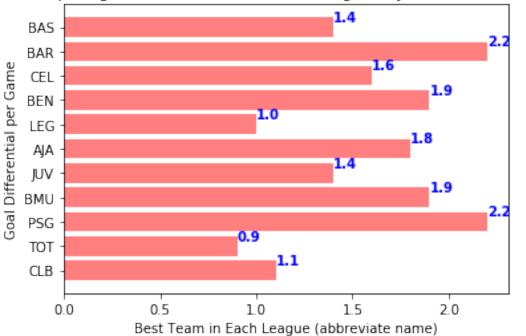
For each league, we will append the team that has the maximum Differential. These are our dominant teams, their seasonal goal differentials, and their goal differentials per game.

```
[10]: leagues = team_merge.league_id.unique()
    x = []
    y = []
    a = []
    b = []
    c = []
    name = []
    #df_test['DIFF'] = df_test['DIFF'].apply(np.array)
    for l in leagues:
```

```
df_test = team_merge[team_merge.league_id == 1]
         x.append(df_test['team_api_id'].loc[df_test['DIFF'].idxmax()])
         name.append(df_test['team_short_name'].loc[df_test['DIFF'].idxmax()])
         #change "team_api_id" to "team_short_name" for Dominant Team Comparison_
      \rightarrow barchart
         v.append(df test['DIFF'].loc[df test['DIFF'].idxmax()])
         a.append(df_test['W'].loc[df_test['DIFF'].idxmax()])
         b.append(df_test['L'].loc[df_test['DIFF'].idxmax()])
         c.append(df_test['T'].loc[df_test['DIFF'].idxmax()])
     d = [x + y + z \text{ for } x, y, z \text{ in } zip(a, b, c)]
     diff_per_game = [i/j for i,j in zip(y, d)]
     diff_per_game = [ round(elem, 1) for elem in diff_per_game]
     diff_per_game
[10]: [1.1, 0.9, 2.2, 1.9, 1.4, 1.8, 1.0, 1.9, 1.6, 2.2, 1.4]
[11]: \# \# x_axis = np.arange(0, 5, 0.1)
     fig,ax = plt.subplots()
```

```
fig,ax = plt.subplots()
ax.barh(name, diff_per_game, color='r', alpha=0.5, align="center")
plt.ylabel("Goal Differential per Game")
plt.xlabel("Best Team in Each League (abbreviate name)")
plt.title("Comparing Dominant Teams across Leagues by Goal Differentials")
for i, v in enumerate(diff_per_game):
    ax.text(v, i + .25, str(v), color='blue', fontweight='bold')
plt.show()
# tick_locations = [value for value in x]
# plt.xticks(tick_locations, x)
# y = [34, 34, 83, 63, 55, 60, 30, 66, 62, 83, 50]
# x = array([8673, 8342, 9772, 9847, 8593, 8634, 9931, 9885, 9925, 9823, 8586], u
    dtype=int64)
plt.savefig("DomTeamsGoalDiff.png")
```





