Overview

- In this project we are gonna work with Cricket T20 world cup data. This data isto be trained for prediction for the fnal result of the match. The trained model is to deployed on Streamlit application which provides a interactive application to input the data and provide prediction of the match.
- Firstly we are gonna transform the data to create our features which can be used to train the data.
- Model will trained for 5 overs performance.
 - Last five over performance of a team will be recorded and provided to the model for it to predict the outcome
- · Features we will be focusing on are:
 - 1. batting team name
 - 2. bowling team name
 - 3. current score (runs scored)
 - 4. ball (balls played)
 - 5. over (current overs)
 - 6. ball left (balls left out of total ie. 120)
 - 7. wicket_left (wickets left out of total ie. 10)
 - 8. crr (current run rate)
 - 9. 5 ovr score (last 5 overs run scored)
 - 10. final score (total runs scored at the end of match)
 - 11. venue (stadium where match is being played)

```
In [1]: | 1 # pip install dash
In [2]: 1 import pandas as pd
          2 import numpy as np
          3 import pickle
          4 import gradio as gr
          5 import warnings
          6 warnings.filterwarnings('ignore')
In [3]:
         1 df = pd.read_csv('t20_wc.csv')
          2 df.head()
Out[3]:
           match_id batting_team bowling_team ball runs player_dismissed city
                                                                                      venue
         0
                        Australia
                                                                 0 NaN Melbourne Cricket Ground
                                   Sri Lanka 0.1
                                   Sri Lanka 0.2
                                                                 0 NaN Melbourne Cricket Ground
                 2
                        Australia
                                                  0
                                                                 0 NaN Melbourne Cricket Ground
         2
                 2
                        Australia
                                   Sri Lanka 0.3
                                                                 0 NaN Melbourne Cricket Ground
         3
                 2
                                   Sri Lanka 0.4
                                                  2
                        Australia
         4
                 2
                                   Sri Lanka 0.5
                                                                 0 NaN Melbourne Cricket Ground
                        Australia
In [4]: | 1 | df.info(), print(), print(f'Data has {df.shape} rows and columns respectively')
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 63888 entries, 0 to 63887
        Data columns (total 8 columns):
         # Column
                            Non-Null Count Dtype
         0 match_id
                               63888 non-null int64
             batting_team
                               63888 non-null object
         1
         2
                               63888 non-null object
             bowling_team
         3
             ball
                               63888 non-null float64
         4
                               63888 non-null int64
             runs
             player dismissed 63888 non-null object
         6 city
                                55340 non-null object
         7 venue
                               63888 non-null object
        dtypes: float64(1), int64(2), object(5)
        memory usage: 3.9+ MB
        Data has (63888, 8) rows and columns respectively
Out[4]: (None, None, None)
In [5]:
         1 df.nunique()
Out[5]: match_id
                             527
                             10
        batting_team
        bowling_team
                             10
                            179
        ball
                              8
        runs
        player_dismissed
                            519
                             81
        city
                             94
        venue
        dtype: int64
In [6]: 1 df.isnull().sum()
Out[6]: match_id
                               0
        batting_team
                               0
        bowling_team
                               0
        ball
                               0
                               0
        runs
        player_dismissed
                               0
        city
                             8548
        venue
        dtype: int64
In [7]: 1 df[df.duplicated()]
Out[7]:
               match_id batting_team bowling_team ball runs player_dismissed
                                                                            city
                                                                                           venue
```

till now, we have checked data for any erros.

- all the columns have correct data type
- Only city column has null values. we will check it later

Pakistan

South Africa 0.1

· there are no repeated rows.

618

38615

• Conclusion: data seems to be clean

In [8]: 1 df.drop(38615, inplace=True)

