T20 Totalitarian: Mastering Score Predictions

Team ID

Project Name

PNT2022TMID593080

T20 Totalitarian: Mastering Score

Predictions

Team Size: 4

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Team member: A.S. Jayashri

Team member: Ragul V

Team member: R. Nachiyappan

End-to-end machine learning project to predict T20 score.

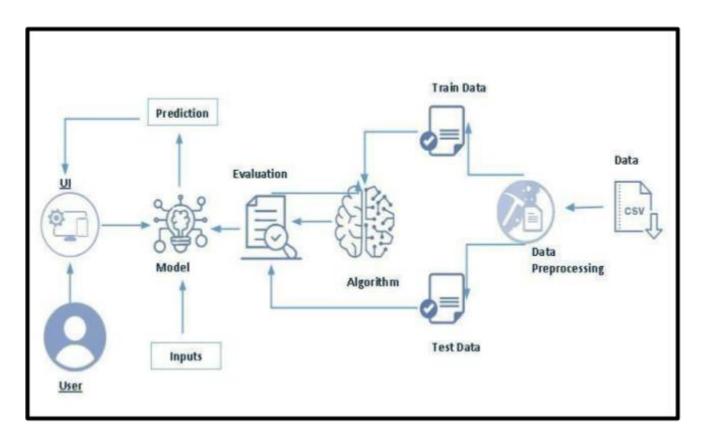
The objective of this project is to develop an end-to-end machine learning solution for predicting the t20 score of the batting team. The proposed solution involves the use of Machine learning algorithms to extract relevant features from the input and predict the accurate score.

Creating an end-to-end machine learning project to predict T20 cricket scores can offer a range of benefits, both from a sports analytics perspective and as a showcase of machine learning capabilities. Here are some of the key advantages:

- 1. **Insightful Analytics:** Developing a T20 score prediction model can provide deep insights into the factors that influence team performance and scoring in cricket matches. This could include player statistics, pitch conditions, team composition, weather conditions, and more.
- Strategic Decision Making: Cricket teams, coaches, and analysts can use the predictive
 model to make informed decisions during matches. This could involve adjusting strategies
 based on predicted scores, understanding the impact of different factors on the outcome,
 and optimizing team compositions.
- 3. **Engaging Fan Experience:** Fans of the sport can benefit from more engaging and interactive experiences. Predicted scores can be displayed in real-time during live broadcasts, enhancing fan engagement and offering viewers a better understanding of the ongoing matchdynamics.
- 4. **Betting and Fantasy Sports:** Predictive models are often sought after by individuals engaged in sports betting and fantasy sports leagues. Accurate score predictions can be used to make informed betting decisions or create more competitive fantasy teams.

Let us look at the Technical Architecture of the project.

Technical Architecture:



Project Flow:

- The user interacts with the UI to enter the data.
- Uploaded input is analyzed by the model which is integrated/developed by you.
- Once the model analyzes the input the prediction is showcased on the
 - UI. To accomplish this, we have to complete all the activities listed

below,

- Define Problem / Problem Understanding
 - 0 Specify the business problem
 - Business requirements
 - Literature Survey.
 - Social or Business Impact.
- Data Collection & Preparation
 - Collect the dataset
 - Data Preparation
- Exploratory Data Analysis
 - 0 Descriptive statistical
 - Visual Analysis
- Model Building
 - Building a model.
 - 0 Training the model.
 - Testing the model
- Model Deployment
 - 0 Save the best model
 - Integrate with Web Framework
- Project Demonstration & Documentation
 - 0 Record explanation Video for project end to end solution

Project Documentation-Step by step project development procedure

Prior Knowledge:

To complete this project, you must require following software's, concepts and packages

- VS Code :
 - o Refer to the link below to download VS Code.
 - o Link: https://code.visualstudio.com/download
- Create Project:
 - o Open VS Code.
 - o Create a Folder and name it "T20_Score_Predictor".
- Machine Learning Concepts
 - o Linear Regression: https://towardsdatascience.com/linear-regression-detailed-view-ea73175f6e86
 - o XGBRegressor:
 - https://medium.com/@aryanbajaj13/prediction-using-xgb-regressor-using-python-3-ad1a57e105af
 - o Random Forest:
 - https://medium.com/towards-data-science/understanding-random-forest-58381e0602d2
- Web concepts:
 - Get the gist on flask:

https://www.geeksforgeeks.org/artificial-intelligence-and-machine-learning-technologies-in-sports/

https://www.geeksforgeeks.org/ml-linear-regression/

Project Objectives:

By the end of this project you will:

- Know fundamental concepts and techniques of Machine Learning.
- Know how to pre-process/clean the data using different data preprocessing techniques.
- Know how to build a web application using the flask and css framework.