<Figure size 432x288 with 0 Axes>

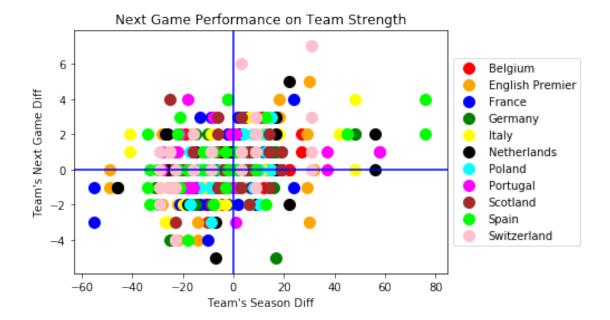
```
[12]: dom_match = df_complete[df_complete.opponent_x.isin(x)]
     #dom_match.opponent_y.value_counts()
[13]: df teams.head()
     df_DIFF = df_teams[["team_api_id","DIFF"]]
     df_DIFF = df_DIFF.rename(columns={"DIFF": "total_DIFF"})
     df_DIFF.head()
[13]:
        team_api_id
                     total_DIFF
               1773
     0
                             -11
               8203
                             -2
     1
     2
               8342
                              34
     3
               8475
                             -17
     4
               8571
                              -4
[14]: # set team_api_id's DIFF
     merge_table_all = pd.merge(dom_match, df_DIFF,left_on="team_api_id",
     right_on="team_api_id")
```

```
merge_table c = merge_table_all.rename(columns={"opponent x": "dom team",
     "team_api_id": "team",
     "opponent_y": "ng_opponent",
     "total_DIFF": "team_season_DIFF"
     })
     merge_table_c.head()
[14]:
        index_x
                                date
                                      team DIFF
                                                  league_id dom_team W
                                                                           L
                                                                              Τ
                                                                                 \
     0
           2231 2015-09-20 00:00:00
                                      1601
                                              -3
                                                       15722
                                                                  8673
                                                                       0
                                                                           1
                                                                              0
     1
           2127
                 2016-02-28 00:00:00
                                      1601
                                              -2
                                                       15722
                                                                  8673 0
                                                                           1
                                                                              0
     2
             32
                 2015-10-28 00:00:00
                                      1773
                                              -2
                                                           1
                                                                  8342 0
                                                                           1
                                                                              0
     3
            189
                 2016-03-13 00:00:00
                                              -1
                                                                  8342 0
                                                                           1
                                                                              0
                                      1773
                                                           1
                                                                          0
     4
           2212 2015-08-30 00:00:00 1957
                                               0
                                                       15722
                                                                  8673 0
        index_y ng_team_api_id2 ng_DIFF
                                           ng_opponent ng_W ng_L ng_T
         2005.0
     0
                          1601.0
                                     -1.0
                                                2186.0
                                                          0.0
                                                                1.0
                                                                      0.0
     1
         2133.0
                          1601.0
                                     -1.0
                                                2186.0
                                                          0.0
                                                                1.0
                                                                      0.0
     2
           45.0
                          1773.0
                                     -2.0
                                                9991.0
                                                          0.0
                                                                      0.0
                                                                1.0
     3
         1997.0
                          1957.0
                                      0.0
                                                    0.0
                                                          0.0
                                                                0.0
                                                                      0.0
                                     -2.0
                                                8025.0
                                                                1.0
                                                                      0.0
         2218.0
                          1957.0
                                                          0.0
        team season DIFF
     0
                      -9
     1
                      -9
     2
                     -11
     3
                     -11
     4
                     -17
[15]: merge_table_b = pd.merge(merge_table_c, df_DIFF,left_on="dom_team",
     right on="team api id")
     merge_table_b = merge_table_b.rename(columns={"total_DIFF":
     "dom season DIFF"})
     merge_table_b.drop(['team_api_id'], axis=1, inplace=True)
     merge_table_b.head()
[15]:
                                      team DIFF
                                                                              Т
        index_x
                                date
                                                  league_id dom_team W
                                                                           L
                                                                           1
     0
           2231
                 2015-09-20 00:00:00
                                      1601
                                              -3
                                                       15722
                                                                  8673
                                                                       0
                                                                              0
     1
           2127
                 2016-02-28 00:00:00
                                      1601
                                              -2
                                                       15722
                                                                  8673 0
                                                                          1
                                                                              0
     2
           2212
                 2015-08-30 00:00:00
                                      1957
                                               0
                                                       15722
                                                                  8673
                                                                       0
     3
           2108 2016-02-14 00:00:00
                                      1957
                                              -4
                                                                  8673
                                                                       0
                                                                           1
                                                       15722
           2031 2015-10-25 00:00:00
                                                                  8673 1
                                      2182
                                                1
                                                       15722
                                                                           0
        index_y ng_team_api_id2 ng_DIFF ng_opponent ng_W ng_L ng_T \
     0
         2005.0
                          1601.0
                                     -1.0
                                                2186.0
                                                          0.0
                                                                1.0
                                                                      0.0
         2133.0
                          1601.0
                                     -1.0
                                                2186.0
                                                          0.0
                                                                      0.0
     1
                                                                1.0
         2218.0
                          1957.0
                                     -2.0
                                                8025.0
                                                          0.0
                                                                1.0
                                                                      0.0
```

```
3
         2114.0
                          1957.0
                                       1.0
                                                 8025.0
                                                           1.0
                                                                 0.0
                                                                       0.0
         2034.0
                          2182.0
                                       0.0
                                                 8025.0
                                                           0.0
                                                                 0.0
                                                                       1.0
     4
        team_season_DIFF
                          dom_season_DIFF
     0
                      -9
                      -9
     1
                                        30
     2
                     -17
                                        30
     3
                     -17
                                        30
     4
                      -1
                                        30
[16]: merge_table = pd.merge(merge_table_b, df_DIFF,left_on="ng_opponent",
     right on="team api id")
     merge_table = merge_table.rename(columns={"total_DIFF":
     "ng opp season DIFF"})
     merge_table.head(5)
        index x
[16]:
                                 date
                                       team DIFF
                                                   league_id dom_team W
                                                                            L
                                                                               Τ
           2231 2015-09-20 00:00:00
                                       1601
                                               -3
                                                        15722
                                                                   8673
                                                                        0
                                                                            1
                                                                               0
     1
           2127
                 2016-02-28 00:00:00
                                       1601
                                               -2
                                                        15722
                                                                   8673 0
                                                                            1
                                                                               0
           2222 2015-09-11 00:00:00
                                                                   8673
     2
                                       8021
                                                0
                                                        15722
