```
# Importing libraries
In [61]:
         import pandas as pd
         import numpy as np
         from datetime import datetime
          import matplotlib.pyplot as plt
          import seaborn as sns
          from sklearn.linear model import LinearRegression
         from sklearn.metrics import mean absolute error as mae, mean squared error as mse, acc
         from sklearn.tree import DecisionTreeRegressor
          from sklearn.ensemble import RandomForestRegressor
          from sklearn.ensemble import AdaBoostRegressor
         # Loading the dataset
In [23]:
         df = pd.read_csv('ipl.csv') #import file using pandas
         df.columns
In [24]:
         Index(['mid', 'date', 'venue', 'bat_team', 'bowl_team', 'batsman', 'bowler',
Out[24]:
                 'runs', 'wickets', 'overs', 'runs last 5', 'wickets last 5', 'striker',
                 'non-striker', 'total'],
               dtype='object')
         df.shape
                      # returns size of dataset
In [25]:
         (76014, 15)
Out[25]:
         df.dtypes # returns data types of each column
In [26]:
                              int64
         mid
Out[26]:
         date
                             object
         venue
                             object
         bat_team
                             object
                             object
         bowl_team
         batsman
                             object
         bowler
                             object
         runs
                             int64
                              int64
         wickets
         overs
                            float64
                              int64
         runs_last_5
         wickets_last_5
                              int64
         striker
                              int64
         non-striker
                              int64
         total
                              int64
         dtype: object
                     # returns top 5 rows of a data
         df.head()
In [27]:
```