PROJECT PLANNING & SCHEDULING

Technical Architecture:

The technical architecture of a T20 score predictor refers to the high-level design and structure of the system, outlining how different components interact to achieve the desired functionality. For a T20 score predictor, the technical architecture might include:

Data Ingestion	Retrieve historical match data, real-time match updates, and player statistics.
Data Processing	Analyze and preprocess the data to extract relevant features for prediction models.
Machine Learning	Implement algorithms for predicting T20 scores based on
Models	historical performance, player form, and other factors.
User Interface	Develop a user-friendly interface for users to interact with the predictor, input preferences, and view predictions.
Live Data Integration	Incorporate mechanisms to continuously update predictions
	based on real-time match data.
Notification System	Implement a system to alert users about significant events and score updates during matches.

Sprint Planning & Estimation

Sprint	Functional Requirement (Epic)	User Story Number	User Story / Task	Story Points	Priority	Team Members	
Sprint-1	Sprint-1 Score Prediction USN-1 As a cricket fan, I want a model to predict T20 scores				High	Ragul	
Sprint-2	Feature Extraction	USN-2	Extract relevant features from match data	2	medium	Jayashri	
Sprint-3	Real-time Data Integration	USN-3	Integrate real-time data during matches	3	High	Nachiyappar	
Sprint-4	Web App Development	USN-4	Develop a web app for users to interact with the predictions	3	High	Vijayaalayan Vinod	

Sprint Delivery Schedule

Sprint	Total Story Points	Duration	Sprint Start Date	Sprint End Date (Planned)	Story Points Completed (as on Planned End Date)	Sprint Release Date (Actual)
Sprint-1	20	6 Days	24 Oct 2022	29 Oct 2022	10	29 Oct 2022
Sprint-2	20	6 Days	31 Oct 2022	05 Nov 2022	20	06 Nov 2022
Sprint-3	20	6 Days	07 Nov 2022	12 Nov 2022	20	15 Nov 2022
Sprint-4	20	6 Days	14 Nov 2022	19 Nov 2022	40	21 Nov 2022

CODING & SOLUTIONING:

Importing the libraries

In [4]: import pandas as pd
 from joblib import dump

Reading the dataset

In [5]: df = pd.read_csv("ipl.csv")

d	df.head()															
		mid	date	venue	bat_team	bowl_team	batsman	bowler	runs	wickets	overs	runs_last_5	wickets_last_5	striker	non- striker	total
	0	1	2008- 04-18	M Chinnaswamy Stadium	Kolkata Knight Riders	Royal Challengers Bangalore	SC Ganguly	P Kumar	1	0	0.1	1	0	0	0	222
	1	1	2008- 04-18	M Chinnaswamy Stadium	Kolkata Knight Riders	Royal Challengers Bangalore	BB McCullum	P Kumar	1	0	0.2	1	0	0	0	222
	2	1	2008- 04-18	M Chinnaswamy Stadium	Kolkata Knight Riders	Royal Challengers Bangalore	BB McCullum	P Kumar	2	0	0.2	2	0	0	0	222
	3	1	2008- 04-18	M Chinnaswamy Stadium	Kolkata Knight Riders	Royal Challengers Bangalore	BB McCullum	P Kumar	2	0	0.3	2	0	0	0	222
	4	1	2008- 04-18	M Chinnaswamy Stadium	Kolkata Knight Riders	Royal Challengers Bangalore	BB McCullum	P Kumar	2	0	0.4	2	0	0	0	222