     3
           2118 2016-02-21 00:00:00
                                       8021
                                               -1
                                                        15722
                                                                   8673
                                                                         0
                                                                           1
           2086 2015-07-26 00:00:00 8033
                                               -5
                                                        15722
                                                                   8673 0
                                                                            1
        index_y ng_team_api_id2 ng_DIFF
                                            ng_opponent ng_W ng_L
                                                                     ng_T
         2005.0
                          1601.0
     0
                                      -1.0
                                                 2186.0
                                                           0.0
                                                                 1.0
                                                                       0.0
     1
         2133.0
                           1601.0
                                      -1.0
                                                 2186.0
                                                           0.0
                                                                 1.0
                                                                       0.0
     2
         2228.0
                          8021.0
                                       2.0
                                                 2186.0
                                                           1.0
                                                                 0.0
                                                                       0.0
                                                 2186.0
     3
         2124.0
                          8021.0
                                       1.0
                                                           1.0
                                                                 0.0
                                                                       0.0
         2172.0
                          8033.0
                                      -1.0
                                                 2186.0
                                                           0.0
                                                                 1.0
                                                                       0.0
                          dom season DIFF
                                            team_api_id ng_opp_season_DIFF
        team_season_DIFF
     0
                      -9
                                        30
                                                   2186
                                                                          15
                      -9
     1
                                        30
                                                   2186
                                                                          15
     2
                                        30
                       4
                                                   2186
                                                                          15
     3
                       4
                                        30
                                                                          15
                                                   2186
     4
                      -9
                                        30
                                                   2186
                                                                          15
[17]: merge_table.drop(['team_api_id'], axis=1, inplace=True)
     #merge_table.value_count("ng_opponent")
     #merge_table.ng_opponent.value_counts()
     merge_table = merge_table.rename(columns={"ng_team_api_id2": "shift_team",
     "league_id": "league",
     "ng_opponent": "ng_oppo",
     "team season DIFF": "team szn DIFF",
     "dom_season_DIFF": "dom_szn_DIFF",
     "ng opp season DIFF":
     "ng_oppo_szn_DIFF" })
```

```
[18]: ### DATA TABLES
     # df teams WLT
     # Has the total W/L/T and winning percentage of each team
     # merge table
     # Has all the rows
     # Note:
     # shift_team is the team we merged on when we shifted. If it's not the same
     # as team it is the last game of the season
[19]: LEAGUE_df
[19]:
            id
               country_id
                                                name
             1
     0
                              Belgium Jupiler League
                         1
     1
          1729
                      1729
                              England Premier League
     2
         4769
                      4769
                                      France Ligue 1
     3
         7809
                      7809
                               Germany 1. Bundesliga
     4
         10257
                     10257
                                       Italy Serie A
     5
         13274
                     13274
                              Netherlands Eredivisie
     6
        15722
                     15722
                                  Poland Ekstraklasa
     7
         17642
                     17642 Portugal Liga ZON Sagres
     8
         19694
                     19694
                             Scotland Premier League
     9
         21518
                     21518
                                     Spain LIGA BBVA
     10 24558
                     24558 Switzerland Super League
[20]: # scatter x = merge table["team szn DIFF"]
     # scatter_y = merge_table["ng_DIFF"]
     # group = merge table["league"]
     # group unique = group.unique()
     # cdict = {1:"red",1729:"orange",4769:"blue",7809:"green",10257:"yellow",13274:
     → "black",15722: "cyan",17642: "magenta",19694: "brown",21518: "lime",24558: "pink"}
     # ldict = {1: "Belqium", 1729: "Enq Premier", 4769: "France", 7809: "Germany", 10257:
      →"Italy", 13274: "Netherlands", 15722: "Poland", 17642: "Portugal", 19694:
     → "Scotland", 21518: "Spain", 24558: "Switzerland"}
     # fig, ax = plt.subplots()
     # for index, row in merge_table.iterrows():
           g = group[index]
           ax.scatter(scatter x[index], scatter y[index], c = cdict[q], label = ___
     \rightarrow ldict[g], s = 100)
     11 = plt.scatter(merge_table.loc[merge_table["league"]==1,__
      → ["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==1, ["ng_DIFF"]], c_u
     \Rightarrow= "r", label = "Belgium", s = 100)
     12 = plt.scatter(merge_table.loc[merge_table["league"]==1729,__
      →["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==1729,__
```

```
13 = plt.scatter(merge_table.loc[merge_table["league"]==4769,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==4769,
→["ng_DIFF"]], c = "blue", label = "France", s = 100)
14 = plt.scatter(merge table.loc[merge table["league"]==7809,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==7809,
→["ng DIFF"]], c = "green", label = "Germany", s = 100)
15 = plt.scatter(merge_table.loc[merge_table["league"]==10257,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==10257,
\rightarrow["ng_DIFF"]], c = "yellow", label = "Italy", s = 100)
16 = plt.scatter(merge table.loc[merge table["league"] == 13274,...
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==13274,__
→["ng_DIFF"]], c = "black", label = "Netherlands", s = 100)
17 = plt.scatter(merge_table.loc[merge_table["league"]==15722,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==15722,
\rightarrow["ng_DIFF"]], c = "cyan", label = "Poland", s = 100)
18 = plt.scatter(merge_table.loc[merge_table["league"]==17642,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==17642,
→["ng_DIFF"]], c = "magenta", label = "Portugal", s = 100)
19 = plt.scatter(merge_table.loc[merge_table["league"]==19694,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==19694,__
→["ng_DIFF"]], c = "brown", label = "Scotland", s = 100)
110 = plt.scatter(merge_table.loc[merge_table["league"]==21518,__
→ ["team szn DIFF"]], merge table.loc[merge table["league"] == 21518, ...
\rightarrow["ng_DIFF"]], c = "lime", label = "Spain", s = 100)
111 = plt.scatter(merge table.loc[merge table["league"]==24558,
 → ["team_szn_DIFF"]], merge_table.loc[merge_table["league"] == 24558, ___
 →["ng DIFF"]], c = "pink", label = "Switzerland", s = 100)
plt.legend(loc='center left', bbox to anchor=(1, 0.5))
plt.xlabel("Team's Season Diff")
plt.vlabel("Team's Next Game Diff")
plt.axhline(0, color='b')
plt.axvline(0, color='b')
plt.title("Next Game Performance on Team Strength")
plt.show()
# plt.scatter(merge table["team szn DIFF"], merge table["nq DIFF"], marker="o", __
→ facecolors="red", edgecolors="black",
              alpha=0.75)
```



```
[21]: #plt.scatter(merge table['team szn DIFF'], merge table['DIFF'],
      → label=merge table['league'])
[22]: # scatter_x = merge_table["team_szn_DIFF"]
     # scatter_y = merge_table["DIFF"]
     # group = merge table["league"]
     # group_unique = group.unique()
     # cdict = {1:"red",1729:"orange",4769:"blue",7809:"green",10257:"yellow",13274:
      →"black",15722:"cyan",17642:"magenta",19694:"brown",21518:"lime",24558:"pink"}
     # fig. ax = plt.subplots()
     # for index, row in merge_table.iterrows():
           q = qroup[index]
           ax.scatter(scatter x[index], scatter y[index], c = cdict[q], s = 100)
         #ax.scatter(merge table['team szn_DIFF'], merge table['DIFF'], c=cdict[q],
      \rightarrow s=100)
     n1 = plt.scatter(merge table.loc[merge table["league"]==1,___
      → ["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==1, ["DIFF"]], c = __
      \rightarrow"r", label = "Belgium", s = 100)
     n2 = plt.scatter(merge_table.loc[merge_table["league"]==1729,__
      →["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==1729, ["DIFF"]], c_
      →= "orange", label = "English Premier", s = 100)
     n3 = plt.scatter(merge table.loc[merge table["league"] == 4769,
      →["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==4769, ["DIFF"]], c_
      \rightarrow= "blue", label = "France", s = 100)
     n4 = plt.scatter(merge_table.loc[merge_table["league"]==7809,__

→ ["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==7809, ["DIFF"]], c

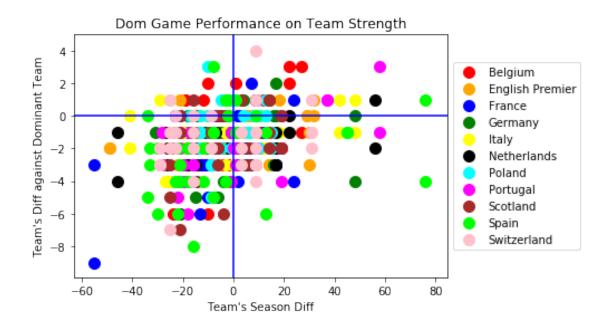
□
      →= "green", label = "Germany", s = 100)
```

```
n5 = plt.scatter(merge_table.loc[merge_table["league"]==10257,__
→ ["team szn DIFF"]], merge table.loc[merge table["league"]==10257, ["DIFF"]],

→c = "yellow", label = "Italy", s = 100)
n6 = plt.scatter(merge table.loc[merge table["league"]==13274,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==13274, ["DIFF"]],

→c = "black", label = "Netherlands", s = 100)
n7 = plt.scatter(merge_table.loc[merge_table["league"] == 15722,__
→ ["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==15722, ["DIFF"]],
\rightarrowc = "cyan", label = "Poland", s = 100)
n8 = plt.scatter(merge table.loc[merge table["league"]==17642,...
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==17642, ["DIFF"]],
→c = "magenta", label = "Portugal", s = 100)
n9 = plt.scatter(merge_table.loc[merge_table["league"]==19694,__
→["team szn_DIFF"]],merge_table.loc[merge_table["league"]==19694, ["DIFF"]],
\rightarrowc = "brown", label = "Scotland", s = 100)
n10 = plt.scatter(merge_table.loc[merge_table["league"]==21518,__
→["team_szn_DIFF"]],merge_table.loc[merge_table["league"]==21518, ["DIFF"]],
\rightarrowc = "lime", label = "Spain", s = 100)
n11 = plt.scatter(merge_table.loc[merge_table["league"]==24558,__
→ ["team_szn_DIFF"]], merge_table.loc[merge_table["league"]==24558, ["DIFF"]],

→c = "pink", label = "Switzerland", s = 100)
plt.legend(loc='center left', bbox_to_anchor=(1, 0.5))
plt.xlabel("Team's Season Diff")
plt.ylabel("Team's Diff against Dominant Team")
plt.axhline(0, color='b')
plt.axvline(0, color='b')
plt.title("Dom Game Performance on Team Strength")
plt.show()
#plt.scatter(merge_table["team_szn_DIFF"], merge_table["DIFF"], marker="o",_
 → facecolors="red", edgecolors="black", alpha=0.75)
```