Out[27]:

```
Kolkata
                                                    Royal
                                                                SC
                                        Knight Challengers
                                                                                       0
                                                                                            0.1
                        Chinnaswamy
                                                            Ganguly
                                                                     Kumar
                             Stadium
                                        Riders
                                                Bangalore
                                  Μ
                                        Kolkata
                                                    Roval
                  2008-
                                                                BB
          1
                         Chinnaswamy
                                        Knight Challengers
                                                                                       0
                                                                                            0.2
                  04-18
                                                           McCullum
                                                                     Kumar
                             Stadium
                                        Riders
                                                Bangalore
                                        Kolkata
                                                    Royal
                  2008-
                                                                BB
          2
                                                                                       0
                                                                                            0.2
                         Chinnaswamy
                                        Knight Challengers
                                                                               2
                  04-18
                                                           McCullum
                                                                     Kumar
                             Stadium
                                        Riders
                                                Bangalore
                                        Kolkata
                                                    Royal
                                                                BB
                                                                         Ρ
                  2008-
          3
                                        Knight Challengers
                                                                               2
                                                                                       0
                                                                                            0.3
                         Chinnaswamy
                  04-18
                                                           McCullum
                                                                     Kumar
                             Stadium
                                        Riders
                                                Bangalore
                                        Kolkata
                                  Μ
                                                    Royal
                  2008-
                                                                BB
                                                                         Ρ
                                        Knight Challengers
                                                                               2
                                                                                       0
                                                                                            0.4
                         Chinnaswamy
                  04-18
                                                           McCullum
                                                                     Kumar
                                        Riders
                                                Bangalore
                             Stadium
          df.columns
In [28]:
          Index(['mid', 'date', 'venue', 'bat_team', 'bowl_team', 'batsman', 'bowler',
Out[28]:
                  'runs', 'wickets', 'overs', 'runs_last_5', 'wickets_last_5', 'striker',
                  'non-striker', 'total'],
                 dtype='object')
          # Data Cleaning
In [29]:
          # Remove unwanted column and keep only consistent teams
          # remove first 5 overs of the match
          columns_to_remove = ['mid', 'venue', 'batsman', 'bowler', 'striker', 'non-striker']
          print('Before removing unwanted columns: {}'.format(df.shape))
          df.drop(labels = columns_to_remove, axis = 1, inplace = True)
          print('After removing unwanted columns: {}'.format(df.shape))
          Before removing unwanted columns: (76014, 15)
          After removing unwanted columns: (76014, 9)
          df.columns
                        # updated dataset columns
In [31]:
          Index(['date', 'bat_team', 'bowl_team', 'runs', 'wickets', 'overs',
Out[31]:
                  'runs_last_5', 'wickets_last_5', 'total'],
                dtype='object')
          df.head() # updated dataset
In [32]:
```

```
Out[32]:
                                           Royal
              ----
                                      Challengers
                                                   1
                                                           0
                                                                0.1
                                                                             1
                                                                                          0
                                                                                              222
              Knight Riders
                                       Bangalore
                                           Royal
              2008-
                          Kolkata
          1
                                      Challengers
                                                    1
                                                           0
                                                                0.2
                                                                             1
                                                                                          0
                                                                                              222
              04-18
                     Knight Riders
                                       Bangalore
                                           Royal
              2008-
                          Kolkata
          2
                                      Challengers
                                                   2
                                                            0
                                                                0.2
                                                                             2
                                                                                              222
              04-18
                     Knight Riders
                                       Bangalore
                                           Royal
              2008-
                          Kolkata
          3
                                      Challengers
                                                           0
                                                                0.3
                                                                             2
                                                                                              222
                                                   2
                     Knight Riders
              04-18
                                       Bangalore
                                           Royal
              2008-
                          Kolkata
                                      Challengers
                                                                             2
                                                                                              222
                                                   2
                                                            0
                                                                0.4
              04-18 Knight Riders
                                       Bangalore
          df.index
In [33]:
          RangeIndex(start=0, stop=76014, step=1)
Out[33]:
          df['bat_team'].unique()
In [34]:
          array(['Kolkata Knight Riders', 'Chennai Super Kings', 'Rajasthan Royals',
Out[34]:
                 'Mumbai Indians', 'Deccan Chargers', 'Kings XI Punjab',
                 'Royal Challengers Bangalore', 'Delhi Daredevils',
                 'Kochi Tuskers Kerala', 'Pune Warriors', 'Sunrisers Hyderabad',
                 'Rising Pune Supergiants', 'Gujarat Lions',
                 'Rising Pune Supergiant'], dtype=object)
           consistent_teams = ['Kolkata Knight Riders', 'Chennai Super Kings', 'Rajasthan Royals
In [35]:
                                'Mumbai Indians', 'Kings XI Punjab', 'Royal Challengers Bangalore'
                               'Delhi Daredevils', 'Sunrisers Hyderabad']
          # Keeping only consistent teams (Remove teams with less season played)
In [36]:
          print('Before removing inconsistent teams: {}'.format(df.shape))
          df = df[(df['bat team'].isin(consistent teams)) & (df['bowl team'].isin(consistent teams))
          print('After removing inconsistent teams: {}'.format(df.shape))
          Before removing inconsistent teams: (76014, 9)
          After removing inconsistent teams: (53811, 9)
          df['bat_team'].unique()
In [37]:
          array(['Kolkata Knight Riders', 'Chennai Super Kings', 'Rajasthan Royals',
Out[37]:
                 'Mumbai Indians', 'Kings XI Punjab', 'Royal Challengers Bangalore',
                 'Delhi Daredevils', 'Sunrisers Hyderabad'], dtype=object)
          # Removing the first 5 overs data in every match
In [38]:
          print('Before removing first 5 overs data: {}'.format(df.shape))
          df = df[df['overs'] >= 5.0]
          print('After removing first 5 overs data: {}'.format(df.shape))
          Before removing first 5 overs data: (53811, 9)
          After removing first 5 overs data: (40108, 9)
```

```
In [40]: # Converting the column 'date' from string into datetime object
    print("Before converting 'date' column from string to datetime object: {}".format(type
    df['date'] = df['date'].apply(lambda x: datetime.strptime(x, '%Y-%m-%d'))
    print("After converting 'date' column from string to datetime object: {}".format(type)
```

Before converting 'date' column from string to datetime object: <class 'str'>
After converting 'date' column from string to datetime object: <class 'pandas._libs.t slibs.timestamps.Timestamp'>

```
In [42]: # Selecting correlated features using Heatmap
# Get correlation of all the features of the dataset
corr_matrix = df.corr()
top_corr_features = corr_matrix.index

# Plotting the heatmap
plt.figure(figsize=(13,10))
g = sns.heatmap(data=df[top_corr_features].corr(), annot=True, cmap='RdY1Gn')
```

C:\Users\admin\AppData\Local\Temp\ipykernel_7856\1468486487.py:3: FutureWarning: The default value of numeric_only in DataFrame.corr is deprecated. In a future version, i t will default to False. Select only valid columns or specify the value of numeric_on ly to silence this warning.