Filtering the columns



The code df = df[(df['bat_team'].isin(consistent_teams)) & (df['bowl_team'].isin(consistent_teams))] filters a DataFrame (df) to include only rows where both the 'bat_team' and 'bowl_team' columns have values that are present in the list consistent_teams.

```
In [10]: consistent_teams = ['Kolkata Knight Riders', 'Chennai Super Kings', 'Rajasthan Royals',
                                  'Mumbai Indians', 'Kings XI Punjab', 'Royal Challengers Bangalore', 'Delhi Daredevils', 'Sunrisers Hyderabad']
In [11]: df = df[(df['bat_team'].isin(consistent_teams)) & (df['bowl_team'].isin(consistent_teams))]
In [12]: df.head()
Out[12]:
                                                          bowl team runs wickets overs runs last 5 wickets last 5 total
                                   bat team
           0 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
           1 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                     0.2
                                                                                                                  0 222
           2 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                        2
                                                                                 0
                                                                                     0.2
                                                                                                                 0 222
           3 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                 0
                                                                                      0.3
                                                                                                                  0 222
                                                                                                   2
           4 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                       2
                                                                                 0 0.4
                                                                                                                 0 222
```

The code df = df[df['overs'] >= 5.0] filters a DataFrame (df) to include only rows where the value in the 'overs' column is greater than or equal to $5.0_{\underline{\bullet}}$



The code df['date'] = df['date'].apply(lambda x: datetime.strptime(x, '%Y-%m-%d')) is used to convert the 'date' column in a DataFrame (df) from a string format to a datetime format.

```
In [13]: from datetime import datetime
In [14]: df['date'] = df['date'].apply(lambda x: datetime.strptime(x, '%Y-%m-%d'))
In [15]: df.head()
Out[15]:
                    data
                                   bat team
                                                           bowl_team runs wickets overs runs_last_5 wickets_last_5 total
           0 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                      0.1
                                                                                                                  0 222
           1 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                 0
                                                                                      0.2
                                                                                                                  0 222
           2 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                      0.2
                                                                                                                  0 222
           3 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                      0.3
                                                                                                                  0 222
           4 2008-04-18 Kolkata Knight Riders Royal Challengers Bangalore
                                                                                 0
                                                                                      0.4
                                                                                                                  0 222
```

The code encoded_df = pd.get_dummies(data=df, columns=['bat_team', 'bowl_team']) is used to perform one-hot encoding on the categorical columns 'bat_team' and 'bowl_team' in the DataFrame df. One-hot encoding is a technique used to convert categorical variables into a binary matrix (0s and 1s) to make them suitable for machine learning algorithms.

```
In [16]: encoded df = pd.get dummies(data=df, columns=['bat team', 'bowl team'])
In [17]: encoded_df.head()
Out[17]:
                                                                                                                                        bat_team_Royal
Challengers
                                                                                                   bat_team_Delhi
                                                                                                                          am_Kings
XI Punjab
                                                                                                                                                             _team_Sunrisers
                                                                                bat_team_Chennai
                 date runs wickets overs runs_last_5 wickets_last_5 total
                                                                                                        Daredevils
                                                                                                                                                                  Hyderabad
                                                                                      Super Kings
                                                                                                                                              Bangalore
                2008-
04-18
            32
                                         5.1
                2008-
04-18
            33
                                                                                                0
                                                                                                                 0
                                                                                                                                  0 ...
                                                                                                                                                      0
                         61
                                         5.2
                                                      59
                                                                       1 222
                 2008-
                                                                                                                                  0 ...
                         61
                                         5.4
                                                      59
                                                                       1 222
                                                                                                0
                                                                                                                 0
                                                                                                                                                      0
                                                                                                                                                                           0
                         61
            5 rows × 23 columns
```

encoded_df[['date', ... 'total']]: This part of the code is selecting a subset of columns from the DataFrame encoded_df. The specified column names include both the original columns ('date', 'overs', 'runs', 'wickets', 'runs_last_5', 'total') and the one-hot encoded columns for the batting and bowling teams.

Splitting data into train and test sets

This code is splitting the DataFrame encoded_df into training and testing sets based on the year in the 'date' column. The goal is to create two subsets of data: one for training a machine learning model (data from years up to 2016) and another for testing the model's performance (data from 2017 onwards).