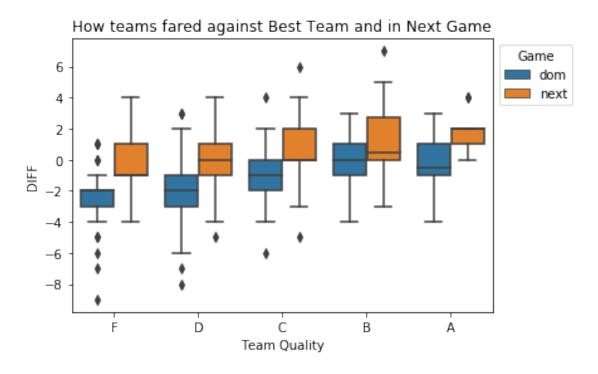


```
[23]: bins = [-60, -25, 0, 20, 35, 80]
     group_names = ["F", "D", "C", "B", "A"]
     merge_table["Team Quality"] = pd.cut(merge_table["team_szn_DIFF"], bins,__
     →labels=group_names)
     merge_table.head()
     #carving out dom_game and next_game results from merge_table
     #then concatenating them with an added column to identify "Dom" or "Next"
     #so we can arrange two boxplots in the same chart
     dom_game = merge_table[["Team Quality","DIFF"]]
     dom_game["Game"] = "dom"
     dom_game.head()
     next game = merge table[["Team Quality", "ng DIFF"]]
     next_game = next_game.rename(columns={"ng_DIFF":"DIFF"})
     next game["Game"] = "next"
     both_games = pd.concat([dom_game,next_game],sort=False)
     both games.head()
```

```
C:\Users\Shalesh Kumbhat\Anaconda3\envs\PythonData\lib\site-
packages\ipykernel_launcher.py:9: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/indexing.html#indexing-view-versus-copy
   if __name__ == '__main__':
```

```
[23]:
       Team Quality DIFF Game
     0
                    -3.0
                           dom
     1
                    -2.0
                           dom
     2
                  С
                      0.0
                           dom
     3
                  С
                    -1.0
                           dom
     4
                    -5.0 dom
[24]: #data = both_games.melt(id_vars=['Team Quality'], var_name='Game',__
     →value_name='DIFF')
     sns.boxplot(data=both_games, x='Team Quality', y='DIFF', hue='Game')
     plt.legend(title='Game', loc='upper left', bbox_to_anchor=(1, 1))
     plt.title("How teams fared against Best Team and in Next Game")
     plt.savefig("Dom-Next-Game BoxPlot.png")
```



```
[25]: # ng_bplot = sns.boxplot(y='ng_DIFF', x='Team Quality', data=merge_table, width=0.5, palette="colorblind")

# plt.ylabel("Goal Differential")

# plt.title("How various quality teams fared in the next game")

# plt.axhline(0, color='b')

# plt.savefig("NextGame BoxPlot.png")

# dom_bplot = sns.boxplot(y='DIFF', x='Team Quality', data=merge_table, width=0.

→5, palette="colorblind")

# plt.ylabel("Goal Differential")

# plt.title("How various quality teams fared against the Dominant Team")
```