0 Abu Dhabi Sheikh Zayed Stadium

```
In [9]: | 1 | df[df['city'].isnull()]['venue'].value_counts()
 Out[9]: Dubai International Cricket Stadium
                                                           2969
          Pallekele International Cricket Stadium
                                                           2066
          Melbourne Cricket Ground
                                                           1453
          Sydney Cricket Ground
                                                            749
                                                            498
          Adelaide Oval
          Harare Sports Club
                                                            372
          Sharjah Cricket Stadium
                                                            249
          Sylhet International Cricket Stadium
                                                            128
          Carrara Oval
                                                             64
          Name: venue, dtype: int64
          Type Markdown and LaTeX: \alpha^2
            • we can identify the missing city names has venue names. And mostly stadium is named after city.
            • Thus, we can verify all city names with null values have venue names starting with the name of a city.

    We can extract the first word and add them in city column

In [10]:
            1 | df['city'] = df['city'].mask(df['city'].isnull(), df['venue'].str.split().str.get(0))
            2 df.head()
Out[10]:
              match_id batting_team bowling_team ball runs player_dismissed
                                                                                  city
                                                                                                      venue
           0
                                        Sri Lanka 0.1
                                                                          0 Melbourne Melbourne Cricket Ground
                     2
                            Australia
                     2
                            Australia
                                        Sri Lanka 0.2
                                                         0
                                                                          0 Melbourne Melbourne Cricket Ground
                     2
                                        Sri Lanka 0.3
                            Australia
                                                                          0 Melbourne Melbourne Cricket Ground
           3
                     2
                                                                          0 Melbourne Melbourne Cricket Ground
                            Australia
                                        Sri Lanka 0.4
                                                         2
                     2
                            Australia
                                        Sri Lanka 0.5
                                                         0
                                                                          0 Melbourne Melbourne Cricket Ground
In [11]: 1 df.isnull().sum()
Out[11]: match_id
                                 0
          batting_team
                                 0
          bowling_team
                                 0
          ball
                                 0
          runs
                                 0
          player_dismissed
                                 0
                                 0
          city
                                 0
          venue
          dtype: int64

 now, no column has null values

    for our model to work best, we require atleast 5 matches in a city to have accurate data.

            • single inning contains 120 balls. 5 inning contains 600 balls
In [12]:
            1 city_count = df['city'].value_counts()
            2 eli_city = city_count[city_count > 599].index.tolist()
            4 print(eli_city, len(eli_city))
           ['Colombo', 'Mirpur', 'Johannesburg', 'Dubai', 'Auckland', 'Cape Town', 'London', 'Pallekele', 'Barbados', 'Sydney', 'Melbourne', 'Durban', 'St Lucia', 'Wellington', 'Lauderhi
          11', 'Hamilton', 'Centurion', 'Manchester', 'Abu Dhabi', 'Mumbai', 'Nottingham', 'Southampton', 'Mount Maunganui', 'Chittagong', 'Kolkata', 'Lahore', 'Delhi', 'Nagpur', 'Chand
          igarh', 'Adelaide', 'Bangalore', 'St Kitts', 'Cardiff', 'Christchurch', 'Trinidad'] 35
In [13]:
            1 df_model = df[df['city'].isin(eli_city)]
            2 df_model
Out[13]:
                  match_id batting_team bowling_team ball runs player_dismissed
                                                                                      city
                                                                                                           venue
                                                                              0 Melbourne Melbourne Cricket Ground
               0
                               Australia
                                            Sri Lanka
                                                      0.1
                        2
                                                                              0 Melbourne Melbourne Cricket Ground
                               Australia
                                            Sri Lanka
                                                      0.2
                               Australia
                                             Sri Lanka
                                                     0.3
                                                                              0 Melbourne Melbourne Cricket Ground
                        2
                                                                              0 Melbourne Melbourne Cricket Ground
                               Australia
                                            Sri Lanka
                                                      0.4
                        2
                               Australia
                                             Sri Lanka
                                                      0.5
                                                                              0 Melbourne Melbourne Cricket Ground
           63883
                       964
                               Sri Lanka
                                             Australia 19.3
                                                                              0
                                                                                  Colombo
                                                                                              R Premadasa Stadium
           63884
                                                                                              R Premadasa Stadium
                       964
                               Sri Lanka
                                             Australia 19.4
                                                                              0
                                                                                  Colombo
                                                                      DM de Silva
           63885
                               Sri Lanka
                                             Australia 19.5
                                                                                  Colombo
                                                                                              R Premadasa Stadium
           63886
                       964
                               Sri Lanka
                                             Australia 19.6
                                                                              0
                                                                                  Colombo
                                                                                              R Premadasa Stadium
           63887
                               Sri Lanka
                                             Australia 19.7
                                                                                  Colombo
                                                                                              R Premadasa Stadium
          50500 rows × 8 columns
          Type Markdown and LaTeX: \alpha^2

    Now lets work on transforming the data and creating our features

            1. Below we have calculated the total score after each ball
            2. Number of ongoing over
            3. number of balls delivered
            4. total balls delivered
            5. total number of boundries hit (4s & 6s)
            6. number of balls left
            7. number of players dismissed
```

8. total wickets left9. Current run rate10. last 5 over socre

1 | df_model['score'] = df_model.groupby('match_id')['runs'].cumsum()