corr_matrix = df.corr()



```
In [43]: # Data Preprocessing
    # Handling categorical features
    # Splitting dataset into train and test set on the basis of date
```

```
# Converting categorical features using OneHotEncoding method
          encoded df = pd.get dummies(data=df, columns=['bat team', 'bowl team'])
          encoded_df.columns
          Index(['date', 'runs', 'wickets', 'overs', 'runs_last_5', 'wickets_last_5',
Out[43]:
                  'total', 'bat_team_Chennai Super Kings', 'bat_team_Delhi Daredevils',
                  'bat_team_Kings XI Punjab', 'bat_team_Kolkata Knight Riders',
                  'bat_team_Mumbai Indians', 'bat_team_Rajasthan Royals',
                  'bat_team_Royal Challengers Bangalore', 'bat_team_Sunrisers Hyderabad',
                  'bowl_team_Chennai Super Kings', 'bowl_team_Delhi Daredevils',
                  'bowl_team_Kings XI Punjab', 'bowl_team_Kolkata Knight Riders', 'bowl_team_Mumbai Indians', 'bowl_team_Rajasthan Royals',
                  'bowl team Royal Challengers Bangalore',
                  'bowl_team_Sunrisers Hyderabad'],
                 dtype='object')
          encoded df.head()
In [44]:
Out[44]:
              BEST - 1 49
```

 $5 \text{ rows} \times 23 \text{ columns}$

```
# Rearranging the columns
          encoded_df = encoded_df[['date', 'bat_team_Chennai Super Kings', 'bat_team_Delhi Dared
                        'bat_team_Kolkata Knight Riders', 'bat_team_Mumbai Indians', 'bat_team_F
                        'bat_team_Royal Challengers Bangalore', 'bat_team_Sunrisers Hyderabad',
                        'bowl_team_Chennai Super Kings', 'bowl_team_Delhi Daredevils', 'bowl_tea
                        'bowl_team_Kolkata Knight Riders', 'bowl_team_Mumbai Indians', 'bowl_tea
                        'bowl_team_Royal Challengers Bangalore', 'bowl_team_Sunrisers Hyderabad'
                        'overs', 'runs', 'wickets', 'runs_last_5', 'wickets_last_5', 'total']]
         # Splitting the data into train and test set
In [46]:
          X train = encoded df.drop(labels='total', axis=1)[encoded df['date'].dt.year <= 2016]</pre>
          X_test = encoded_df.drop(labels='total', axis=1)[encoded_df['date'].dt.year >= 2017]
         y_train = encoded_df[encoded_df['date'].dt.year <= 2016]['total'].values</pre>
         y test = encoded df[encoded df['date'].dt.year >= 2017]['total'].values
          # Removing the 'date' column
          X_train.drop(labels='date', axis=True, inplace=True)
         X_test.drop(labels='date', axis=True, inplace=True)
```

```
print("Training set: {} and Test set: {}".format(X train.shape, X test.shape))
         Training set: (37330, 21) and Test set: (2778, 21)
In [48]: # Model Building
         # •Linear Regression •Decision Tree Regression •Random Forest Regression •Adaptive Boo
         ## Linear Regression Model
         linear regressor = LinearRegression()
         linear_regressor.fit(X_train,y_train)
Out[48]: ▼ LinearRegression
         LinearRegression()
In [49]: # Predicting results
         y pred lr = linear regressor.predict(X test)
In [52]: # Linear Regression - Model Evaluation
         print("---- Linear Regression - Model Evaluation ----")
         print("Mean Absolute Error (MAE): {}".format(mae(y_test, y_pred_lr)))
         print("Mean Squared Error (MSE): {}".format(mse(y_test, y_pred_lr)))
         print("Root Mean Squared Error (RMSE): {}".format(np.sqrt(mse(y_test, y_pred_lr))))
         ---- Linear Regression - Model Evaluation ----
         Mean Absolute Error (MAE): 12.118617546193294
         Mean Squared Error (MSE): 251.00792310417438
         Root Mean Squared Error (RMSE): 15.843229566732106
In [54]: ## Decision Tree Regression Model
         decision_regressor = DecisionTreeRegressor()
         decision_regressor.fit(X_train,y_train)
Out[54]: ▼ DecisionTreeRegressor
         DecisionTreeRegressor()
In [55]: # Predicting results
         y_pred_dt = decision_regressor.predict(X_test)
        # Decision Tree Regression - Model Evaluation
In [56]:
         print("---- Decision Tree Regression - Model Evaluation ----")
         print("Mean Absolute Error (MAE): {}".format(mae(y_test, y_pred_dt)))
         print("Mean Squared Error (MSE): {}".format(mse(y_test, y_pred_dt)))
         print("Root Mean Squared Error (RMSE): {}".format(np.sqrt(mse(y_test, y_pred_dt))))
         ---- Decision Tree Regression - Model Evaluation ----
         Mean Absolute Error (MAE): 17.27537796976242
         Mean Squared Error (MSE): 544.1004319654428
         Root Mean Squared Error (RMSE): 23.32596047251737
In [58]: ## Random Forest Regression Model
         random regressor = RandomForestRegressor()
         random regressor.fit(X train,y train)
```