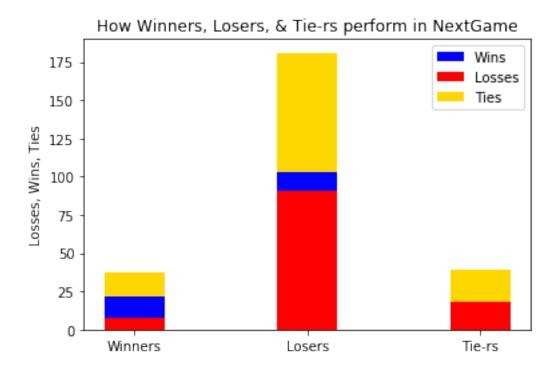
```
# plt.axhline(0, color='b')
     # plt.savefiq("DomGame BoxPlot.pnq")
[26]: winners_df = merge_table.loc[merge_table["DIFF"] > 0, ["team", "ng_DIFF", ___

→"team_season_DIFF", "Team Quality"]]
     winners_wins = winners_df[winners_df["ng_DIFF"]>0]["ng_DIFF"].count()
     winners losses = winners df[winners df["ng DIFF"]<0]["ng DIFF"].count()
     winners_ties = winners_df[winners_df["ng_DIFF"] == 0]["ng_DIFF"].count()
     winners results = [winners wins, winners losses, winners ties]
     losers_df = merge_table.loc[merge_table["DIFF"] < 0, ["team", "ng_DIFF", ]</pre>

→"team_season_DIFF", "Team Quality"]]
     losers_wins = losers_df[losers_df["ng DIFF"]>0]["ng DIFF"].count()
     losers_losses = losers_df[losers_df["ng_DIFF"]<0]["ng_DIFF"].count()</pre>
     losers_ties = losers_df[losers_df["ng_DIFF"] == 0]["ng_DIFF"].count()
     losers_results = [losers_wins,losers_losses,losers_ties]
     ties_df = merge_table.loc[merge_table["DIFF"] == 0, ["team", "ng_DIFF", __

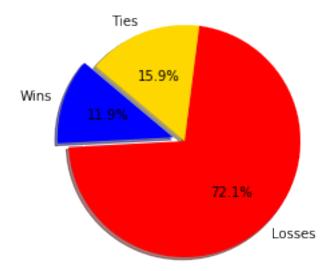
→"team_season_DIFF", "Team Quality"]]
     ties_wins = ties_df[ties_df["ng_DIFF"]>0]["ng_DIFF"].count()
     ties_losses = ties_df[ties_df["ng_DIFF"]<0]["ng_DIFF"].count()</pre>
     ties_ties = ties_df[ties_df["ng_DIFF"]==0]["ng_DIFF"].count()
     ties_results = [ties_wins,ties_losses,ties_ties]
     results_df = pd.DataFrame({'Winners': winners_results, 'Losers':
      →losers_results, 'Tie-rs': ties_results})
     results df = results df.transpose()
     results df = results df.rename(columns={"0":"Wins", "1":"Losses", "2":"Ties"})
     results_df
     N = 3
     ind = np.arange(N)
     width = 0.35
     p1 = plt.bar(ind, results_df[0], width, color = "blue")
     p2 = plt.bar(ind, results_df[1], width, color = "red")
     p3 = plt.bar(ind, results_df[2], width, color = "gold", bottom=results_df[0])
     plt.ylabel('Losses, Wins, Ties')
     plt.title('How Winners, Losers, & Tie-rs perform in NextGame')
     plt.xticks(ind, ('Winners', 'Losers', 'Tie-rs'))
     #plt.yticks(np.arange(0, 81, 10))
     plt.legend((p1[0], p2[0], p3[0]), ('Wins', 'Losses', 'Ties'))
     plt.show()
    plt.savefig("NextGame-Stacked.png")
```