4 df_model['total balls'] = (df_model['over']*6) + df_model['ball']

3 df_model['ball'] = df_model['ball'].astype(str).str.extract(r"\d.(\d)").astype(int)

2 df_model['over'] = df_model['ball'].astype(int)

```
In [15]:
           1 df_model['extras'] = 0
            2 df_model["4s"] = 0
            3 df_model["6s"] = 0
            4
            5 for i in df_model['match_id'].unique():
                   #extras
            6
            7
                   mask_extras = (df_model['match_id'] == i) & (df_model['ball'] > 6)
            8
                   df_model.loc[mask_extras, 'extras'] = df_model.loc[mask_extras, 'ball'].gt(6).cumsum()
            9
           10
          11
                   mask_4s = (df_model['match_id'] == i) & (df_model['runs'] == 4)
          12
                   df_model.loc[mask_4s, '4s'] = (df_model.loc[mask_4s, 'runs'] == 4 ).cumsum()
           13
           14
           15
                   mask_6s = (df_model['match_id'] == i) & (df_model['runs'] == 6)
           16
                   df_model.loc[mask_6s, '6s'] = (df_model.loc[mask_6s, 'runs'] == 6).cumsum()
In [16]:
           1 df_model['ball_left'] = 120 - df_model['total balls']
            2 df_model['ball_left'].mask(df_model['ball_left']<0,0, inplace=True)</pre>
            4 | df_model['player_dismissed'] = df_model['player_dismissed'].mask(df_model['player_dismissed'] != '0', 1).astype(int)
            5 | df_model['player_dismissed'] = df_model.groupby('match_id')['player_dismissed'].cumsum()
            7 df_model['wicket_left'] = 10 - df_model['player_dismissed']
In [17]:
            1 | df_model['crr'] = round(df_model.apply(lambda row: 0 if row['over'] == 0 else row['score'] / row['over'], axis=1),2)
            3 | df_model['5 ovr score'] = df_model.groupby('match_id')['runs'].rolling(window=30).sum().values.tolist()
In [18]:
           1 df_model
Out[18]:
                                                                                                                    over total balls extras 4s 6s ball_left wicket_left crr 5 ovr score
                 match_id batting_team bowling_team ball runs
                                                              player_dismissed
                                                                                   city
                                                                                                       venue score
                                                                           0 Melbourne Melbourne Cricket Ground
              0
                        2
                              Australia
                                           Sri Lanka
                                                                                                                 0
                                                                                                                       0
                                                                                                                                       0 0 0
                                                                                                                                                     119
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                              Australia
                                           Sri Lanka
                                                                            0 Melbourne Melbourne Cricket Ground
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                                                                                                                                                     117
                                           Sri Lanka
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                              Australia
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                                           Sri Lanka
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                                                                                                                                                     116
                                                                                                                                                                10 0.00
                                                                                                                                                                              NaN
                                                                                                                 3
                                                                                                                                       0 0 0
               4
                        2
                              Australia
                                           Sri Lanka
                                                      5
                                                                           0 Melbourne Melbourne Cricket Ground
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                                                                                                                                5
                                                                                                                                                     115
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                                                                                                                                                                              NaN
           63883
                      964
                              Sri Lanka
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                                                                                           R Premadasa Stadium
                                                                                                                125
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                                                                                                                                                      3
                                                                                                                                                                 2 6.58
                                                                                                                                                                               32.0
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           63884
                              Sri Lanka
                                            Australia
                                                                                Colombo
                                                                                           R Premadasa Stadium
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           63885
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                              Sri Lanka
                                            Australia
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                                                                                Colombo
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           63886
                              Sri Lanka
                                            Australia
                                                                                Colombo
                                                                                           R Premadasa Stadium
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                                                                                                                                                                 1 6.68
                                                                                                                                                                               33.0
           63887
                      964
                              Sri Lanka
                                            Australia
                                                      7
                                                                               Colombo
                                                                                           R Premadasa Stadium
                                                                                                                128
                                                                                                                      19
                                                                                                                               121
                                                                                                                                       6 0 0
                                                                                                                                                      0
                                                                                                                                                                 1 6.74
                                                                                                                                                                               32.0
          50500 rows × 18 columns
            • Now we need to know the total runs scored at the end of match. And add it to the original Data Frame
In [19]:
           1 total_score = df_model.groupby('match_id')['runs'].sum().reset_index()
            2 total_score
Out[19]:
               match_id runs
                      2 168
                      4 187
                     10
                        195
                     11 194
                     12 185
                         129
           411
                    958
           412
                    960
                         150
           413
                    961
                         120
           414
                    963
                        263
           415
                    964
                         128
In [20]:
           1 | df_model = df_model.merge(total_score, on='match_id')
            2 df_model
Out[20]:
                 match_id batting_team bowling_team ball runs_x player_dismissed
                                                                                     city
                                                                                                         venue score over total balls extras 4s 6s ball_left wicket_left crr 5 ovr score runs_y
               0
                                                                             0 Melbourne Melbourne Cricket Ground
                                                                                                                                                                                         168
                        2
                                           Sri Lanka
                                                             0
                                                                                                                                             0
                                                                                                                                               0
                                                                                                                                                       119
                                                                                                                                                                  10 0.00
                                                                                                                                                                                 NaN
                              Australia