These lines of code are creating the target variable arrays (y_train and y_test) for the training and testing sets. The target variable in this case is 'total', representing the total runs scored in a T20 cricket match.

```
In [18]: X_train = encoded_df.drop(labels='total', axis=1)[encoded_df['date'].dt.year <= 2016]
    X_test = encoded_df.drop(labels='total', axis=1)[encoded_df['date'].dt.year >= 2017]|

In [19]: y_train = encoded_df[encoded_df['date'].dt.year <= 2016]['total'].values
    y_test = encoded_df[encoded_df['date'].dt.year >= 2017]['total'].values
```

X_train.drop(labels='date', axis=True, inplace=True): This line removes the 'date' column from the training set (X_train). The drop method is used to eliminate columns or rows from a DataFrame. The argument labels='date' specifies the column to be dropped. The axis=True indicates that the operation is performed along columns. Finally, inplace=True means the changes are made directly to the existing DataFrame (X_train) without the need to create a new DataFrame.

```
In [20]: X_train.drop(labels='date', axis=True, inplace=True)
X_test.drop(labels='date', axis=True, inplace=True)
```

Linear Regression

This line trains the linear regression model using the training data. The fit method takes two arguments:

X train: The feature matrix of the training set, which includes all the input features used for training.

y train: The target variable of the training set, which contains the corresponding output values.

After this step, the regressor object is ready to make predictions on new, unseen data using the learned model.

Model Deployment

This line imports the pickle module, which is a standard Python module for serializing and deserializing objects. After running this code, the trained linear regression model will be serialized and saved to a binary file named 'T20-Irmodel.pkl'.

```
filename = 'innings-score-lr-model.joblib'
dump(regressor, filename)

import pickle
pickle.dump(regressor,open('T20-lr-model.pkl','wb'))

import pickle
filename = 'T20-lr-model.pkl'
regressor = pickle.load(open(filename, 'rb'))
```

To calculate Mean squared error and r squared

```
In [22]: y_pred = regressor.predict(X_test)
In [24]: from sklearn.metrics import mean_squared_error
    mse = mean_squared_error(y_test, y_pred)
    print(f'Mean Squared Error: {mse}')

Mean Squared Error: 403.22328348760095

In [25]: from sklearn.metrics import r2_score
    # Calculate R-squared
    r2 = r2_score(y_test, y_pred)
    print(f'R-squared: {r2}')

R-squared: 0.607038043216662
```

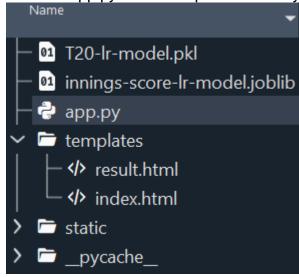
```
In [26]: X_train
Out[26]:
                                                                        bowl_team_Royal bowl_team_Sunrisers
         əlhi bowl_team_Kolkata bowl_team_Mumbai bowl_team_Rajasthan vils "Knight Riders Indians Rovals
                                                                                                  _-ounrisers
Hyderabad overs runs wickets runs_last_5 wickets_last_5
          0 ...
           0 ...
                                                  Ω
                                                                                                          0
                               0
                                                  0
                                                                      0
                                                                                                                                                       0
           0 ...
                                                                                                         0
                                                                                                              0.3
          0 ...
          0 ...
                                                                                                         0 19.2 194
           0 ...
                                0
                                                  0
                                                                      0
                                                                                                                                                       4
                                                                                                                                                       4
          0 ...
                               0
                                                  0
                                                                                                         0 19.4 201
                                                                                                                                       56
                                                  Ω
                                                                                                          0 19.5 202
In [28]: from sklearn.metrics import mean_absolute_error
          mae = mean_absolute_error(y_test, y_pred)
 In [30]: print(f'Mean Absolute Error: {mae}')
          Mean Absolute Error: 14.861585174238238
In [36]: import numpy as np
           rmse = np.sqrt(mse)
          print(f'Root Mean Squared Error: {rmse}')
           Root Mean Squared Error: 20.08042040116693
```

Thus we have done the following:

- 1- Data Preprocessing and some Exploratory Data Analysis to understand the data
- 2- Data preparation: Feature Engineering and Scaling
- 3- Feature Selection using RFE and Model Building
- 4- Regression Assumptions Validation and Outlier Removal
- 5- Rebuilding the Model Post Outlier Removal: Feature Selection & RFE
- 6- Removing Multicollinearity, Model Re-evaluation and Assumptions Validation

WEB APP DEVELOPMENT

Create a app.py file and import necessary packages:



Importing the flask to deploy it for machine learning:

```
C:\Users\Vijayaalayan\Desktop\Flask\app.py
    index.html X result.html X app.py X
       from flask import Flask, render template, request
       import numpy as np
       import pickle
       filename = 'T20-lr-model.pkl'
       regressor = pickle.load(open(filename, 'rb'))
       app = Flask(__name__)
       @app.route('/')
  11
  12
       def home():
            return render_template('index.html')
  13
  15
       @app.route('/predict', methods=['POST'])
       def predict():
  17
           temp_array = list()
            if request.method == 'POST':
```

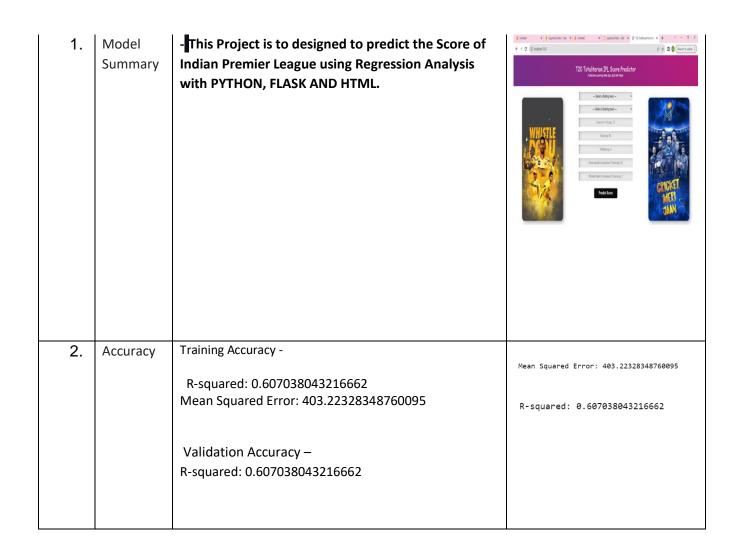
Accepting the input from user and prediction:

```
@app.route('/predict', methods=['POST'])
15
     def predict():
17
         temp_array = list()
18
         if request.method == 'POST':
19
             batting_team = request.form['batting-team']
             if batting_team == 'Chennai Super Kings':
21
22
                 temp_array = temp_array + [1,0,0,0,0,0,0,0]
             elif batting_team == 'Delhi Daredevils':
23
24
                 temp_array = temp_array + [0,1,0,0,0,0,0,0]
25
             elif batting team == 'Kings XI Punjab':
                 temp_array = temp_array + [0,0,1,0,0,0,0,0]
             elif batting_team == 'Kolkata Knight Riders':
27
                 temp_array = temp_array + [0,0,0,1,0,0,0,0]
             elif batting_team == 'Mumbai Indians':
29
                 temp_array = temp_array + [0,0,0,0,1,0,0,0]
31
             elif batting_team == 'Rajasthan Royals':
32
                 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 + [0,0,0,0,0,0,0,0,1]
             bowling team = request.form['bowling-team']
```