C:\Users\Shalesh Kumbhat\Anaconda3\envs\PythonData\lib\sitepackages\pandas\core\indexing.py:1494: FutureWarning: Passing list-likes to .loc or [] with any missing label will raise KeyError in the future, you can use .reindex() as an alternative. See the documentation here: https://pandas.pydata.org/pandas-docs/stable/indexing.html#deprecate-loc-reindex-listlike return self._getitem_tuple(key)

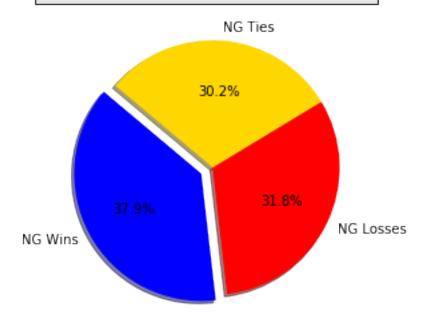


<Figure size 432x288 with 0 Axes>

W/L/T Percentage for Games Against Dominant Teams in Every League



Next Game W/L/T After Playing a Dominant Team



<Figure size 432x288 with 0 Axes>

```
[29]: # df_teams.head() has the
     df_teams_WLT = df_teams[["league_id","team_api_id","W","L","T"]].copy()
     \#df\_teams\_WLT["win\_\%"] = df\_teams\_WLT[['T']] + df\_teams\_WLT[['L']]
     #+ df_teams_WLT.L + df_teams_WLT.L
     #df_teams_WLT.head()
     #df_teams_WLT[["win_percent"]]=df_teams_WLT["W"
     df_teams_WLT['total_games'] = df_teams_WLT.apply(lambda x: x['W'] + x['L']
     + x['T'], axis=1)
     df_teams_WLT['win_rate'] = df_teams_WLT.apply(lambda x: x['W'] /
     x['total_games'], axis=1)
     df_teams_WLT['tie_rate'] = df_teams_WLT.apply(lambda x: x['T'] /
     x['total_games'], axis=1)
     df_teams_WLT['loss_rate'] = df_teams_WLT.apply(lambda x: x['L'] /
     x['total_games'], axis=1)
     df_teams_WLT.head()
[29]:
       league_id team_api_id
                                   L T total_games win_rate tie_rate \
                                 W
               1
                          1773
                                 7
                                   15 8
                                                    30 0.233333
                                                                  0.266667
                                   13 7
                1
                          8203 10
                                                    30 0.333333
                                                                  0.233333
     1
     2
                1
                          8342 21
                                     8 1
                                                    30 0.700000 0.033333
```

```
3
               1
                        8475
                               9 15 6
                                                 30 0.300000 0.200000
    4
                             10 11 9
                                                 30 0.333333 0.300000
               1
                        8571
       loss_rate
       0.500000
    0
    1
        0.433333
    2
        0.266667
    3
        0.500000
        0.366667
[30]: df_teams_WLT["points"] = df_teams_WLT["W"]*3 + df_teams_WLT["T"]
    bins = [0, 36, 42, 49, 60.0, 999]
    group_names = ["F", "D", "C", "B", "A"]
    df teams WLT["Team Win Pctg"] = pd.cut(df teams WLT["points"], bins,
     →labels=group_names)
    df_teams_WLT.head(5)
    \rightarrow alpha=0.5, align="center")
    \#df\_teams\_WLT["points"] = (df\_teams\_WLT.W*3 + df\_teams\_WLT.T)
    #+ df teams WLT["T"]
    \#df\_teams\_WLT["points"] = df\_teams\_WLT["points"] + df\_teams\_WLT["tie\_points"]
    df_teams_WLT.head()
[30]:
       league_id
                 team_api_id
                               W
                                   L T
                                         total_games win_rate
                                                               tie_rate
                        1773
                               7 15 8
                                                 30 0.233333
                                                               0.266667
    0
               1
    1
               1
                        8203 10
                                  13 7
                                                 30 0.333333
                                                               0.233333
    2
                              21
                                  8 1
                                                 30 0.700000
                                                               0.033333
               1
                        8342
                                                 30 0.300000
    3
               1
                        8475
                               9
                                 15 6
                                                               0.200000
               1
                        8571
                              10
                                 11 9
                                                 30 0.333333 0.300000
       loss_rate points Team Win Pctg
       0.500000
                     29
                                    F
    0
                     37
                                    D
    1
        0.433333
    2
        0.266667
                     64
                                    Α
                                    F
    3
        0.500000
                     33
        0.366667
                     39
                                    D
[31]: #df_teams_WLT.head()
                           / 36
    #60
            / 49 /42
    # 37.6 / 75.2 / 112.8 / 150
    #df_teams[df_teams_WLT.points > 40].count()# 122
    #df_teams[df_teams_WLT.points > 59].count() #36
    \#df\_teams[df\_teams\_WLT.points > 60].count() \#36
```

```
\#df\_teams[df\_teams\_WLT.points > 49].count() \#73
    #df teams[df teams WLT.points > 42].count() #113
    #df_teams[df_teams_WLT.points > 36].count() #### 150
    #94
    \#df\_teams[df\_teams\_WLT.points > 70].count() \#94
    \#df\_teams[df\_teams\_WLT.points > 50].count() 62
    \#df\_teams[df\_teams\_WLT.loss\_rate > .56].count() \#10 for 05\%
    # df_teams[df_teams_WLT.loss_rate > .48].count() #34
    #----# df_teams[df_teams_WLT.loss_rate > .48].count() #34
    \#----\#df_teams[df_teams_WLT.loss_rate > .42].count()
    \#----df_teams[df_teams_WLT.loss_rate > .36].count() #141 for 75% 113
    \# ---df_teams[df_teams_WLT.loss_rate > .28].count() \#141 for 75% 141
[32]: #merge_table # 377
    #merge_table_bins = pd.merge(merge_table, df_teams_WLT,left_on="team_api_id",__
     \rightarrow right_on="team_api_id")
    #merge table bins.head()
    #df teams WLT=df teams WLT.sort values(by=["team api id"])
    #all_games = all_games_unsorted.sort_values(by=["team_api_id", "date"])
    #df_teams_WLT # 188 rows
    merge_table group = merge_table.groupby(['league','team'], as_index=False).sum()
    \rightarrow x['L'] + x['T'], axis=1)
    merge_table_group['win_rate_ng'] = merge_table_group.apply(lambda x: x['W'] / ___
     merge_table_group['loss_rate_ng'] = merge_table_group.apply(lambda x: x['L'] /__
     merge_table_group['tie_rate_ng'] = merge_table_group.apply(lambda x: x['T'] /__
     merge_table_group.head(5)
    #merge_table_group # 177 - 11
    #df_teams_WLT.head() # team_api_id
    #merge_table_group.head() # team
```

```
merge_table_bins = pd.merge(merge_table_group, df_teams_WLT,left_on="team",_
      →right_on="team_api_id")
     merge table bins.columns
     # team / BIN / LEAGUE /
     #df teams WLT # 188
     #df_teams_WLT.sort_values(by=["team_api_id"])
     #unique_df_teams = df_teams.team_api_id.unique()
     #unique_df_teams
[32]: Index(['league', 'team', 'index_x', 'DIFF', 'dom_team', 'W_x', 'L_x', 'T_x',
            'index_y', 'shift_team', 'ng_DIFF', 'ng_oppo', 'ng_W', 'ng_L', 'ng_T',
            'team_szn_DIFF', 'dom_szn_DIFF', 'ng_oppo_szn_DIFF', 'total_ng',
            'win_rate_ng', 'loss_rate_ng', 'tie_rate_ng', 'league_id',
            \label{team_api_id', 'W_y', 'L_y', 'T_y', 'total_games', 'win_rate',} \\
            'tie_rate', 'loss_rate', 'points', 'Team Win Pctg'],
           dtype='object')
[33]: merge_table_bins.
      →drop(['shift_team', 'ng_oppo', 'dom_team', 'league', 'team_api_id'], axis=1, __
      →inplace=True)
     merge_table_bins.head(6)
[33]:
        team index_x DIFF
                             W_x L_x
                                       T_x index_y ng_DIFF
                                                               ng_W ng_L ...
                                                                                 \
                                                                0.0
                                                                      1.0
     0 1773
                   32
                         -2
                               0
                                    1
                                          0
                                                45.0
                                                         -2.0
                                                                           . . .
     1 8203
                  155
                         -6
                               0
                                    2
                                          0
                                               256.0
                                                          3.0
                                                                2.0
                                                                      0.0 ...
                  350
     2 8475
                         -5
                               0
                                    2
                                         0
                                               368.0
                                                         -3.0
                                                                      2.0 ...
                                                                0.0
                  300
                                    2
                                          0
     3 8571
                         -4
                               0
                                               322.0
                                                         -1.0
                                                                0.0
                                                                      1.0 ...
     4 8573
                  163
                         -3
                               0
                                    2
                                          0
                                               179.0
                                                          3.0
                                                                1.0
                                                                      0.0 ...
     5 8635
                  120
                          5
                               2
                                          0
                                                99.0
                                                          0.0
                                                                0.0
                                                                      0.0 ...
        league_id W_y L_y T_y total_games win_rate tie_rate loss_rate \
     0
                                            30 0.233333 0.266667
                                                                     0.500000
                1
                     7
                         15
                               8
                               7
     1
                1
                    10
                         13
                                            30 0.333333 0.233333
                                                                     0.433333
     2
                1
                     9
                               6
                         15
                                            30 0.300000 0.200000
                                                                     0.500000
     3
                1
                    10
                         11
                               9
                                            30 0.333333 0.300000
                                                                     0.366667
                               7
     4
                1
                    14
                          9
                                            30 0.466667
                                                          0.233333
                                                                     0.300000
     5
                1
                    15
                          5
                              10
                                            30 0.500000 0.333333
                                                                     0.166667
        points
                Team Win Pctg
     0
            29
                            F
                            D
     1
            37
     2
                            F
            33
```

```
4
            49
                            С
     5
            55
                            В
     [6 rows x 28 columns]
[34]: merge_table_group_bin = merge_table_bins.groupby(['Team Win Pctg'],
      →as_index=False).sum()
     merge_table_group_bin_mean = merge_table_bins.groupby(['Team Win Pctg'],_
      →as index=False).mean()
     merge_table_group_bin.head(12)
     merge_table_group_bin.columns
     #merge_table_group_bin.
      → drop(['leaque', 'team', 'dom team', 'shift team', 'team api id'], axis=1,,,
      →inplace=True)
     merge_table_group_bin_mean.head()
[34]:
       Team Win Pctg
                              team
                                        index_x
                                                     DIFF
                                                                 W_x
                                                                           L_x \
                      24965.710526
                                    4028.157895 -4.315789
                                                           0.105263
                                                                      1.710526
     1
                   D 14273.621622
                                    3227.810811 -4.351351
                                                           0.135135
                                                                      1.621622
     2
                   C
                       8507.725000
                                    3671.475000 -3.225000
                                                           0.125000
                                                                      1.575000
     3
                   B 13264.777778 3926.888889 -2.722222
                                                           0.388889
                                                                      1.444444
     4
                       9259.307692
                                    3925.807692 -1.846154 0.653846
                                                                      1.230769
             Тх
                      index_y
                                ng DIFF
                                                       tie_rate_ng
                                                                         league_id \
                                             ng_W
                                                   . . .
     0 0.315789
                  4037.789474 -0.657895
                                         0.473684
                                                            0.129386
                                                                      12545.947368
                                                    . . .
     1 0.243243
                  3249.756757 -0.648649
                                         0.621622
                                                                      10793.621622
                                                   . . .
                                                            0.108108
     2 0.375000
                  3676.350000 0.575000
                                         0.800000
                                                    . . .
                                                           0.168750
                                                                      12033.850000
                               0.583333
     3 0.416667
                  3944.916667
                                         0.944444
                                                           0.208333
                                                                      11275.666667
                                                   . . .
     4 0.346154
                  3946.000000 2.730769
                                         1.384615
                                                   . . .
                                                           0.153846
                                                                      11370.192308
                                        total_games win_rate
                                                                          loss rate \
              W_y
                         L_y
                                   T_y
                                                               tie rate
     0
         7.263158
                  17.973684
                              8.710526
                                          33.947368
                                                     0.216251
                                                                0.257968
                                                                           0.525781
        9.756757
                   15.189189
                              9.918919
                                                     0.282627
                                                                0.285042
                                                                           0.432331
     1
                                          34.864865
     2 11.925000
                   13.850000
                              9.925000
                                          35.700000
                                                     0.337515
                                                                0.277784
                                                                           0.384701
     3 14.888889
                   11.777778
                             9.166667
                                          35.833333 0.418803
                                                               0.255567
                                                                           0.325629
     4 20.846154
                    7.730769 8.576923
                                          37.153846 0.563878
                                                               0.229430
                                                                           0.206693
          points
      30.500000
     0
     1 39.189189
     2 45.700000
     3 53.833333
     4 71.115385
```

3

39

[5 rows x 28 columns]