                              Australia
                                           Sri Lanka
                                                                              0 Melbourne Melbourne Cricket Ground
                                                                                                                                             0 0
                                                                                                                                                       118
                                                                                                                                                                  10 0.00
                                                                                                                                                                                 NaN
                                                                                                                                                                                         168
               2
                                                                                                                                                       117
                                                                                                                                                                                         168
                                           Sri Lanka
                                                                             0 Melbourne Melbourne Cricket Ground
                                                                                                                                            0 0
                                                                                                                                                                  10 0.00
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                              Australia
                              Australia
                                           Sri Lanka
                                                                                Melbourne Melbourne Cricket Ground
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                                                                                                                                                       116
                                                                                                                                                                  10 0.00
                                                                                                                                                                                         168
                                                                                                                                                                                 NaN
                                                                                                                                                                                         168
                        2
                              Australia
                                           Sri Lanka
                                                      5
                                                                             0 Melbourne Melbourne Cricket Ground
                                                                                                                                  5
                                                                                                                                         0
                                                                                                                                            0 0
                                                                                                                                                       115
                                                                                                                                                                  10 0.00
                                                                                                                                                                                 NaN
                                                                                 Colombo
                                                                                                                                                                                         128
           50495
                      964
                              Sri Lanka
                                                                                             R Premadasa Stadium
                                                                                                                  125
                                                                                                                                 117
                                                                                                                                                                                 32.0
                                            Australia
                                                                             8
                                                                                                                        19
                                                                                                                                            0
                                                                                                                                               0
                                                                                                                                                        3
                                                                                                                                                                   2 6.58
           50496
                              Sri Lanka
                                            Australia
                                                                                  Colombo
                                                                                             R Premadasa Stadium
                                                                                                                  125
                                                                                                                                 118
                                                                                                                                             0 0
                                                                                                                                                                   2 6.58
                                                                                                                                                                                 32.0
                                                                                                                                                                                         128
           50497
                                                                                             R Premadasa Stadium
                                                                                                                  125
                                                                                                                                                                                 32.0
                                                                                                                                                                                         128
                      964
                              Sri Lanka
                                            Australia
                                                                                 Colombo
                                                                                                                       19
                                                                                                                                 119
                                                                                                                                             0 0
                                                                                                                                                                   1 6.58
           50498
                              Sri Lanka
                                            Australia
                                                                                 Colombo
                                                                                             R Premadasa Stadium
                                                                                                                  127
                                                                                                                                 120
                                                                                                                                             0
                                                                                                                                                                   1 6.68
                                                                                                                                                                                 33.0
                                                                                                                                                                                         128
           50499
                      964
                                                                                             R Premadasa Stadium
                                                                                                                 128
                                                                                                                                 121
                                                                                                                                            0 0
                                                                                                                                                        0
                                                                                                                                                                   1 6.74
                                                                                                                                                                                 32.0
                                                                                                                                                                                         128
                              Sri Lanka
                                            Australia
                                                                                 Colombo
                                                                                                                       19
          50500 rows × 19 columns
            · Now filter the columns and select features
In [21]:
           1 # df_model.columns
Out[21]: Index(['match_id', 'batting_team', 'bowling_team', 'ball', 'runs_x',
                  'player_dismissed', 'city', 'venue', 'score', 'over', 'total balls',
                  'extras', '4s', '6s', 'ball_left', 'wicket_left', 'crr', '5 ovr score',
```