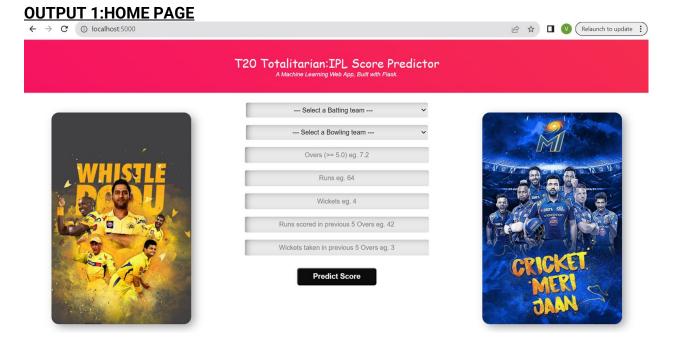
```
bowling_team = request.form['bowling-team']
    if bowling_team == 'Chennai Super Kings':
        temp_array = temp_array + [1,0,0,0,0,0,0,0]
    elif bowling_team == 'Delhi Daredevils':
        temp_array = temp_array + [0,1,0,0,0,0,0,0]
    elif bowling_team == 'Kings XI Punjab':
        temp_array = 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 + [0,0,0,0,0,0,0,1]
    overs = float(request.form['overs'])
    runs = int(request.form['runs'])
   wickets = int(request.form['wickets'])
    runs_in_prev_5 = int(request.form['runs_in_prev_5'])
   wickets_in_prev_5 = int(request.form['wickets_in_prev_5'])
   temp_array = temp_array + [overs, runs, wickets, runs_in_prev_5, wic
   data = np.array([temp array])
   my_prediction = int(regressor.predict(data)[0])
   return render_template('result.html', lower_limit = my_prediction-10
runs'|)
m['wickets'])
est.form['runs_in_prev_5'])
request.form['wickets_in_prev_5'])
 [overs, runs, wickets, runs_in_prev_5, wickets_in_prev_5]
'av1)
ssor.predict(data)[0])
result.html', lower_limit = my_prediction-10, upper_limit = my_prediction+5)
```

PERFORMANCE TESTING

S.No.	Paramete	Values	Screenshot
	r		



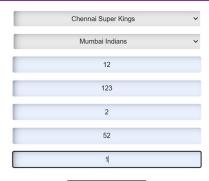
RESULTS



OUTPUT2: HOME PAGE AFTER USER INPUT:

T20 Totalitarian: IPL Score Predictor





Predict Score

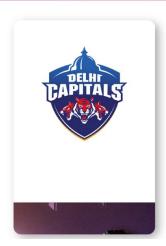


OUTPUT 3:RESULT PAGE

T20 Totalitarian: IPL Score Predictor A Machine Learning Web App, Built with Flask.



The final predicted score (range): 187 to 202







The final predicted score (range): 195 to 210



ADVANTAGES & DISADVANTAGES

Advantages:

- 1. Improved Decision-Making in Cricket: Accurate score predictions can provide valuable insights for teams, coaches, and players, helping them make informed decisions during a T20 match.
- 2. Strategic Planning: Teams can use predicted scores to formulate game strategies, such as adjusting field placements, choosing bowlers, or setting batting orders.
- 3. Data-Driven Insights: The project can showcase the power of data-driven decision-making in the sports domain, demonstrating how machine learning can enhance understanding and strategy.
- 4. Fan Engagement: Accurate score predictions can increase fan engagement by providing them with additional insights and predictions for upcoming matches.
- 5. Scalability: Once the model is trained and validated, it can be applied to various T20 matches, making it a scalable solution for predicting scores across different scenarios.
- 6. Learning Opportunity: The project offers an opportunity for individuals involved to learn and apply machine learning techniques in a real-world scenario, which can contribute to skill development in the field.

Disadvantages:

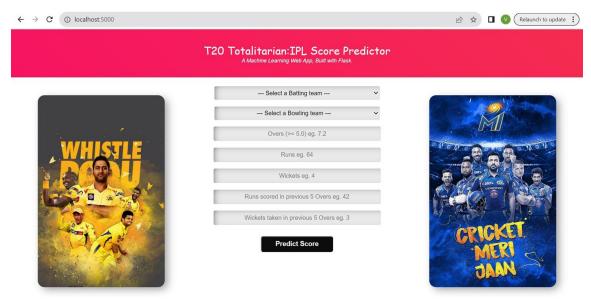
- 1. Data Limitations: The accuracy of predictions heavily relies on the quality and quantity of historical data available. Limited or biased data can lead to inaccurate predictions.
- 2. Dynamic Nature of Cricket: Cricket is a dynamic sport with multiple factors influencing the game, such as player form, weather conditions, and pitch variations. Incorporating all these variables accurately into a predictive model can be challenging.
- 3. Model Complexity: Developing an accurate predictive model may require a complex algorithm that is difficult to interpret or explain, making it challenging for stakeholders to understand the decision-making process.
- 4. Overfitting: There's a risk of overfitting the model to historical data, resulting in poor generalization to new, unseen data. Regular updates and retraining may be necessary to maintain accuracy.
- 5. Ethical Considerations: Predicting scores with high accuracy may raise ethical concerns, especially if the information is misused for betting purposes.
- 6. User Adoption: Coaches and teams may be hesitant to fully adopt machine learning predictions, relying instead on traditional methods and experience.