Out[58]:

▼ RandomForestRegressor

```
RandomForestRegressor()
         # Predicting results
In [59]:
         y pred rf = random regressor.predict(X test)
In [60]:
         # Random Forest Regression - Model Evaluation
         print("---- Random Forest Regression - Model Evaluation ----")
         print("Mean Absolute Error (MAE): {}".format(mae(y_test, y_pred_rf)))
         print("Mean Squared Error (MSE): {}".format(mse(y_test, y_pred_rf)))
         print("Root Mean Squared Error (RMSE): {}".format(np.sqrt(mse(y_test, y_pred_rf))))
         ---- Random Forest Regression - Model Evaluation ----
         Mean Absolute Error (MAE): 13.740630112448148
         Mean Squared Error (MSE): 329.3573730235518
         Root Mean Squared Error (RMSE): 18.148205779733484
In [62]: ## Linear Regression model performs best as compared to other two, use this model and
         ## AdaBoost Model using Linear Regression as the base Learner
         adb_regressor = AdaBoostRegressor(base_estimator=linear_regressor, n_estimators=100)
         adb_regressor.fit(X_train, y_train)
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\ensemble\ base.py:156: FutureWarni
         ng: `base_estimator` was renamed to `estimator` in version 1.2 and will be removed in
         1.4.
          warnings.warn(
                   AdaBoostRegressor
Out[62]:
          ▶ base estimator: LinearRegression
                   ▶ LinearRegression
In [63]: # Predicting results
         y pred adb = adb regressor.predict(X test)
In [64]: # AdaBoost Regression - Model Evaluation
         print("---- AdaBoost Regression - Model Evaluation ----")
         print("Mean Absolute Error (MAE): {}".format(mae(y_test, y_pred_adb)))
         print("Mean Squared Error (MSE): {}".format(mse(y_test, y_pred_adb)))
         print("Root Mean Squared Error (RMSE): {}".format(np.sqrt(mse(y test, y pred adb))))
         ---- AdaBoost Regression - Model Evaluation ----
         Mean Absolute Error (MAE): 12.038415817178553
         Mean Squared Error (MSE): 245.2055531391312
         Root Mean Squared Error (RMSE): 15.659040620010257
In [65]: ## Using AdaBoost did not reduce the error to a significant level. Hence, use simple l
In [66]: def predict score(batting team='Chennai Super Kings', bowling team='Mumbai Indians',
           temp array = list()
           # Batting Team
           if batting_team == 'Chennai Super Kings':
             temp_array = temp_array + [1,0,0,0,0,0,0,0]
```

```
elif batting_team == 'Delhi Daredevils':
   temp_array = temp_array + [0,1,0,0,0,0,0,0]
  elif batting team == 'Kings XI Punjab':
   temp_array = temp_array + [0,0,1,0,0,0,0,0]
  elif batting_team == 'Kolkata Knight Riders':
   temp_array = temp_array + [0,0,0,1,0,0,0,0]
 elif batting team == 'Mumbai Indians':
   temp_array = temp_array + [0,0,0,0,1,0,0,0]
 elif batting_team == 'Rajasthan Royals':
   temp array = temp array + [0,0,0,0,0,1,0,0]
 elif batting team == 'Royal Challengers Bangalore':
   temp array = temp array + [0,0,0,0,0,0,1,0]
  elif batting_team == 'Sunrisers Hyderabad':
   temp_array = temp_array + [0,0,0,0,0,0,0,1]
  # Bowling Team
  if bowling team == 'Chennai Super Kings':
   temp_array = temp_array + [1,0,0,0,0,0,0,0]
 elif bowling team == 'Delhi Daredevils':
   temp_array = temp_array + [0,1,0,0,0,0,0,0]
 elif bowling_team == 'Kings XI Punjab':
   temp_array = temp_array + [0,0,1,0,0,0,0,0]
  elif bowling_team == 'Kolkata Knight Riders':
   temp_array = temp_array + [0,0,0,1,0,0,0,0]
  elif bowling_team == 'Mumbai Indians':
   temp_array = temp_array + [0,0,0,0,1,0,0,0]
 elif bowling_team == 'Rajasthan Royals':
   temp_array = temp_array + [0,0,0,0,0,1,0,0]