'runs_y'],
dtype='object')

```
In [22]:
           1 order = ['batting_team', 'bowling_team', 'runs_x', 'over', 'ball_left', 'wicket_left', 'crr', '5 ovr score',
           2
                        'runs_y']
           3
           4 final_df = df_model[order].copy()
           final_df.rename(columns={'runs_x': 'current score', 'runs_y': 'final score', '5 ovr score':'5ovr_score'}, inplace=True)
In [23]:
In [24]:
           1 final_df.isnull().sum()
Out[24]: batting_team
                                0
                                0
          bowling_team
          current score
                                0
          over
         ball_left
                                0
         wicket_left
                                0
          crr
          5ovr_score
                           12024
          final score
          dtype: int64

    As we caluculated 5 ovr score, the first 4 over over data of this column will be null.

    our model requires data with minimum 5 overs

    The null rows will be droppped as keeping it will harm the model's accuracy.

In [25]:
           1 final_df.dropna(inplace=True)
           2 final_df.isnull().sum()
Out[25]: batting_team
                           0
          bowling_team
                           0
                           0
          current score
          over
         ball_left
                           0
         wicket_left
                           0
                           0
          crr
                           0
          5ovr_score
          final score
                           0
          dtype: int64
           · We need complete data for the model.
           • Thus, we will create a sample of complete data which will jumble up the rows to reduce the biasness.
           1 model = final_df.sample(final_df.shape[0])
In [26]:
           2 model
Out[26]:
                batting_team bowling_team current score over ball_left wicket_left crr 5ovr_score final score
                                                                                                  72
           39024
                  Afghanistan
                               Bangladesh
                                                       11
                                                                          5 4.91
                                                                                       18.0
           24624
                  South Africa
                              New Zealand
                                                        6
                                                               79
                                                                          9 8.33
                                                                                       32.0
                                                                                                 170
                              New Zealand
           4073
                     Pakistan
                                                       12
                                                               43
                                                                          8 9.92
                                                                                       34.0
                                                                                                 201
           19568
                     Australia
                              New Zealand
                                                        7
                                                               77
                                                                          7 7.57
                                                                                       34.0
                                                                                                 150
           25541
                     Pakistan
                              South Africa
                                                       14
                                                               33
                                                                          6 7.50
                                                                                       57.0
                                                                                                  148
           27141
                    Sri Lanka
                                    India
                                                       15
                                                               26
                                                                          7 9.60
                                                                                       51.0
                                                                                                 215
           9010
                     Pakistan
                                                                          9 7.33
                                                                                       39.0
                                                                                                 166
                              New Zealand
                               Bangladesh
                                                                          9 8.33
           19954
                       India
                                                                                       35.0
                                                                                                  180
           39393
                     Pakistan
                                 Australia
                                                       13
                                                               41
                                                                          7 9.77
                                                                                       62.0
                                                                                                 191
           8629
                     Pakistan
                                 Australia
                                                               74
                                                                         10 9.14
                                                                                       49.0
                                                                                                  150
           1 # model.columns
In [27]:
Out[27]: Index(['batting_team', 'bowling_team', 'current score', 'over', 'ball_left',
                  'wicket_left', 'crr', '5ovr_score', 'final score'],
                dtype='object')
           • We have successfully transformed the data and finalised our features.
           • Next step is work training the model and creating the streamlit app
           1 X = final_df.drop(columns = ['final score'])
In [28]:
           2 y = final_df['final score']
In [29]: 1 from sklearn.model_selection import train_test_split
In [30]: 1 | X_train, X_test, y_train, y_test = train_test_split(X,y,test_size=0.2, random_state=1)
In [31]: 1 from sklearn.compose import ColumnTransformer
           2 from sklearn.preprocessing import OneHotEncoder
           3 from sklearn.pipeline import Pipeline
           4 from sklearn.preprocessing import StandardScaler
           5 from sklearn.ensemble import RandomForestRegressor
           6 from xgboost import XGBRegressor
           7 from sklearn.metrics import r2_score,mean_absolute_error
In [32]:
           1 trf = ColumnTransformer([
                  ('trf',OneHotEncoder(sparse=False),['batting_team','bowling_team'])
           3 ]
           4 ,remainder='passthrough')
In [33]:
           1 pipe = Pipeline(steps=[
                  ('step1',trf),
           2
           3
                   ('step2',StandardScaler()),
                   ('step3',XGBRegressor(n_estimators=1000,learning_rate=0.2,max_depth=12,random_state=1))
           4
           5 ])
```

```
In [34]: 1 pipe.fit(X_train,y_train)
           2 y_pred = pipe.predict(X_test)
           3 print(r2_score(y_test,y_pred))
           4 print(mean_absolute_error(y_test,y_pred))
         0.9193706684249296
         5.049574699322548
In [35]: | 1 | pickle.dump(pipe, open("t20_model.pkl","wb"))
In [36]: 1 df_model['city'].unique()
Out[36]: array(['Melbourne', 'Adelaide', 'Mount Maunganui', 'Auckland',
                'Southampton', 'Cardiff', 'Nagpur', 'Bangalore', 'Lauderhill',
                'Dubai', 'Abu Dhabi', 'Sydney', 'Wellington', 'Hamilton',
                'Barbados', 'Trinidad', 'Colombo', 'St Kitts', 'Manchester', 'Delhi', 'Lahore', 'Johannesburg', 'Centurion', 'Cape Town',
                'Mumbai', 'Kolkata', 'Durban', 'Chandigarh', 'Christchurch',
                'London', 'Nottingham', 'St Lucia', 'Pallekele', 'Mirpur',
                'Chittagong'], dtype=object)
In [37]: 1 model.info()
         <class 'pandas.core.frame.DataFrame'>
         Int64Index: 38476 entries, 39024 to 8629
         Data columns (total 9 columns):
                            Non-Null Count Dtype
          # Column
                            -----
          0 batting_team 38476 non-null object
          1 bowling_team 38476 non-null object
          2 current score 38476 non-null int64
          3
             over
                            38476 non-null int32
             ball_left
          4
                            38476 non-null int32
          5 wicket_left 38476 non-null int32
          6 crr
                            38476 non-null float64
                          38476 non-null float64
          7 5ovr_score
          8 final score 38476 non-null int64
         dtypes: float64(2), int32(3), int64(2), object(2)
         memory usage: 2.5+ MB
```

```
In [44]:
          1 import ipywidgets as widgets
           2 from IPython.display import display
          3 import joblib
          4 import pandas as pd
          6 # Load your trained model
          7 model = joblib.load('t20_model.pkl')
          9 # Define widgets
         10 batting_team = widgets.Dropdown(
         11
                 options=['Australia', 'New Zealand', 'South Africa', 'England', 'India', 'West Indies', 'Pakistan', 'Bangladesh', 'Afghanistan', 'Sri Lanka'],
         12
                 description='Batting Team:',
         13 )
         14
         15 bowling_team = widgets.Dropdown(
         16
                 options=['Australia', 'New Zealand', 'South Africa', 'England', 'India', 'West Indies', 'Pakistan', 'Bangladesh', 'Afghanistan', 'Sri Lanka'],
         17
                 description='Bowling Team:',
         18 )
         19
          20 current_score = widgets.IntText(
          21
                 description='Current Score:',
          22 )
          23
          24 overs = widgets.FloatText(
          25
                 description='Overs Done (>5):',
          26 )
          27
          28 wickets_out = widgets.IntText(
          29
                 description='Wickets Out:',
          30 )
          31
          32 runs_last_five_overs = widgets.IntText(
          33
                 description='Runs Scored in Last Five Overs:',
          34 )
          35
          36 | output = widgets.Output()
         37
         38 def predict_score(b):
          39
                 # Calculate additional features
          40
                 ball_left = (120 - overs.value * 6)
          41
                 wicket_left = 10 - wickets_out.value
          42
                 crr = current_score.value / overs.value if overs.value > 5 else 0
          43
          44
                 input_data = pd.DataFrame({
          45
                      'batting_team': [batting_team.value],
          46
                     'bowling_team': [bowling_team.value],
          47
                     'current score': [current_score.value],
          48
                     'over': [overs.value],
          49
                     'ball_left': [ball_left],
          50
                     'wicket_left': [wicket_left],
          51
                     'crr': [crr],
                     '5ovr_score': [runs_last_five_overs.value]
          52
          53
                 })
          54
          55
                 # Use your trained model to predict the final score
          56
                 predicted_score = model.predict(input_data)
          57
          58
                 with output:
          59
                     output.clear_output()
          60
                     print(f'Predicted Final Score: {int(predicted_score[0])}')
          61
          62 button = widgets.Button(description="Predict")
          63 button.on_click(predict_score)
          64
          65 # Display the widgets
          display(batting_team, bowling_team, current_score, overs, wickets_out, runs_last_five_overs, button, output)
          67
```

Batting Team: Australia

Bowling Te... Australia

Current Sc... 0

Overs Don... 0

Wickets Out: 0

Runs Scor... 0

Predict