CONCLUSION

By leveraging machine learning algorithms, the T20 Totalitarian project contributes to the evolution of sports analytics. It demonstrates how data-driven insights can enhance decision-making processes in the dynamic and strategic realm of T20 cricket.

The use of Flask and Python ensures scalability, allowing the model to be applied to various T20 matches. Regular updates and continuous monitoring can enhance the model's adaptability to changing conditions, ensuring relevance and accuracy over time.

In conclusion, the T20 Totalitarian project, implemented using Flask and Python to create an end-to-end machine learning solution for predicting T20 cricket scores, represents a significant advancement in the field of sports analytics and showcases the capabilities of machine learning in a practical scenario.



FUTURE SCOPE

The future scope for the T20 Totalitarian project using Artificial Intelligenece and Machine Learning for predicting T20 cricket scores is promising and can be extended in several directions:

1. Enhanced Predictive Models:

 Continuously refine and enhance the machine learning models to improve prediction accuracy. Experiment with advanced algorithms and techniques to capture the dynamic and evolving nature of T20 cricket.

2. Incorporation of Real-time Data:

 Integrate real-time data feeds during matches to make predictions based on the latest information, including live player statistics, weather conditions, and pitch behavior. This can enhance the model's adaptability to the current state of the game.

3. Player Performance Analytics:

 Extend the project to include individual player performance predictions. Develop models that can forecast how specific players are likely to perform in a given match, considering their recent form, historical data, and situational factors.

4. Interactive User Interfaces:

Develop interactive and user-friendly interfaces for cricket enthusiasts, coaches, and teams.
 Provide detailed insights, visualizations, and explanations for the predictions, making the information accessible to a broader audience.

5. Integration with Fantasy Cricket Platforms:

Collaborate with fantasy cricket platforms to integrate score predictions into their systems.
 This can enhance the user experience for fantasy cricket players and contribute to the growing fantasy sports industry.

6. Collaboration with Cricket Teams and Analysts:

 Work closely with cricket teams, coaches, and analysts to customize the model for specific teams and playing styles. Incorporate feedback from cricket experts to make the predictions more relevant and actionable for professional teams.

7. Development of Mobile Applications:

 Create mobile applications that provide on-the-go access to score predictions, match analyses, and real-time updates. This can cater to a broader audience, including fans, analysts, and team management.

8. Integration with Broadcasts and Commentary:

 Explore collaborations with broadcasters to integrate score predictions into live broadcasts and commentary. This can add an additional layer of analysis and engagement for television and online viewers.

9. Global Expansion:

 Expand the scope of the project to cover T20 leagues and tournaments worldwide. This can include international matches, franchise leagues, and other T20 competitions, providing a more comprehensive and global perspective.

10. Research and Publications:

- Contribute to the academic and research community by publishing findings, methodologies, and advancements made in the field of sports analytics. This can foster collaboration, knowledge sharing, and further innovations in the domain.
- 11. Ethical Considerations and Fair Play:
 - Address ethical considerations related to the use of predictive models in sports. Collaborate
 with sports organizations to ensure fair play, responsible use of data, and adherence to
 ethical standards.

In summary, the future scope for the T20 Totalitarian project involves continuous improvement, expansion into new areas, and collaboration with various stakeholders to make the project more impactful and widely applicable in the world of T20 cricket and sports analytics.

<u>APPENDIX</u>

https://github.com/smartinternz02/SI-GuidedProject-603836-1699951343

https://drive.google.com/file/d/1ecdTrVhOflkubnPyEymwFhrV1gZaNz8c/view?usp=sharing