 elif bowling_team == 'Royal Challengers Bangalore':
   temp_array = temp_array + [0,0,0,0,0,0,1,0]
 elif bowling_team == 'Sunrisers Hyderabad':
   temp_array = temp_array + [0,0,0,0,0,0,0,0,1]
  # Overs, Runs, Wickets, Runs_in_prev_5, Wickets_in_prev_5
 temp_array = temp_array + [overs, runs, wickets, runs_in_prev_5, wickets_in_prev_5]
  # Converting into numpy array
 temp array = np.array([temp array])
  # Prediction
  return int(linear_regressor.predict(temp_array)[0])
# • IPL : Season 11, Match number: 13
# • First Innings final score: 200/9
```

```
final score = predict score(batting team='Sunrisers Hyderabad', bowling team='Royal Ch
          print("The final predicted score (range): {} to {}".format(final score-10, final score
         The final predicted score (range): 138 to 153
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
         ot have valid feature names, but LinearRegression was fitted with feature names
           warnings.warn(
In [69]: # Prediction 3
         # • IPL : Season 11, Match number: 50
         # • First Innings final score: 186/8
         final_score = predict_score(batting_team='Mumbai Indians', bowling_team='Kings XI Punj
         print("The final predicted score (range): {} to {}".format(final_score-10, final_score
         The final predicted score (range): 180 to 195
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
         ot have valid feature names, but LinearRegression was fitted with feature names
           warnings.warn(
In [70]: # Prediction 4
         # • IPL : Season 12, Match number: 9
         # • First Innings final score: 176/7
         final_score = predict_score(batting_team='Mumbai Indians', bowling_team='Kings XI Punj
         print("The final predicted score (range): {} to {}".format(final_score-10, final_score
         The final predicted score (range): 179 to 194
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
         ot have valid feature names, but LinearRegression was fitted with feature names
           warnings.warn(
In [71]: # Prediction 5
         # • IPL : Season 12, Match number: 25
         # • First Innings final score: 151/7
         final_score = predict_score(batting_team='Rajasthan Royals', bowling_team='Chennai Sur
         print("The final predicted score (range): {} to {}".format(final score-10, final score
         The final predicted score (range): 128 to 143
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
         ot have valid feature names, but LinearRegression was fitted with feature names
           warnings.warn(
In [72]: # Prediction 6
         # • IPL : Season 12, Match number: 30
         # • First Innings final score: 155/7
         final score = predict score(batting team='Delhi Daredevils', bowling team='Sunrisers |
         print("The final predicted score (range): {} to {}".format(final score-10, final score
         The final predicted score (range): 157 to 172
         C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
         ot have valid feature names, but LinearRegression was fitted with feature names
           warnings.warn(
In [73]: # Prediction 7
         # • IPL : Season 12, Match number: 59
         # • First Innings final score: 147/9
```

```
final_score = predict_score(batting_team='Delhi Daredevils', bowling_team='Chennai Sur
print("The final predicted score (range): {} to {}".format(final_score-10, final_score)
The final predicted score (range): 137 to 152
```

C:\Users\admin\anaconda3\lib\site-packages\sklearn\base.py:464: UserWarning: X does n
ot have valid feature names, but LinearRegression was fitted with feature names
 warnings.warn(

In []: