Data Visualization | Homework 4 | David Aslanyan



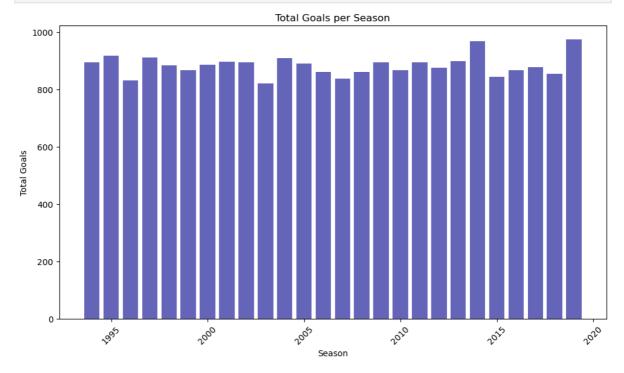
```
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from matplotlib.backends.backend_pdf import PdfPages
import numpy as np
```

Part 1 | Trend Analysis

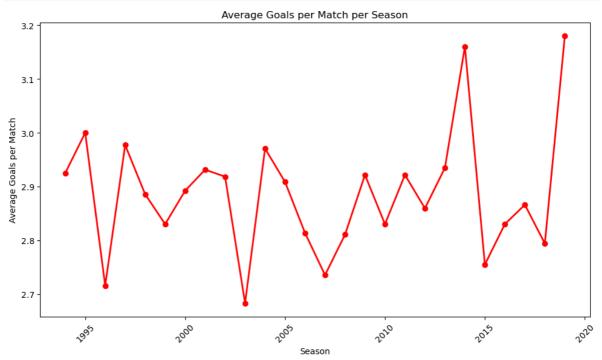
	total_goals	total_matches	average_goals_per_match
SEASON			
1994	895	306	2.924837
1995	918	306	3.000000
1996	831	306	2.715686
1997	911	306	2.977124
1998	883	306	2.885621
1999	866	306	2.830065
2000	885	306	2.892157
2001	897	306	2.931373
2002	893	306	2.918301
2003	821	306	2.683007
2004	909	306	2.970588
2005	890	306	2.908497
2006	861	306	2.813725
2007	837	306	2.735294
2008	860	306	2.810458
2009	894	306	2.921569
2010	866	306	2.830065
2011	894	306	2.921569
2012	875	306	2.859477
2013	898	306	2.934641
2014	967	306	3.160131
2015	843	306	2.754902
2016	866	306	2.830065
2017	877	306	2.866013
2018	855	306	2.794118
2019	973	306	3.179739

Part 1.1 Total Goals / Average Goals Per Match

```
In [18]: fig, ax1 = plt.subplots(figsize=(10, 6))
    ax1.bar(season_stats.index, season_stats['total_goals'], alpha=0.6, label='
    ax1.set_xlabel('Season')
    ax1.set_ylabel('Total Goals')
    ax1.set_title('Total Goals per Season')
    plt.xticks(rotation=45)
    plt.tight_layout()
    plt.show()
```



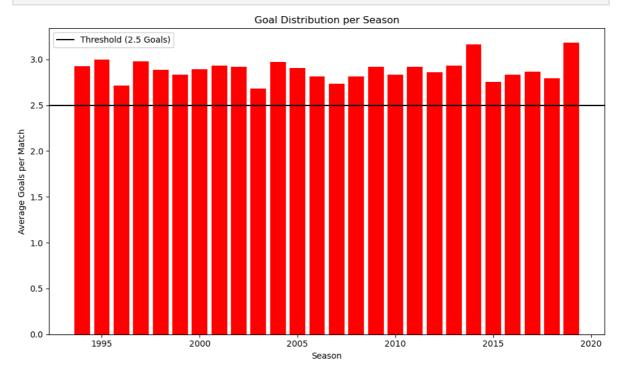
```
In [19]: fig, ax2 = plt.subplots(figsize=(10, 6))
    ax2.plot(season_stats.index, season_stats['average_goals_per_match'], color=
    ax2.set_xlabel('Season')
    ax2.set_ylabel('Average Goals per Match')
    ax2.set_title('Average Goals per Match per Season')
    plt.xticks(rotation=45)
    plt.tight_layout()
    plt.show()
```



Part 1.2 Goal Distribution Per Season

```
bundesliga_df = pd.read_csv('bundesliga.csv')
In [20]:
          bundesliga_df['TOTAL_GOALS'] = bundesliga_df['FTHG'] + bundesliga_df['FTAG'
          bundesliga_df['MATCH_PAIR'] = bundesliga_df['HOMETEAM'] + '-' + bundesliga_d
          season_stats = bundesliga_df.groupby('SEASON').agg(
              total_goals=('TOTAL_GOALS', 'sum'),
total_matches=('MATCH_PAIR', 'nunique')
          season_stats['average_goals_per_match'] = season_stats['total_goals'] / seas
          season_stats['goal_threshold'] = season_stats['average_goals_per_match'].apr
          plt.figure(figsize=(10, 6))
          plt.bar(season_stats.index, season_stats['average_goals_per_match'],
                  color=season_stats['goal_threshold'].map({'Above 2.5': 'red', 'Below
          plt.xlabel('Season')
          plt.ylabel('Average Goals per Match')
          plt.title('Goal Distribution per Season')
          plt.axhline(y=2.5, color='black', linestyle='-', label='Threshold (2.5 Goals
          plt.legend()
          plt.xticks(rotation=0)
```

```
plt.tight_layout()
plt.show()
```



Part 1.3 Line Charts

```
In [21]:
        bundesliga_df = pd.read_csv('bundesliga.csv')
         seasons = bundesliga_df['SEASON'].unique()
          team colors = {
              'Bayern Munich': 'red',
              'Dortmund': 'yellow',
              'Werder Bremen': 'darkgreen',
              'Schalke': 'blue',
              'Wolfsburg': 'lightgreen'
         }
         output_pdf = 'goal_trends_per_season_colored_readable.pdf'
         with PdfPages(output_pdf) as pdf:
             for season in seasons:
                 season_data = bundesliga_df[bundesliga_df['SEASON'] == season]
                 team_goals_home = season_data.groupby('HOMETEAM').agg(total_goals=(
                 team_goals_away = season_data.groupby('AWAYTEAM').agg(total_goals=(
                 total_goals = pd.concat([team_goals_home, team_goals_away.rename(co]
                 total_goals = total_goals.groupby('HOMETEAM').agg(total_goals=('tota
                 if 'Bayern Munich' not in total_goals['HOMETEAM'].values:
                     bayern_goals_home = season_data[season_data['HOMETEAM'] == 'Baye
                     bayern_goals_away = season_data[season_data['AWAYTEAM'] == 'Baye
                     bayern_goals = pd.concat([bayern_goals_home, bayern_goals_away])
                     bayern_total_goals = bayern_goals['total_goals'].sum()
                     total_goals = total_goals.append({'HOMETEAM': 'Bayern Munich',
                 plt.figure(figsize=(12, 8))
                 for team in total_goals['HOMETEAM']:
                      team_data = total_goals[total_goals['HOMETEAM'] == team]
```

```
color = team_colors.get(team, 'gray')
    plt.plot([season], [team_data['total_goals'].values[0]], color=color
plt.grid(True, linestyle='--', alpha=0.6)

total_goals_bayern = total_goals[total_goals['HOMETEAM'] == 'Bayern
    plt.title(f"Goals Trend in Season {season} - Total Goals: {total_goals_bayern}', has

plt.values('Season', fontsize=14)
    plt.vlabel('Season', fontsize=14)

plt.vlabel('Total Goals', fontsize=14)

plt.vticks(rotation=45, fontsize=12)
    plt.legend(loc='upper left', fontsize=12, frameon=True)

pdf.savefig()
    plt.close()

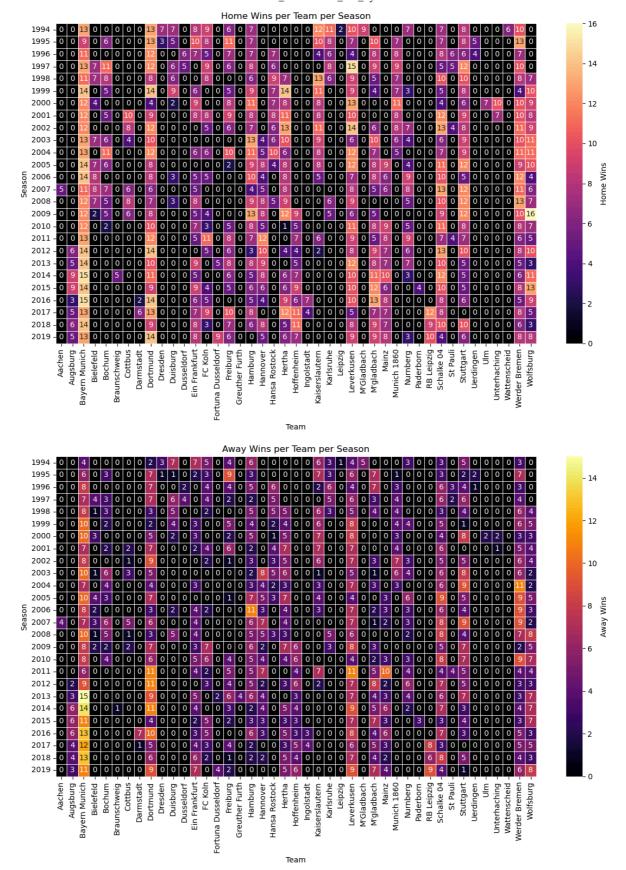
output_pdf
```

Out[21]: 'goal_trends_per_season_colored_readable.pdf'

Part 2 | Home Advantage Deconstructed

Part 2.1 Heatmaps for Home and Away Wins

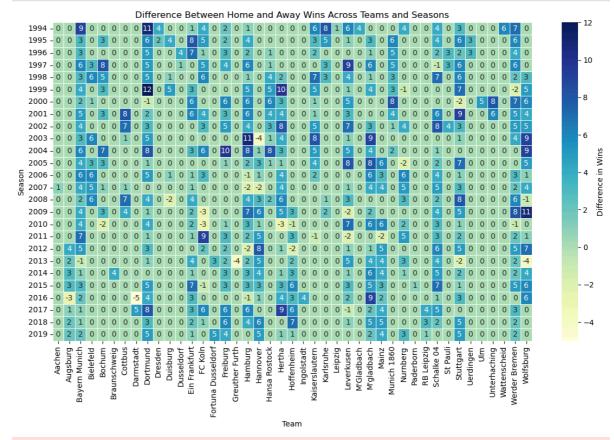
```
bundesliga_df = pd.read_csv('bundesliga.csv')
In [22]:
          bundesliga df['HOME WIN'] = (bundesliga df['FTHG'] > bundesliga df['FTAG'])
         bundesliga_df['AWAY_WIN'] = (bundesliga_df['FTHG'] < bundesliga_df['FTAG'])</pre>
          home_wins = bundesliga_df.groupby(['SEASON', 'HOMETEAM'])['HOME_WIN'].sum()
         away_wins = bundesliga_df.groupby(['SEASON', 'AWAYTEAM'])['AWAY_WIN'].sum()
         plt.figure(figsize=(12, 8))
          sns.heatmap(home_wins, annot=True, fmt="d", cmap="magma", cbar_kws={'label'
          plt.title('Home Wins per Team per Season')
         plt.xlabel('Team')
         plt.ylabel('Season')
         plt.xticks(rotation=90)
         plt.tight_layout()
         plt.show()
         plt.figure(figsize=(12, 8))
         sns.heatmap(away_wins, annot=True, fmt="d", cmap="inferno", cbar_kws={'labe'
         plt.title('Away Wins per Team per Season')
         plt.xlabel('Team')
         plt.ylabel('Season')
         plt.xticks(rotation=90)
         plt.tight_layout()
         plt.show()
```



Part 2.2 Visualization for Wins Difference

```
In [23]: merged_wins = home_wins.subtract(away_wins, fill_value=0)
    merged_wins['Difference'] = merged_wins.sum(axis=1)
    plt.figure(figsize=(12, 8))
    sns.heatmap(merged_wins.drop('Difference', axis=1), annot=True, fmt="d", cma
```

```
plt.title('Difference Between Home and Away Wins Across Teams and Seasons')
plt.xlabel('Team')
plt.ylabel('Season')
plt.xticks(rotation=90)
plt.tight_layout()
plt.show()
plt.figure(figsize=(16, 12))
merged_wins.drop('Difference', axis=1).plot(kind='bar', stacked=False, width
plt.title('Difference Between Home and Away Wins for Each Team Across All S€
plt.xlabel('Season', fontsize=14)
plt.ylabel('Difference in Wins (Home - Away)', fontsize=14)
plt.xticks(rotation=90, fontsize=12)
plt.yticks(fontsize=12)
plt.grid(True, axis='y', linestyle='--', alpha=0.7)
plt.legend(title='Teams', bbox to anchor=(1.05, 1), loc='upper left', fonts
plt.tight_layout()
plt.show()
```



/var/folders/cz/ysxc02l92kv04yfdk1rqmzx80000gn/T/ipykernel_73647/972881905.
py:27: UserWarning: Tight layout not applied. The bottom and top margins ca
nnot be made large enough to accommodate all axes decorations.
 plt.tight_layout()

<Figure size 1600x1200 with 0 Axes>

Difference Between Home and Away Wins for Each Team Across All Seasons 12.5 Teams Difference in Wins (Home - Away) Aachen 10.0 Augsburg Bayern Munich 7.5 Bielefeld **Bochum** 5.0 Braunschweig Cottbus 2.5 Darmstadt Dortmund 0.0 Dresden Duisburg Dusseldorf -2.5Ein Frankfurt FC Koln -5.0Fortuna Dusseldorf 1994 1995 1995 1998 1999 1999 2000 2000 2007 2007 2008 2009 2010 2011 2012 2013 2015 2016 2017 2018 2019 Freiburg Greuther Furth Season Hamburg Hannover Hansa Rostock Hertha Hoffenheim IngoIstadt Kaiserslautern Karlsruhe Leipzig Leverkusen M'Gladbach M'gladbach Mainz Munich 1860 Nurnberg Paderborn **RB** Leipzig Schalke 04 St Pauli Stuttgart Uerdingen Ulm

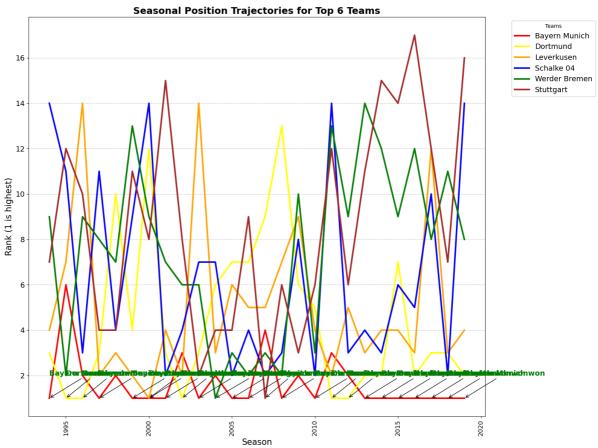
Part 3

Part 3.1 Team Trajectories and Volatility

```
In [24]:
                                             bundesliga_df['HOME_POINTS'] = (bundesliga_df['FTHG'] > bundesliga_df['FTAG
                                             bundesliga_df['AWAY_POINTS'] = (bundesliga_df['FTHG'] < bundesliga_df['FTAG</pre>
                                             season_points = bundesliga_df.groupby(['SEASON', 'HOMETEAM'])['HOME_POINTS'
                                             season_points_df = season_points.reset_index(name='Total_Points')
                                             season_points_df['Rank'] = season_points_df.groupby('SEASON')['Total_Points
                                             top_teams = season_points_df.groupby('HOMETEAM')['Total_Points'].sum().nlare
                                              top_teams_season = season_points_df[season_points_df['HOMETEAM'].isin(top_teams_season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_points_df[season_poin
```

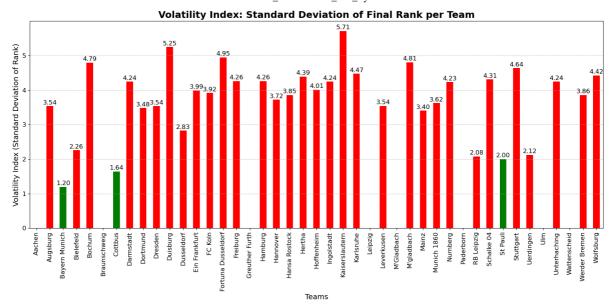
Unterhaching Wattenscheid Werder Bremen Wolfsburg

```
team colors = {
    'Bayern Munich': 'red',
    'Dortmund': 'yellow',
    'Leverkusen': 'orange',
    'Schalke 04': 'blue',
    'Werder Bremen': 'green',
    'Stuttgart': 'brown'
plt.figure(figsize=(16, 12))
for team in top_teams:
    team_data = top_teams_season[top_teams_season['HOMETEAM'] == team]
    color = team_colors.get(team, 'gray')
    plt.plot(team data['SEASON'], team data['Rank'], label=team, color=color
for team in top_teams:
    team_data = top_teams_season[top_teams_season['HOMETEAM'] == team]
    title_winning_seasons = team_data[team_data['Rank'] == 1]['SEASON']
    for season in title_winning_seasons:
        plt.annotate(f'{team} won', xy=(season, 1), xytext=(season, 2),
                     arrowprops=dict(facecolor='black', arrowstyle='->'),
                     fontsize=14, color='green', fontweight='bold')
plt.title('Seasonal Position Trajectories for Top 6 Teams', fontsize=18, for
plt.xlabel('Season', fontsize=16)
plt.ylabel('Rank (1 is highest)', fontsize=16)
plt.xticks(rotation=90, fontsize=12)
plt.yticks(fontsize=14)
plt.grid(True, axis='y', linestyle='--', alpha=0.7)
plt.legend(title='Teams', bbox_to_anchor=(1.05, 1), loc='upper left', fonts
plt.tight layout()
plt.show()
```



Part 3.2 Volatility Index

```
season points = bundesliga df.groupby(['SEASON', 'HOMETEAM'])['HOME POINTS']
In [25]:
         season points df = season points.reset index(name='Total Points')
         season_points_df['Rank'] = season_points_df.groupby('SEASON')['Total_Points
         volatility_index = season_points_df.groupby('HOMETEAM')['Rank'].std()
         plt.figure(figsize=(14, 8))
         colors = volatility index.apply(lambda x: 'green' if x <= 2 else 'red')</pre>
         volatility_index.plot(kind='bar', color=colors, figsize=(16, 8))
         for i, value in enumerate(volatility_index):
             plt.text(i, value + 0.05, f'{value:.2f}', ha='center', fontsize=12, cole
         plt.title('Volatility Index: Standard Deviation of Final Rank per Team', for
         plt.xlabel('Teams', fontsize=14)
         plt.ylabel('Volatility Index (Standard Deviation of Rank)', fontsize=14)
         plt.xticks(rotation=90, fontsize=12)
         plt.yticks(fontsize=12)
         plt.grid(axis='y', linestyle='--', alpha=0.7)
         plt.tight layout()
         plt.show()
         posx and posy should be finite values
         posx and posy should be finite values
```



If the volatility index is less than 2, the team's bar will show green, meaning that they are the most successfull clubs in the league from 1994 to 2019

Part 4 | Rivarlies and Big Match Patterns

Part 4.1

```
In [ ]:
        rivalries = [
             ('Bayern Munich', 'Dortmund'),
             ('Schalke 04', 'Dortmund'),
            ('Bayern Munich', 'Leverkusen'),
            ('Werder Bremen', 'Hamburg'),
            ('Bayern Munich', 'Wolfsburg')
        fig, axes = plt.subplots(3, 2, figsize=(16, 12))
        for idx, (team1, team2) in enumerate(rivalries):
            ax = axes[idx // 2, idx % 2]
             rivalry_df = bundesliga_df[
                 ((bundesliga_df['HOMETEAM'] == team1) & (bundesliga_df['AWAYTEAM']
                 ((bundesliga_df['HOMETEAM'] == team2) & (bundesliga_df['AWAYTEAM']
             rivalry_df['result'] = rivalry_df.apply(lambda row: 'Home Win' if row['[
                                                      else ('Away Win' if row['FTHG']
             result_counts = rivalry_df['result'].value_counts()
            sns.barplot(x=result_counts.index, y=result_counts.values, ax=ax)
            ax.set_title(f'{team1} vs {team2}')
            ax.set_ylabel('Number of Matches')
            ax.set_xlabel('Result')
             rivalry_df['goal_diff'] = abs(rivalry_df['FTHG'] - rivalry_df['FTAG'])
            max_win = rivalry_df.loc[rivalry_df['goal_diff'].idxmax()]
            ax.annotate(f'Max Win Margin: {max_win["goal_diff"]} goals',
                        xy=(0.5, 0.8), xycoords='axes fraction',
```

```
ha='center', fontsize=12, color='red', fontweight='bold')
plt.tight_layout()
plt.show()
```

Part 4.2

```
season points = bundesliga df.groupby(['SEASON', 'HOMETEAM'])['HOME POINTS']
In [30]:
         season_points_df = season_points.reset_index(name='Total_Points')
         season_points_df['Rank'] = season_points_df.groupby('SEASON')['Total_Points
         top 5 teams = season points df.groupby('HOMETEAM')['Total Points'].sum().nla
         def is_upset(row):
             home_team_rank = season_points_df[(season_points_df['HOMETEAM'] == row[
             away_team_rank = season_points_df[(season_points_df['HOMETEAM'] == row[
             home_is_top5 = row['HOMETEAM'] in top_5_teams
             away_is_top5 = row['AWAYTEAM'] in top_5_teams
             if (home_is_top5 and away_team_rank > home_team_rank + 8) or (away_is_to
                  return True
             return False
         bundesliga_df['upset'] = bundesliga_df.apply(is_upset, axis=1)
         upsets_df = bundesliga_df[bundesliga_df['upset'] == True]
         if upsets_df.empty:
             print("No upsets in the dataset.")
         else:
             plt.figure(figsize=(12, 8))
             upsets_df['rank_diff'] = abs(upsets_df['FTHG'] - upsets_df['FTAG']) # >
             upsets_df['goal_diff'] = upsets_df['FTHG'] - upsets_df['FTAG'] # y-axis
             sns.set_palette("Set2")
             sns.scatterplot(
                 x=upsets_df['rank_diff'],
                 y=upsets_df['goal_diff'],
                 hue=upsets_df['HOMETEAM'],
                 palette='Set2',
                 s=150,
                 edgecolor='black',
                 alpha=0.8,
                 marker='o'
             )
             largest_upsets = upsets_df.nlargest(5, 'goal_diff')
             for i, row in largest_upsets.iterrows():
                  plt.text(
                      row['rank_diff'], row['goal_diff'],
                     f'{row["HOMETEAM"]} vs {row["AWAYTEAM"]}',
                     fontsize=10,
                     color='black',
                     ha='center',
                     va='bottom'
                  )
             plt.title('Upset Visualizer: Rank Difference vs Goal Difference', fonts:
```

```
plt.xlabel('Rank Difference (Home vs Away)', fontsize=14)
plt.ylabel('Goal Difference (Home - Away)', fontsize=14)

plt.grid(True, linestyle='--', alpha=0.5)

plt.tight_layout()

plt.show()
```

/var/folders/cz/ysxc02l92kv04yfdk1rqmzx80000gn/T/ipykernel_73647/144938391 6.py:45: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.

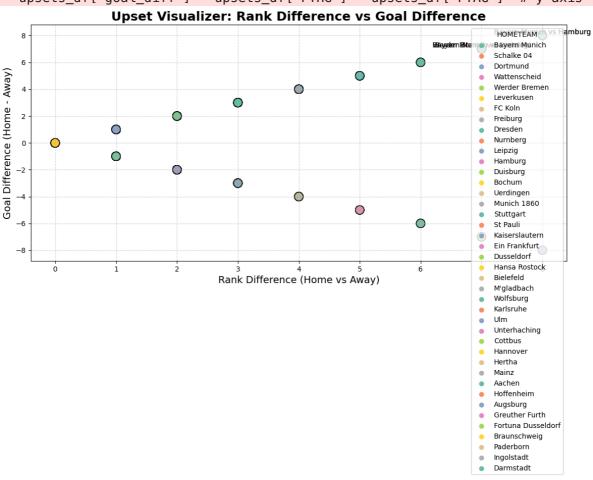
A value is trying to be set on a copy of a slice from a DataFrame. Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-doc s/stable/user_guide/indexing.html#returning-a-view-versus-a-copy upsets_df['rank_diff'] = abs(upsets_df['FTHG'] - upsets_df['FTAG']) # x-axis

/var/folders/cz/ysxc02l92kv04yfdk1rqmzx80000gn/T/ipykernel_73647/144938391 6.py:46: 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

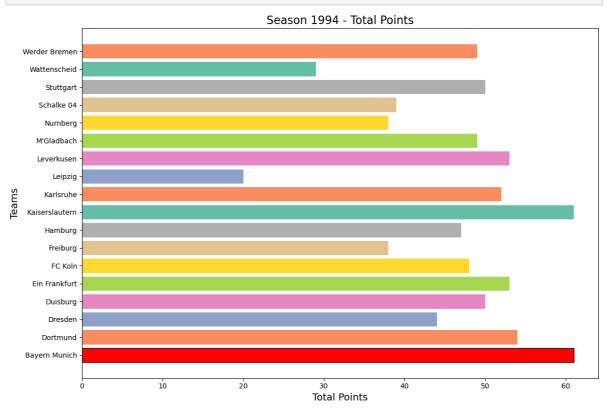
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copyupsets_df['goal_diff'] = upsets_df['FTHG'] - upsets_df['FTAG'] # y-axis