D

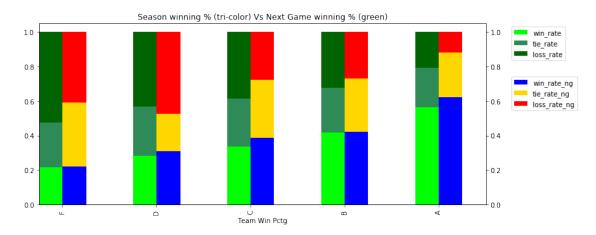
```
[35]: merge_table_group_bin_mean.
      \neg drop(['team','DIFF','W_x','L_x','T_x','ng_DIFF','ng_W','ng_L'], axis=1, \\ \bot
      →inplace=True)
    merge_table_group_bin_mean.head()
[35]:
      Team Win Pctg
                         index_x
                                      index_y
                                                   ng_T team_szn_DIFF \
                  F 4028.157895 4037.789474 0.789474
                                                            -49.657895
    1
                  D 3227.810811
                                  3249.756757 0.432432
                                                            -25.864865
                  C 3671.475000 3676.350000 0.700000
    2
                                                             -8.425000
    3
                  B 3926.888889 3944.916667 0.694444
                                                              9.305556
                  A 3925.807692 3946.000000 0.576923
                                                             62.000000
       dom szn_DIFF ng_oppo_szn_DIFF total_ng_win_rate_ng_loss_rate_ng_\
    0
         112.605263
                           -16.078947 2.131579
                                                    0.052632
                                                                  0.817982
    1
         107.837838
                           -14.486486 2.000000
                                                    0.074324
                                                                  0.817568
    2
                                                    0.062500
                                                                  0.768750
         123.925000
                            -9.800000 2.075000
    3
         136.111111
                            -7.972222 2.250000
                                                    0.171296
                                                                  0.620370
         132.538462
                           -27.269231 2.230769
                                                    0.298077
                                                                  0.548077
                                                             T_y total_games \
       tie rate ng
                       league id
                                        W_y
                                                   L_y
          0.129386 12545.947368
                                             17.973684 8.710526
                                                                    33.947368
    0
                                   7.263158
    1
          0.108108 10793.621622
                                   9.756757
                                             15.189189 9.918919
                                                                    34.864865
    2
          0.168750 12033.850000 11.925000
                                             13.850000 9.925000
                                                                    35.700000
    3
          0.208333 11275.666667
                                  14.888889
                                             11.777778 9.166667
                                                                    35.833333
          0.153846 11370.192308 20.846154
                                              7.730769 8.576923
                                                                    37.153846
       win_rate tie_rate loss_rate
                                         points
                            0.525781 30.500000
    0 0.216251 0.257968
    1 0.282627 0.285042
                            0.432331 39.189189
    2 0.337515 0.277784
                            0.384701 45.700000
    3 0.418803 0.255567
                            0.325629 53.833333
    4 0.563878 0.229430
                            0.206693 71.115385
[36]: # merge table group bin.head()
     # merge_table_group_bin.columns
    merge_table_group_bin['total_ng'] = merge_table_group_bin.apply(lambda x:_u
     \rightarrow x['ng_W'] + x['ng_L'] + x['ng_T'], axis=1)
    merge_table_group_bin['win_rate_ng'] = merge_table_group_bin.apply(lambda x:__
     →x['ng_W'] / x['total_ng'], axis=1)
    merge_table_group_bin['loss_rate_ng'] = merge_table_group_bin.apply(lambda x:__
     →x['ng_L'] / x['total_ng'], axis=1)
    merge_table_group_bin['tie_rate_ng'] = merge_table_group_bin.apply(lambda x:u

→x['ng_T'] / x['total_ng'], axis=1)
    merge_table_group_bin.head()
```

```
[36]:
       Team Win Pctg
                        team index_x DIFF W_x L_x T_x
                                                             index_y ng_DIFF \
    0
                   F
                     948697
                               153070
                                      -164
                                               4
                                                   65
                                                        12
                                                            153436.0
                                                                        -25.0
     1
                   D 528124
                               119429 -161
                                               5
                                                   60
                                                         9
                                                            120241.0
                                                                        -24.0
     2
                   C 340309
                               146859 -129
                                               5
                                                   63
                                                        15
                                                            147054.0
                                                                         23.0
     3
                                                   52
                                                                         21.0
                   B 477532
                               141368
                                        -98
                                              14
                                                        15
                                                            142017.0
     4
                                              17
                                                   32
                                                         9
                                                                         71.0
                   A 240742
                               102071
                                        -48
                                                            102596.0
       ng_W ...
                  tie_rate_ng
                               league_id W_y L_y T_y total_games
                                                                        win_rate \
     0 18.0
             . . .
                      0.370370
                                   476746
                                           276
                                                683
                                                     331
                                                                 1290
                                                                        8.217527
     1 23.0 ...
                      0.216216
                                   399364
                                           361
                                                562
                                                     367
                                                                 1290
                                                                       10.457207
     2 32.0 ...
                                           477
                                                554
                                                     397
                                                                 1428
                     0.337349
                                   481354
                                                                       13.500619
     3 34.0 ...
                                                424
                                                     330
                                                                 1290
                                                                       15.076918
                     0.308642
                                   405924
                                           536
     4 36.0
                                                     223
                     0.258621
                                   295625
                                           542
                                                201
                                                                  966
                                                                       14.660819
        tie_rate loss_rate points
        9.802786 19.979687
     0
                                1159
     1 10.546560 15.996233
                                1450
     2 11.111352 15.388029
                                1828
     3
        9.200430 11.722652
                                1938
        5.965170
                  5.374011
                                1849
     [5 rows x 28 columns]
[37]: merge table group bin mean.set_index('Team Win Pctg',inplace=True)
     merge_table_group_bin.set_index('Team Win Pctg',inplace=True)
[38]: fig=plt.figure()
     ax=fig.add_subplot(111)
     ax2=ax.twinx()
     width=.25
     #ax = x.plot(kind='bar', legend=False)
     patches, labels = ax.get_legend_handles_labels()
     #ax.legend(patches, labels, loc='best')
     ax.legend(patches, labels, loc='lower left')
     ax2.legend(patches, labels, loc='lower left')
     colors = ["lime", "seagreen", "darkgreen"]
     colors2 = ["blue", "gold", "red"]
     merge_table_group_bin_mean.loc[:,['win_rate','tie_rate','loss_rate']].plot.
      →bar(stacked=True,width=width,position=1, color=colors, ax=ax,align='center')
     #figsize=(15, 15),
```

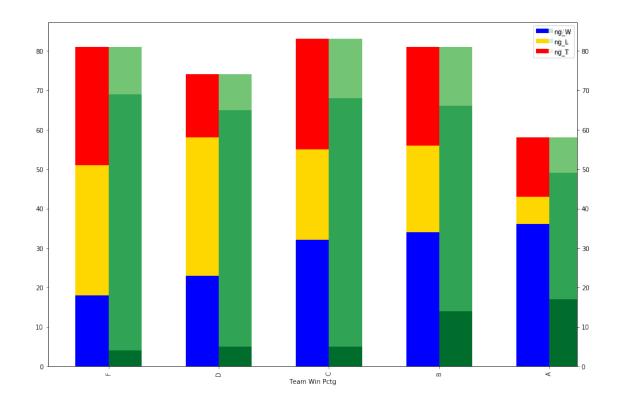
```
\#merge\_table\_group\_bin.loc[:,['nq\_W','nq\_L','nq\_T']].plot.
 →bar(stacked=True, width=width, color=colors2,
 \rightarrow figsize=(15,10), position=1, ax=ax2)
merge_table_group_bin.loc[:,['win_rate_ng','tie_rate_ng','loss_rate_ng']].plot.
 →bar(stacked=True, width=width, position=0, color=colors2, __
 →figsize=(12,5),ax=ax2,align='center')
ax.legend(patches, labels, loc='best')
ax2.legend(patches, labels, loc='right')
#merge_table_group_bin.loc[:,['W_x','L_x','T_x']].plot.bar(stacked=True,_
\rightarrow color=colors, figsize=(10,7), position=1, ax=ax)
#plt.legend(handles, labels, bbox_to_anchor=(0.85,1.025), loc="upper left")
\rightarrow color=colors, figsize=(10,7))
#plt.show()
#merge_table_group_bin
ax.legend(fancybox=True, framealpha=0.5)
ax.legend(loc='upper left',bbox to anchor=(1.05, 1))
ax2.legend(fancybox=True, framealpha=0.5)
ax2.legend(loc='lower left',bbox_to_anchor=(1.05,0.5))
plt.title("Season winning % (tri-color) Vs Next Game winning % (green)")
#plt.legend(loc='best')
```

[38]: Text(0.5, 1.0, 'Season winning % (tri-color) Vs Next Game winning % (green)')



```
[39]: fig=plt.figure()
ax=fig.add_subplot(111)
```

```
ax2=ax.twinx()
width=.3
colors = ["#006D2C", "#31A354", "#74C476"]
colors2 = ["blue", "gold", "red"]
merge_table_group_bin.loc[:,['W_x','L_x','T_x']].plot.
-bar(stacked=True,width=width, color=colors, figsize=(15,10),position=0,ax=ax)
merge_table_group_bin.loc[:,['ng_W','ng_L','ng_T']].plot.
 →bar(stacked=True,width=width, color=colors2,
\rightarrowfigsize=(15,10),position=1,ax=ax2)
[' ',' ',' '].plot.bar(stacked=True,width=width, color=colors2,__
\rightarrowfigsize=(15,10),position=2,ax=ax2)
\#merge\_table\_group\_bin.loc[:,['W_x','L_x','T_x']].plot.bar(stacked=True, U)
\rightarrow color=colors, figsize=(10,7), position=1, ax=ax)
\#merge\_table\_group\_bin.loc[:,['W\_x','L\_x','T\_x']].plot.bar(stacked=True, U)
\rightarrow color=colors, figsize=(10,7))
plt.show()
#merge_table_group_bin
       AttributeError
                                                    Traceback (most recent call_
→last)
       <ipython-input-39-5fdce4361001> in <module>
        12 merge_table_group_bin.loc[:,['W_x','L_x','T_x']].plot.
→bar(stacked=True,width=width, color=colors, figsize=(15,10),position=0,ax=ax)
        13 merge_table_group_bin.loc[:,['ng_W','ng_L','ng_T']].plot.
→bar(stacked=True,width=width, color=colors2, figsize=(15,10),position=1,ax=ax2)
   ---> 14 [' ',' ',' '].plot.bar(stacked=True,width=width, color=colors2,_
\rightarrowfigsize=(15,10),position=2,ax=ax2)
        15
        16
       AttributeError: 'list' object has no attribute 'plot'
```



```
[]: #df_complete.drop(['index_x', 'index_y', 'nq_date', 'nq_leaque_id'], axis=1,__
    → inplace=True)
   merge_table_group_bin.
    →drop(['league', 'team', 'DIFF', 'dom_team', 'shift_team', 'team_api_id', 'win_rate', 'loss_rate', '
    →axis=1, inplace=True)
   merge_table_group_bin.head()
[]: colors = ["#006D2C", "#31A354", "#74C476"]
   \hookrightarrow color=colors, figsize=(10,7))
   #index = ["F", "D", "C", "B", "A"]
   hello = merge_table_group_bin.loc[:,['ng_W','ng_L','ng_T']]#.plot.
    \rightarrowbar(stacked=True, color=colors, figsize=(10,7))
   hello
   #hello.plot.bar(stacked=True, color=colors, figsize=(10,7))
   \#dfx = pd.DataFrame(columns=['a', 'b', 'c', 'd'])
   #dfx.plot()
   #pd.DataFrame({'lab':['A', 'B', 'C', 'D', 'F']})
   #merge_table_group_bin.head()
[]: data = [[2000, 2000, 2000, 2001, 2001, 2001, 2002, 2002, 2002],
           ['Jan', 'Feb', 'Mar', 'Jan', 'Feb', 'Mar', 'Jan', 'Feb', 'Mar'],
           [1, 2, 3, 4, 5, 6, 7, 8, 9]]
```

```
rows = zip(data[0], data[1], data[2])
   headers = ['Year', 'Month', 'Value']
   df = pd.DataFrame(rows, columns=headers)
   df
[]: pivot_df = df.pivot(index='Year', columns='Month', values='Value')
   pivot_df
[]: colors = ["#006D2C", "#31A354", "#74C476"]
   pivot_df.loc[:,['Jan','Feb', 'Mar']].plot.bar(stacked=True, color=colors,_
    \rightarrowfigsize=(10,7))
   # Years = BINS
   # Months = W L T
[]: #plt.bar(merge_table_bins["Team Win Pctg"], merge_table_bins["W_y"].unique(),_
    \rightarrow color='r', alpha=0.5, align="center")
   #pivot_df = df.pivot(index='Year', columns='Month', values='Value')
   # This gives error . . .
[]:
                                                          Add
   1773 7 15 8 30 0.233333 0.500000 0.266667 F
   8203 10 13 7 30 0.333333 0.433333 0.233333 F
   8342 21 8 1 30 0.700000 0.266667 0.033333 A
   8475 9 15 6 30 0.300000 0.500000 0.200000 F
   8571 10 11 9 30 0.333333 0.366667 0.300000 F
   # add to the bins, ng_
       next game
                    current game
          L
               Τ
           ?
               ?
          ?
   В
       ?
               ?
```

C	? ?	?	
D	? ?	?	
F	? ?	?	