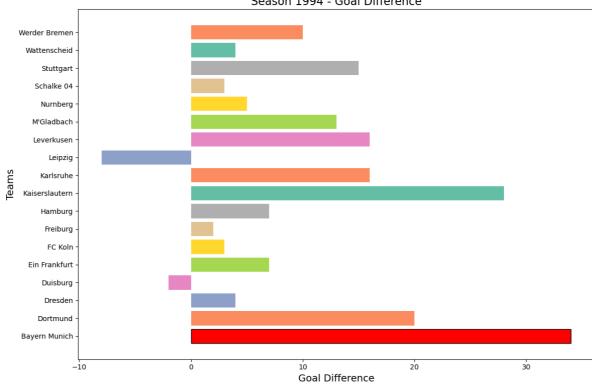
Part 5

```
In [32]: season_points = bundesliga_df.groupby(['SEASON', 'HOMETEAM'])['HOME_POINTS']
    season_points_df = season_points.reset_index(name='Total_Points')
```

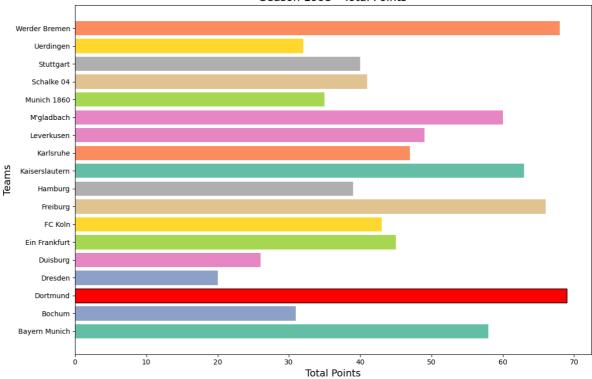
```
bundesliga df['Goal Difference'] = bundesliga df['FTHG'] - bundesliga df['FT
season_goal_diff = bundesliga_df.groupby(['SEASON', 'HOMETEAM'])['Goal_Diff@
season_points_df = pd.merge(season_points_df, season_goal_diff, on=['SEASON
teams = season points df['HOMETEAM'].unique()
team_colors = {team: sns.color_palette("Set2")[i % len(sns.color_palette("Seta")]
for season in season points df['SEASON'].unique():
    season_data = season_points_df[season_points_df['SEASON'] == season]
   winner_team_points = season_data.loc[season_data['Total_Points'].idxmax
   winner_team_goal_diff = season_data.loc[season_data['Goal_Difference'].:
    plt.figure(figsize=(12, 8))
    plt.barh(season_data['HOMETEAM'], season_data['Total_Points'], color=[te
    plt.barh(winner_team_points['HOMETEAM'], winner_team_points['Total_Point
    plt.title(f'Season {season} - Total Points', fontsize=16)
    plt.xlabel('Total Points', fontsize=14)
   plt.ylabel('Teams', fontsize=14)
    plt.tight_layout()
    plt.show()
    plt.figure(figsize=(12, 8))
    plt.barh(season_data['HOMETEAM'], season_data['Goal_Difference'], color=
    plt.barh(winner team goal diff['HOMETEAM'], winner team goal diff['Goal
    plt.title(f'Season {season} - Goal Difference', fontsize=16)
    plt.xlabel('Goal Difference', fontsize=14)
   plt.ylabel('Teams', fontsize=14)
    plt.tight_layout()
    plt.show()
```



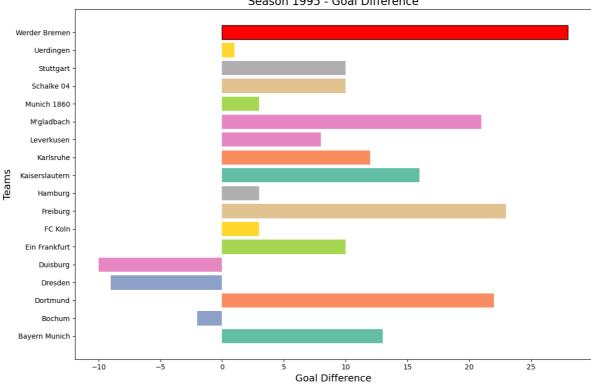
Season 1994 - Goal Difference

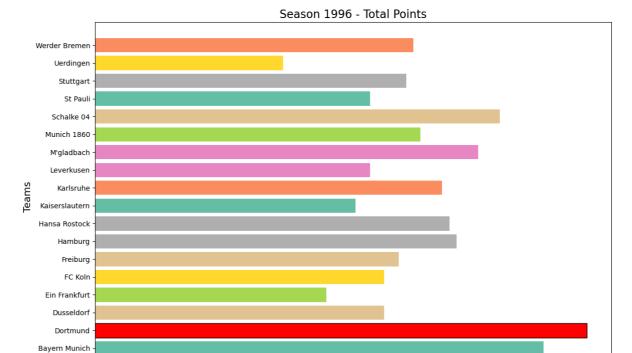


Season 1995 - Total Points



Season 1995 - Goal Difference





Total Points

50

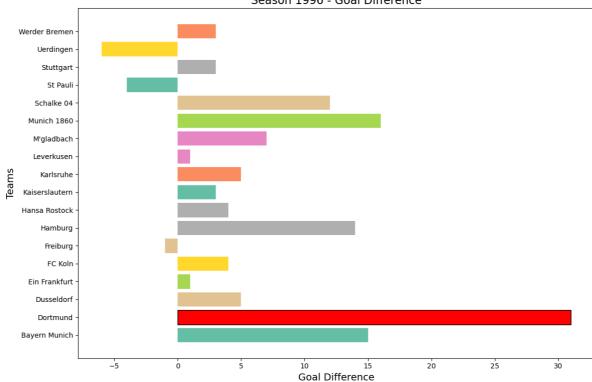
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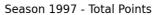
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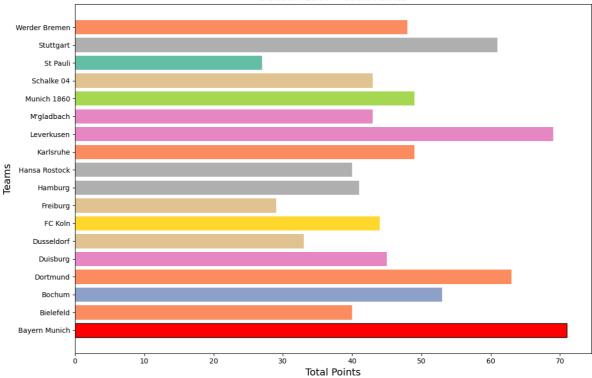
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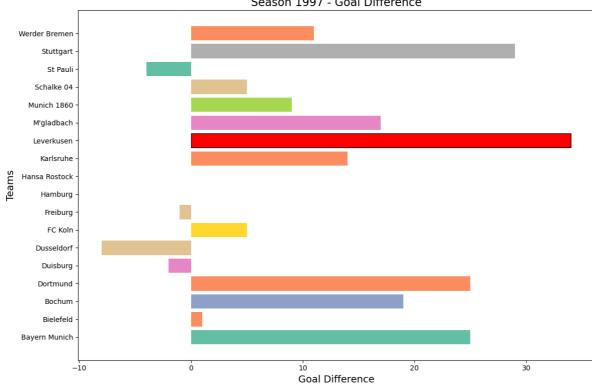
Season 1996 - Goal Difference

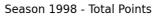


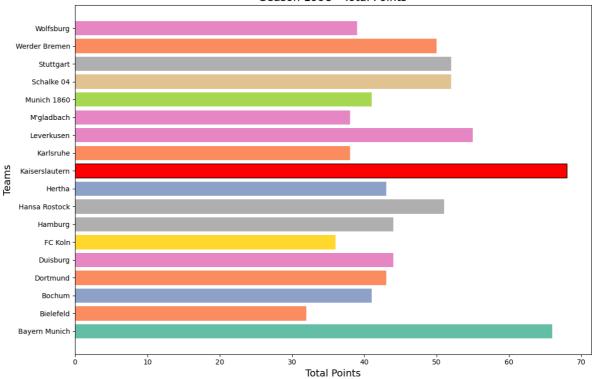




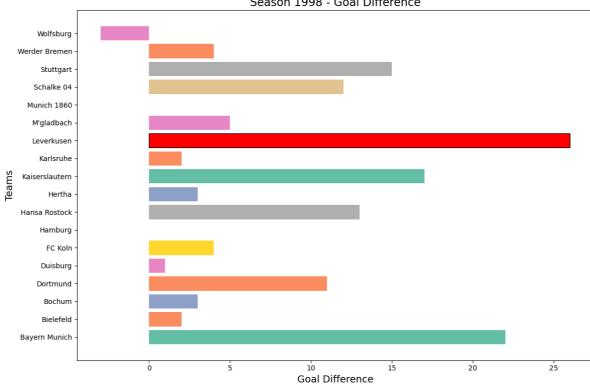
Season 1997 - Goal Difference

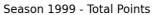


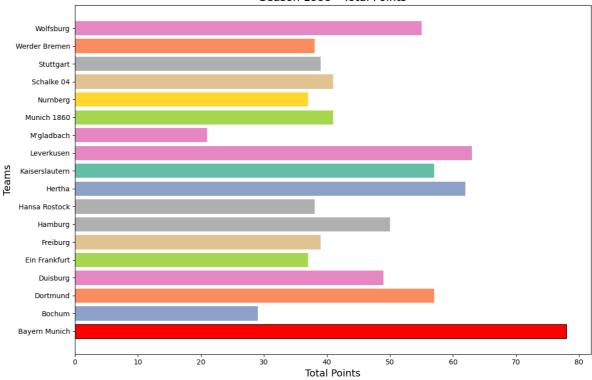




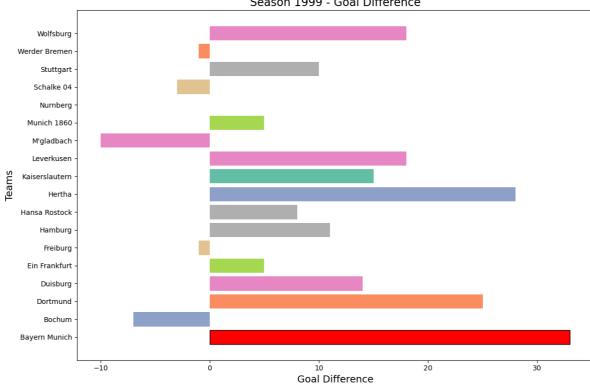
Season 1998 - Goal Difference

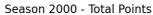


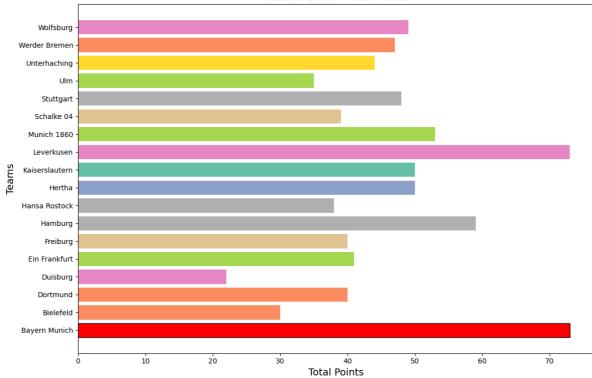




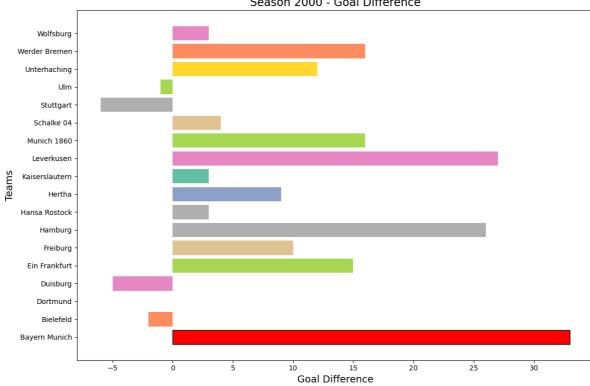
Season 1999 - Goal Difference

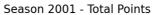


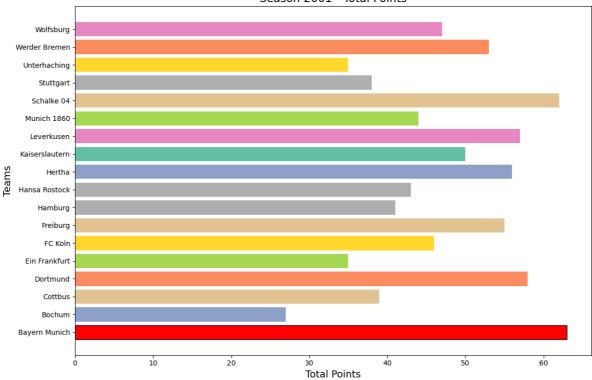


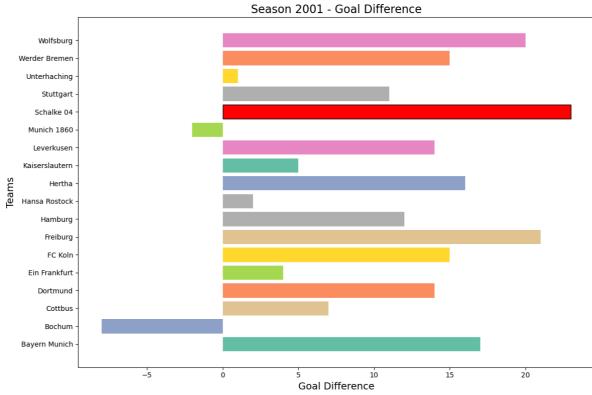


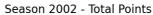
Season 2000 - Goal Difference

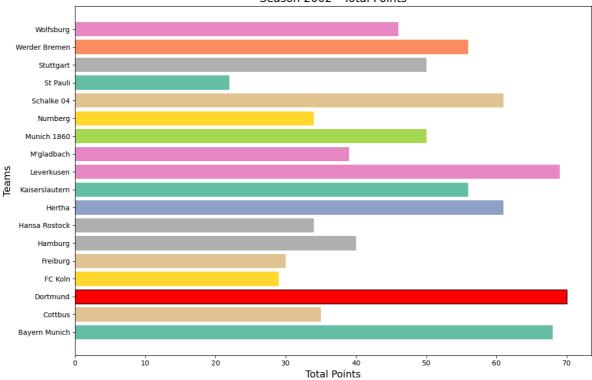


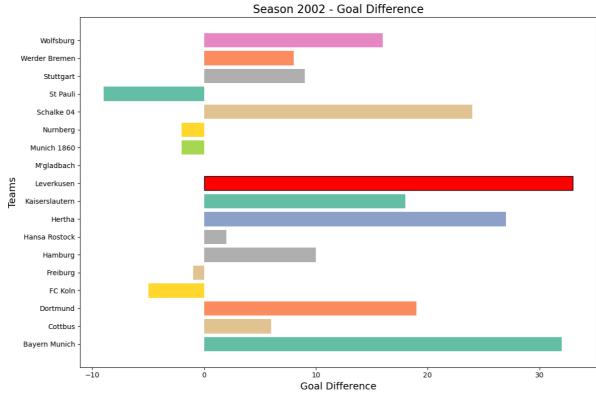


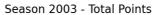


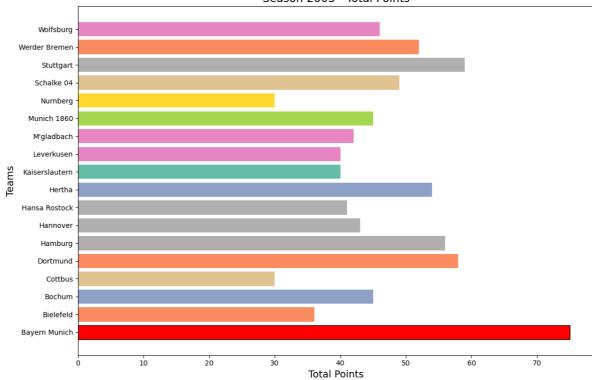


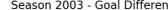


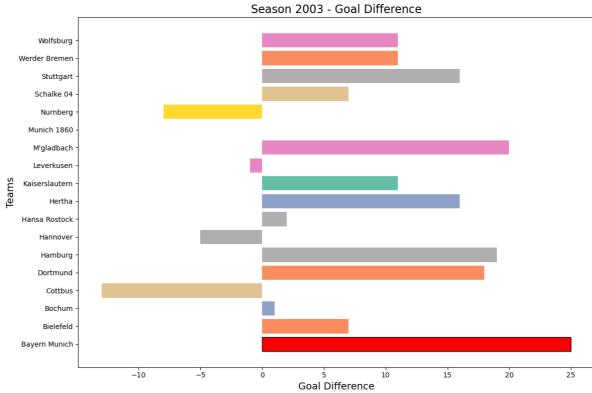


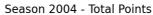


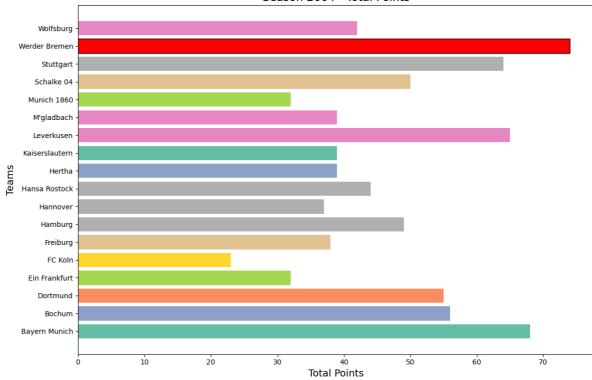




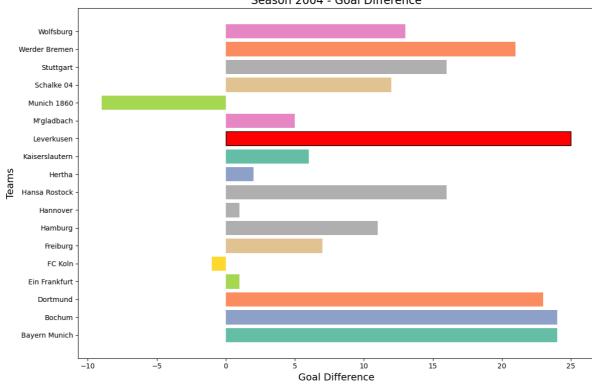




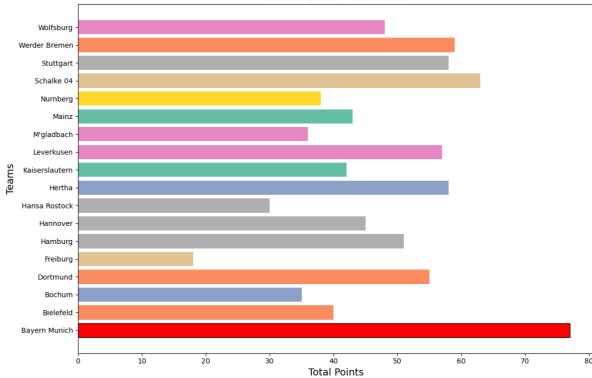




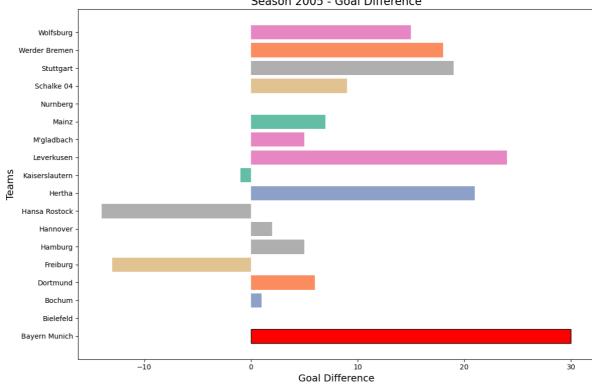
Season 2004 - Goal Difference



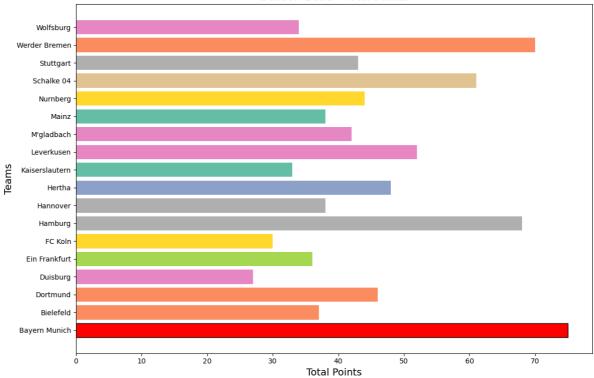
Season 2005 - Total Points

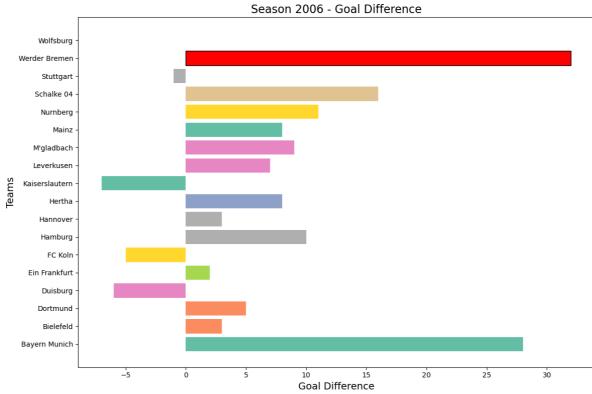


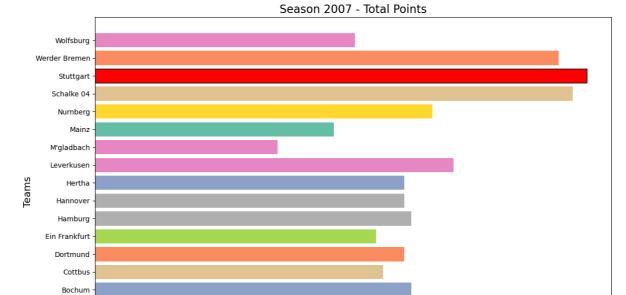
Season 2005 - Goal Difference



Season 2006 - Total Points







Total Points

50

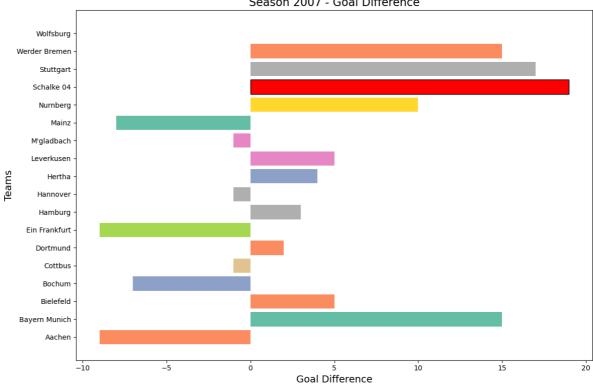
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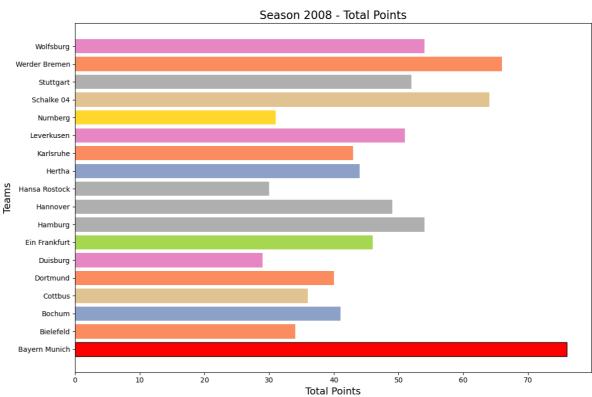
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Bielefeld Bayern Munich

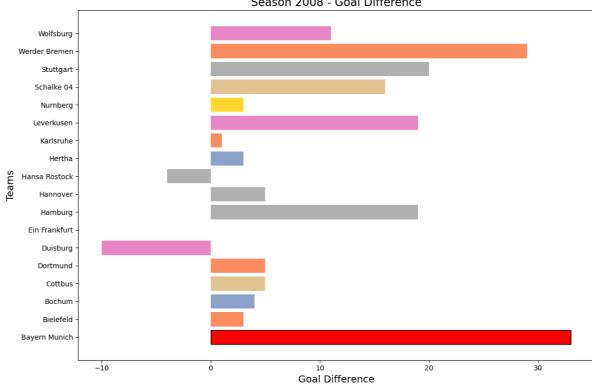
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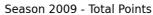
Season 2007 - Goal Difference

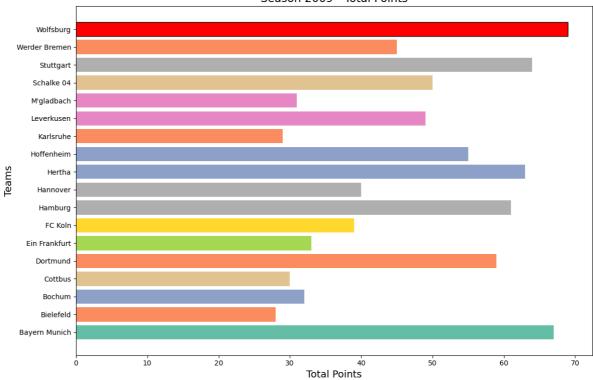




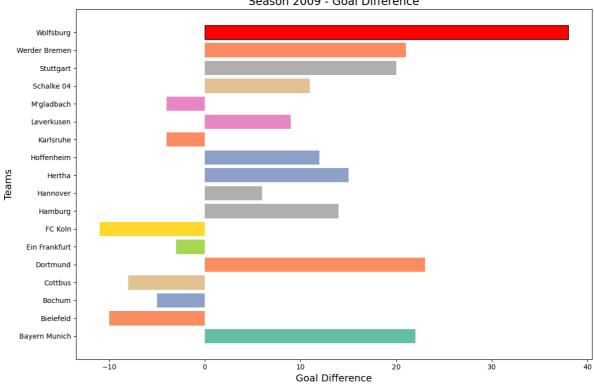
Season 2008 - Goal Difference

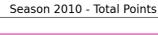


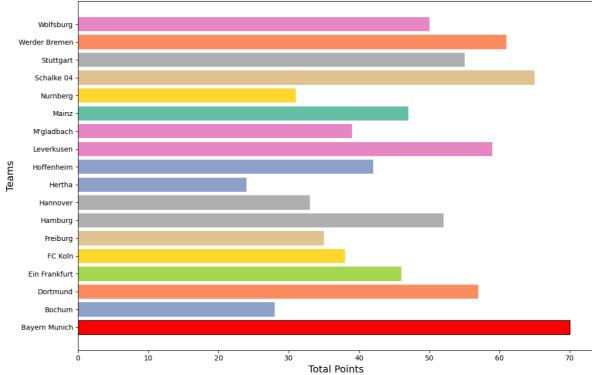




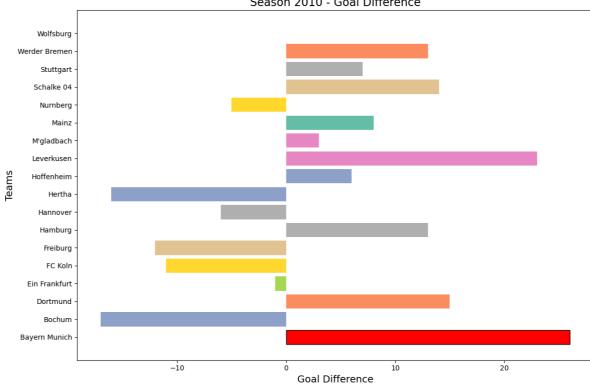
Season 2009 - Goal Difference

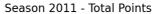


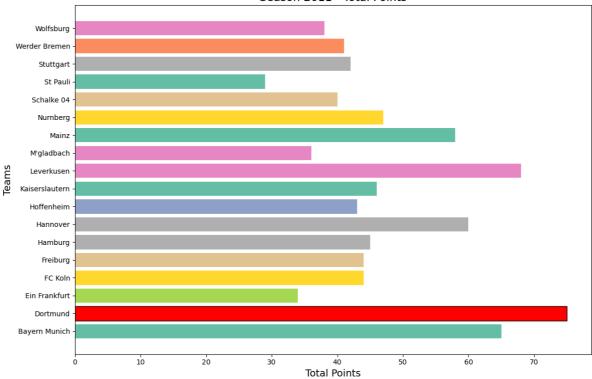




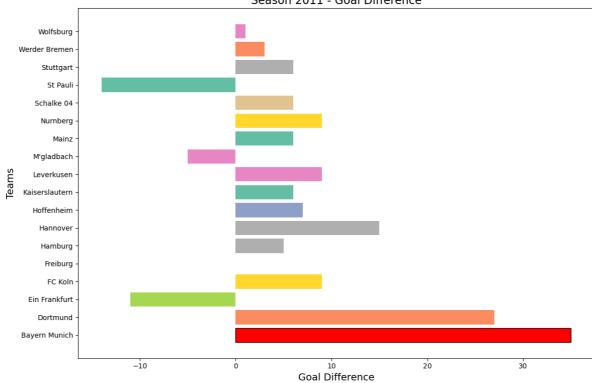
Season 2010 - Goal Difference



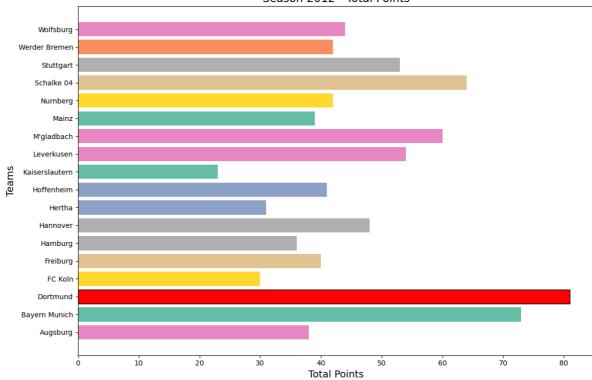




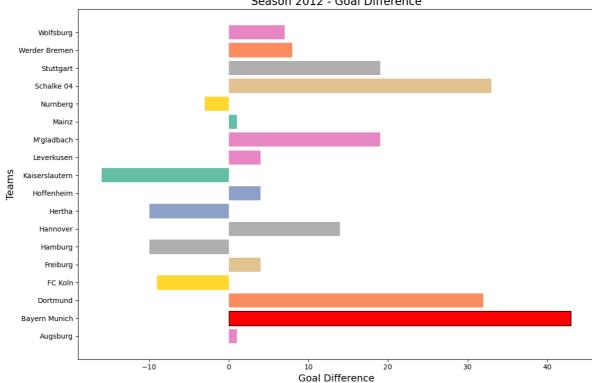
Season 2011 - Goal Difference



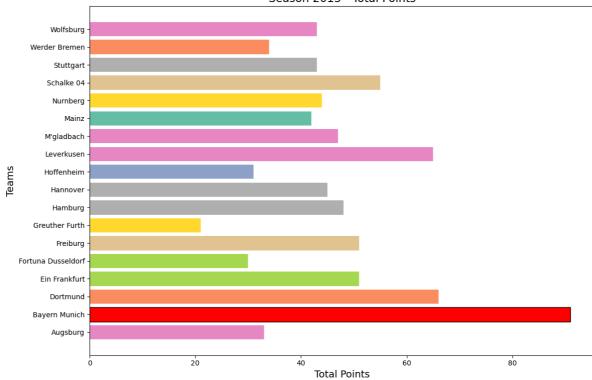
Season 2012 - Total Points



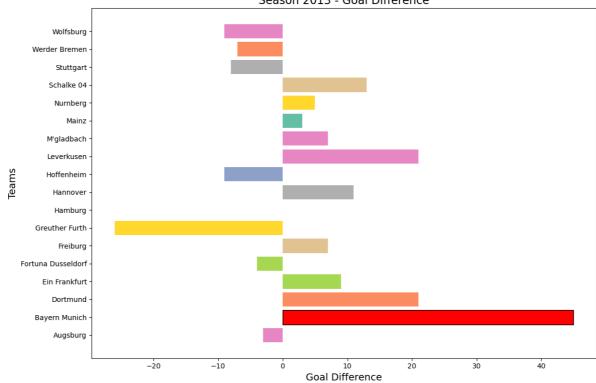
Season 2012 - Goal Difference

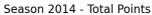


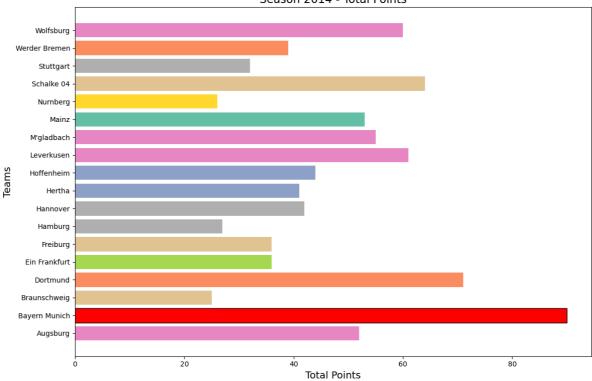
Season 2013 - Total Points



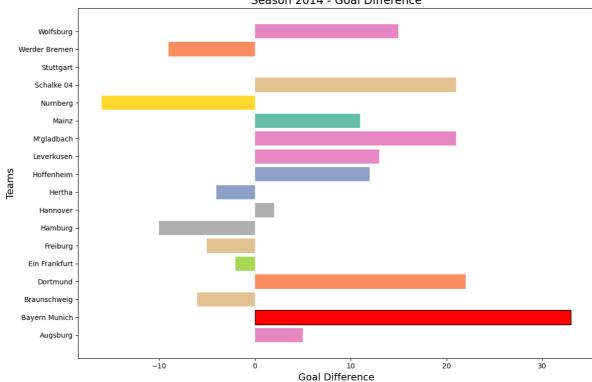
Season 2013 - Goal Difference



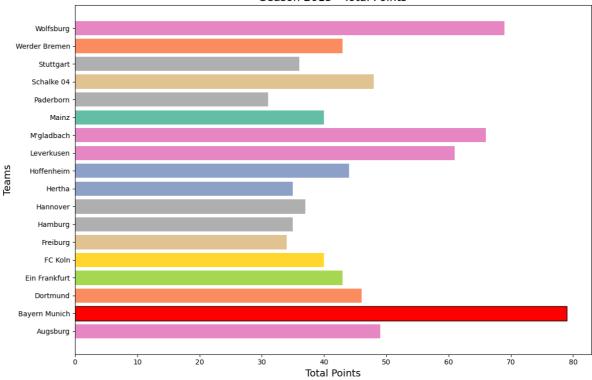




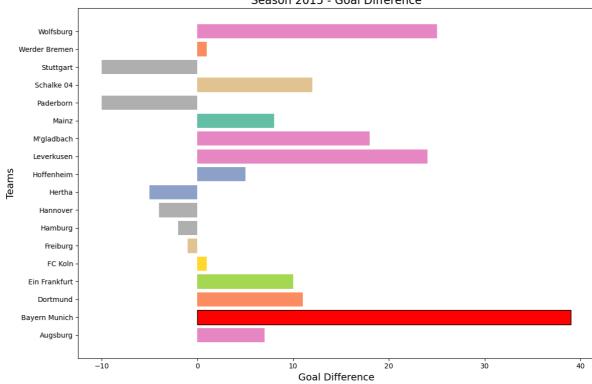
Season 2014 - Goal Difference

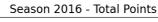


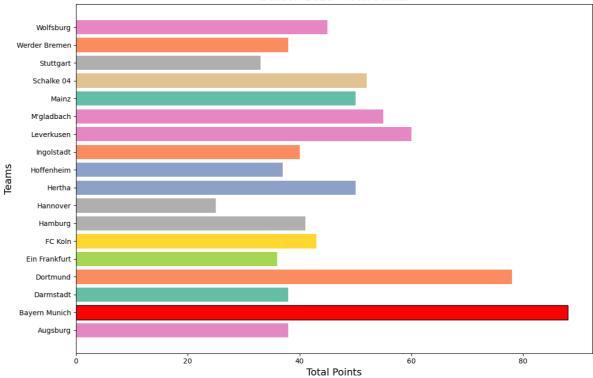
Season 2015 - Total Points

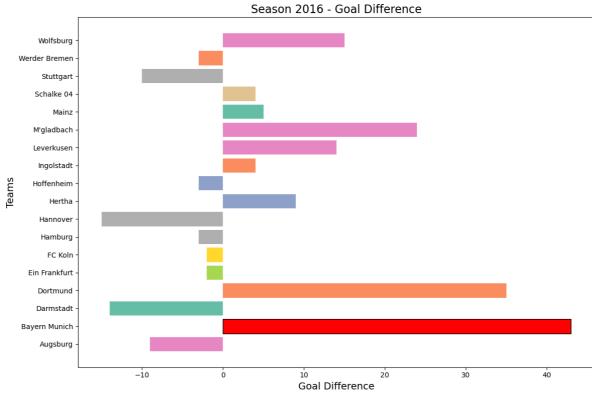


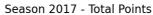
Season 2015 - Goal Difference

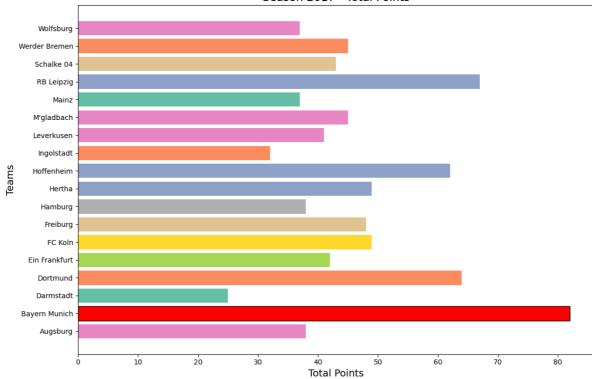




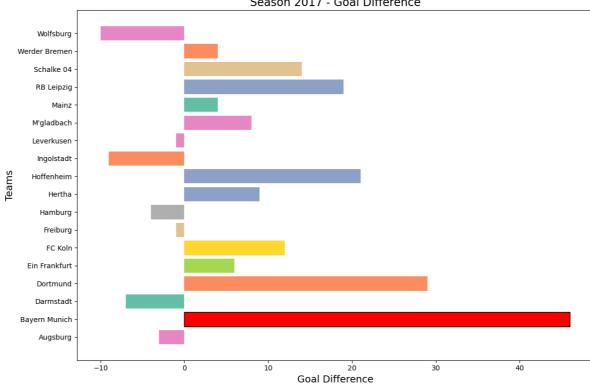


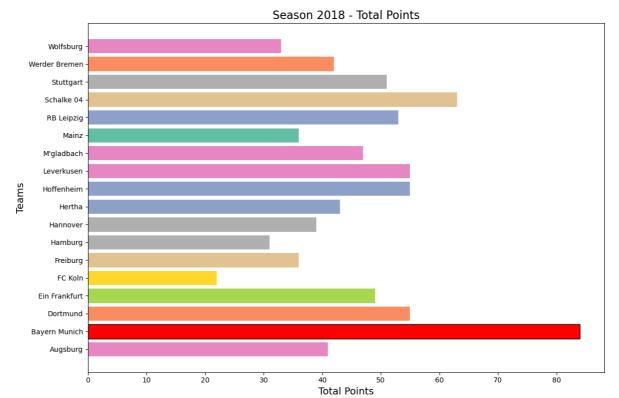






Season 2017 - Goal Difference





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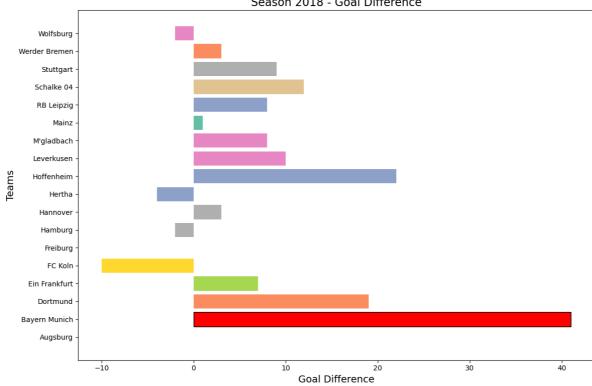
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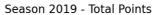
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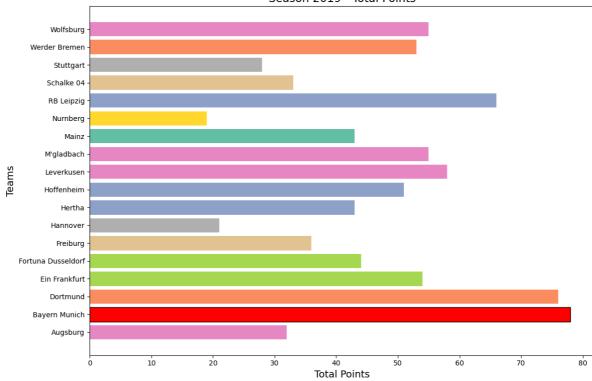
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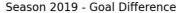
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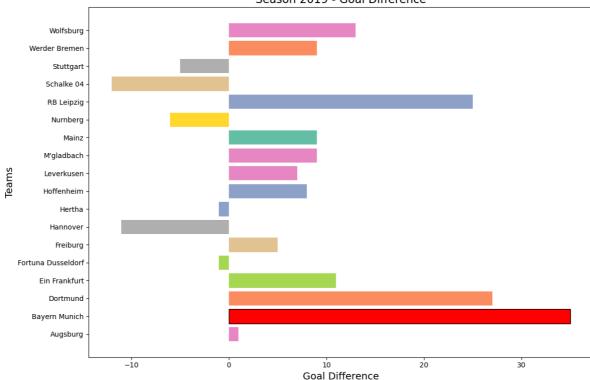
Season 2018 - Goal Difference











Part 6

```
teams = ['Bayern Munich', 'Bayer Leverkusen', 'Borussia Dortmund']
team_data = bundesliga_df[bundesliga_df['HOMETEAM'].isin(teams) | bundesliga_df[bundesliga_df['HOMETEAM'].isin(teams) | bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesliga_df[bundesli
team goals = \{\}
for team in teams:
              team_matches = team_data[(team_data['HOMETEAM'] == team) | (team_data['/
              if not team_matches.empty:
                           team_goals[team] = {
                                         'mean': team_matches['FTHG'].mean(),
                                         'std': team_matches['FTHG'].std() if team_matches['FTHG'].std()
             else:
                           team_goals[team] = {
                                         'mean': 1,
                                         'std': 1
                           }
n_simulations = 10000
n_seasons = 10
simulation_results = {team: [] for team in teams}
 for team in teams:
              mean_goals = team_goals[team]['mean']
              std_goals = team_goals[team]['std']
              for _ in range(n_simulations):
                           simulated_goals = np.random.normal(loc=mean_goals, scale=std_goals,
                           simulation_results[team].append(simulated_goals)
 flattened_results = {
              team: np.array(simulation_results[team]).flatten()
              for team in teams
```

```
simulation_df = pd.DataFrame(flattened_results)
simulation_long_df = simulation_df.melt(var_name='Team', value_name='Goals')
simulation_long_df['Goals'] = pd.to_numeric(simulation_long_df['Goals'], errsimulation_long_df['Team'] = simulation_long_df['Team'].astype('category')

plt.figure(figsize=(12, 8))
sns.boxplot(data=simulation_long_df, x='Team', y='Goals', palette='Set2')
plt.title('Monte Carlo Simulation: Predicted Goals for Next 10 Seasons', for plt.xlabel('Teams', fontsize=14)
plt.ylabel('Goals Scored', fontsize=14)
plt.xticks(rotation=45)
plt.tight_layout()
plt.show()
```

