## second

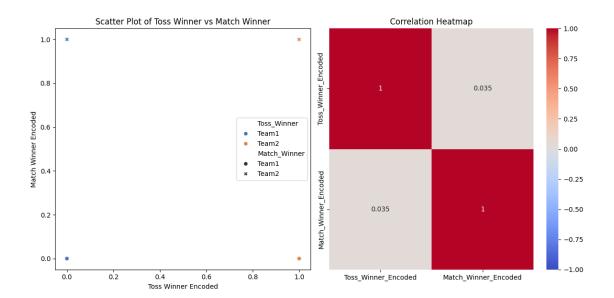
### September 18, 2024

```
[50]: import pandas as pd
      df = pd.read_csv("/Users/csrbharadwaj/Desktop/Projects/Woxen_project/
       ⇔synthetic_match_outcome_data.csv")
 [1]: # Importing libraries
      from sklearn.model_selection import train_test_split
      from sklearn.preprocessing import LabelEncoder
      from sklearn.ensemble import RandomForestClassifier
      from sklearn.metrics import accuracy_score, classification_report
      import pandas as pd
      import joblib # For saving and loading models
      import seaborn as sns
      import matplotlib.pyplot as plt
      import numpy as np
[52]: # 1 # DATA PREPROCESSING
      # Option 1: Drop rows with missing values
      df = df.dropna()
      df.head()
                                                    Team2_Runs Match_Winner \
[52]:
                                 Venue Team1_Runs
         Match_ID Team1 Team2
                1
                    PAK
                          AUS Karachi
                                                256
                                                            224
                                                                       Team1
                2
                    ΝZ
                                Lord's
                                                                       Team2
      1
                           SA
                                                246
                                                            285
      2
                3
                    IND
                          PAK Karachi
                                                353
                                                            388
                                                                       Team2
                4
                                Lord's
                                                            247
                                                                       Team1
      3
                    PAK
                          PAK
                                                272
      4
                5
                    AUS
                          IND
                                Sydney
                                                225
                                                            367
                                                                       Team1
        Toss_Winner Toss_Decision Key_Performance_Metric
              Team1
      0
                              Bat
                                                        49
              Team1
                             Bowl
                                                         5
      1
              Team2
                             Bowl
      2
                                                        30
              Team1
                              Bat
                                                        60
```

4 Team2 Bowl

```
[60]: # Corelation between Match Winner and toss Winner
      # Encode 'Match_Winner' and 'Toss_Winner'
      le = LabelEncoder()
      df['Match_Winner_Encoded'] = le.fit_transform(df['Match_Winner'])
      df['Toss_Winner_Encoded'] = le.fit_transform(df['Toss_Winner'])
      # Calculate correlation
      correlation = df['Toss_Winner_Encoded'].corr(df['Match_Winner_Encoded'])
      # Scatter Plot
      plt.figure(figsize=(12, 6))
      plt.subplot(1, 2, 1)
      sns.scatterplot(x='Toss_Winner_Encoded', y='Match_Winner_Encoded', data=df,__
       ⇔hue='Toss_Winner', style='Match_Winner', palette='deep')
      plt.title('Scatter Plot of Toss Winner vs Match Winner')
      plt.xlabel('Toss Winner Encoded')
      plt.ylabel('Match Winner Encoded')
      # Heatmap of Correlation
      plt.subplot(1, 2, 2)
      corr_matrix = df[['Toss_Winner_Encoded', 'Match_Winner_Encoded']].corr()
      sns.heatmap(corr_matrix, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
      plt.title('Correlation Heatmap')
      plt.tight_layout()
      plt.show()
      print(f"Correlation between Toss Winner and Match Winner: {correlation}")
```

69



#### Correlation between Toss Winner and Match Winner: 0.03468237875987003

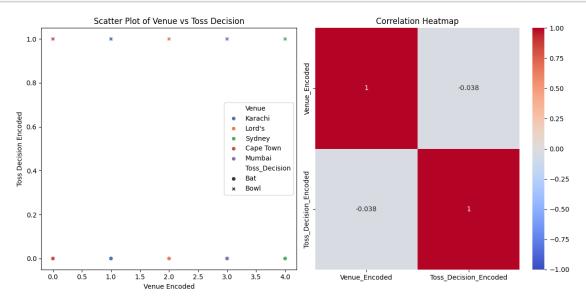
```
[61]: # Corelation between venue and toss decision
      # Encode 'Venue' and 'Toss_Decision'
      le_venue = LabelEncoder()
      le_toss_decision = LabelEncoder()
      df['Venue_Encoded'] = le_venue.fit_transform(df['Venue'])
      df['Toss_Decision_Encoded'] = le_toss_decision.

→fit_transform(df['Toss_Decision'])
      # Calculate correlation
      correlation = df['Venue_Encoded'].corr(df['Toss_Decision_Encoded'])
      # Scatter Plot
      plt.figure(figsize=(12, 6))
      plt.subplot(1, 2, 1)
      sns.scatterplot(x='Venue_Encoded', y='Toss_Decision_Encoded', data=df,_
       ⇔hue='Venue', style='Toss_Decision', palette='deep')
      plt.title('Scatter Plot of Venue vs Toss Decision')
      plt.xlabel('Venue Encoded')
      plt.ylabel('Toss Decision Encoded')
      # Heatmap of Correlation
      plt.subplot(1, 2, 2)
      corr_matrix = df[['Venue_Encoded', 'Toss_Decision_Encoded']].corr()
      sns.heatmap(corr_matrix, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
```

```
plt.title('Correlation Heatmap')
plt.tight_layout()

plt.show()

print(f"Correlation between Venue and Toss Decision: {correlation}")
```



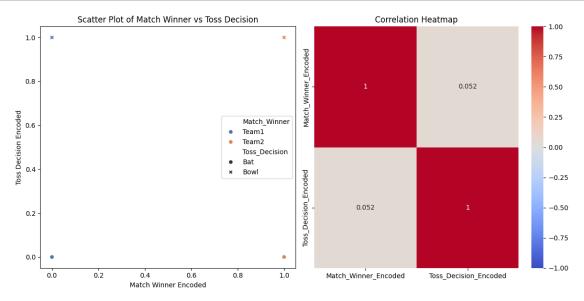
### Correlation between Venue and Toss Decision: -0.03832733438006386

```
plt.title('Scatter Plot of Match Winner vs Toss Decision')
plt.xlabel('Match Winner Encoded')
plt.ylabel('Toss Decision Encoded')

# Heatmap of Correlation
plt.subplot(1, 2, 2)
corr_matrix = df[['Match_Winner_Encoded', 'Toss_Decision_Encoded']].corr()
sns.heatmap(corr_matrix, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap')
plt.tight_layout()

plt.show()

print(f"Correlation between Match Winner and Toss Decision: {correlation}")
```



Correlation between Match Winner and Toss Decision: 0.05233956407613682

```
[64]: # Calculate the difference in runs
df['Runs_Difference'] = df['Team1_Runs'] - df['Team2_Runs']

# Encode 'Venue'
le_venue = LabelEncoder()
df['Venue_Encoded'] = le_venue.fit_transform(df['Venue'])

# Calculate correlation
correlation = abs(df['Runs_Difference'].corr(df['Venue_Encoded']))

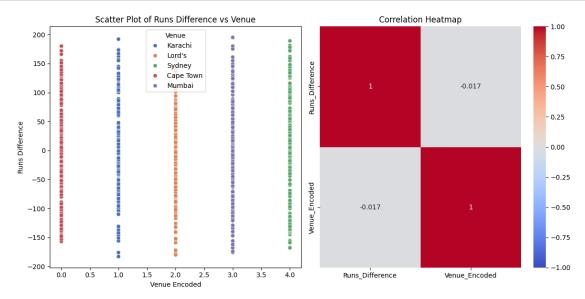
# Scatter Plot
```

```
plt.figure(figsize=(12, 6))

plt.subplot(1, 2, 1)
sns.scatterplot(x='Venue_Encoded', y='Runs_Difference', data=df, hue='Venue',
palette='deep')
plt.title('Scatter Plot of Runs Difference vs Venue')
plt.xlabel('Venue Encoded')
plt.ylabel('Runs Difference')

# Heatmap of Correlation
plt.subplot(1, 2, 2)
corr_matrix = df[['Runs_Difference', 'Venue_Encoded']].corr()
sns.heatmap(corr_matrix, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap')
plt.tight_layout()

plt.show()
print(f"Correlation between Runs Difference and Venue: {correlation}")
```

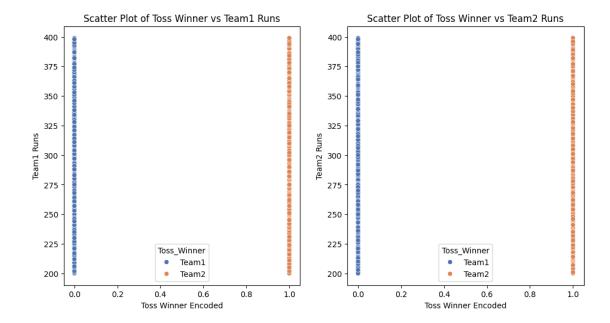


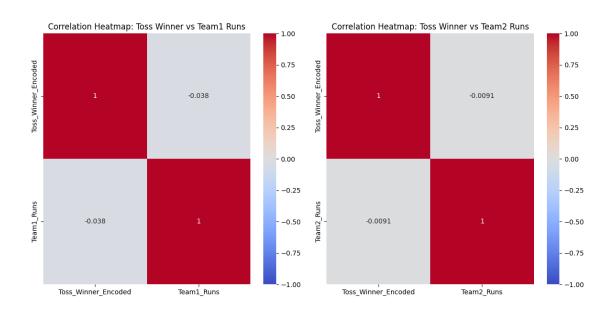
Correlation between Runs Difference and Venue: 0.017279942662082784

```
[65]: # Encode 'Toss_Winner'
le_toss_winner = LabelEncoder()
df['Toss_Winner_Encoded'] = le_toss_winner.fit_transform(df['Toss_Winner'])

# Calculate correlation between Toss Winner and Team1/Team2 Runs
correlation_team1_runs = df['Toss_Winner_Encoded'].corr(df['Team1_Runs'])
```

```
correlation_team2_runs = df['Toss_Winner_Encoded'].corr(df['Team2_Runs'])
# Scatter Plots
plt.figure(figsize=(12, 6))
plt.subplot(1, 2, 1)
sns.scatterplot(x='Toss_Winner_Encoded', y='Team1_Runs', data=df,__
 ⇔hue='Toss_Winner', palette='deep')
plt.title('Scatter Plot of Toss Winner vs Team1 Runs')
plt.xlabel('Toss Winner Encoded')
plt.ylabel('Team1 Runs')
plt.subplot(1, 2, 2)
sns.scatterplot(x='Toss_Winner_Encoded', y='Team2_Runs', data=df,_
 ⇔hue='Toss_Winner', palette='deep')
plt.title('Scatter Plot of Toss Winner vs Team2 Runs')
plt.xlabel('Toss Winner Encoded')
plt.ylabel('Team2 Runs')
# Heatmaps of Correlation
plt.figure(figsize=(12, 6))
plt.subplot(1, 2, 1)
corr_matrix_team1 = df[['Toss_Winner_Encoded', 'Team1_Runs']].corr()
sns.heatmap(corr_matrix_team1, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap: Toss Winner vs Team1 Runs')
plt.subplot(1, 2, 2)
corr_matrix_team2 = df[['Toss_Winner_Encoded', 'Team2_Runs']].corr()
sns.heatmap(corr_matrix_team2, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap: Toss Winner vs Team2 Runs')
plt.tight_layout()
plt.show()
print(f"Correlation between Toss Winner and Team1 Runs:
 →{correlation_team1_runs}")
print(f"Correlation between Toss Winner and Team2 Runs:
```

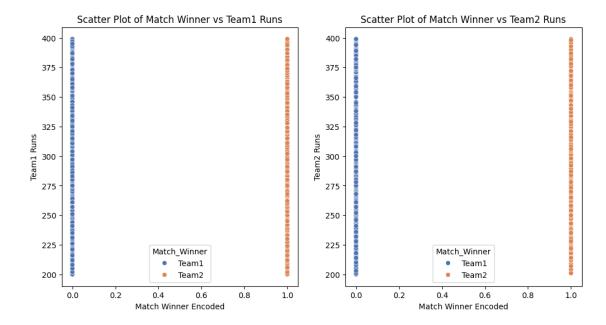


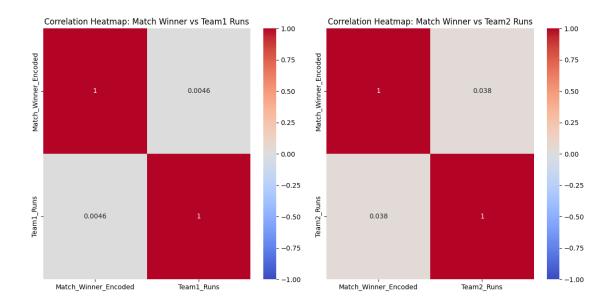


Correlation between Toss Winner and Team1 Runs: -0.03794300664016344 Correlation between Toss Winner and Team2 Runs: -0.009133629461834183

```
[66]: # Encode 'Match_Winner'
le_match_winner = LabelEncoder()
df['Match_Winner_Encoded'] = le_match_winner.fit_transform(df['Match_Winner'])
# Calculate correlation between Match Winner and Team1/Team2 Runs
```

```
correlation_team1_runs = df['Match_Winner_Encoded'].corr(df['Team1_Runs'])
correlation team2_runs = df['Match_Winner_Encoded'].corr(df['Team2_Runs'])
# Scatter Plots
plt.figure(figsize=(12, 6))
plt.subplot(1, 2, 1)
sns.scatterplot(x='Match_Winner_Encoded', y='Team1_Runs', data=df,__
 ⇔hue='Match_Winner', palette='deep')
plt.title('Scatter Plot of Match Winner vs Team1 Runs')
plt.xlabel('Match Winner Encoded')
plt.ylabel('Team1 Runs')
plt.subplot(1, 2, 2)
sns.scatterplot(x='Match_Winner_Encoded', y='Team2_Runs', data=df,__
 →hue='Match_Winner', palette='deep')
plt.title('Scatter Plot of Match Winner vs Team2 Runs')
plt.xlabel('Match Winner Encoded')
plt.ylabel('Team2 Runs')
# Heatmaps of Correlation
plt.figure(figsize=(12, 6))
plt.subplot(1, 2, 1)
corr matrix team1 = df[['Match Winner Encoded', 'Team1 Runs']].corr()
sns.heatmap(corr_matrix_team1, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap: Match Winner vs Team1 Runs')
plt.subplot(1, 2, 2)
corr_matrix_team2 = df[['Match_Winner_Encoded', 'Team2_Runs']].corr()
sns.heatmap(corr_matrix_team2, annot=True, cmap='coolwarm', vmin=-1, vmax=1)
plt.title('Correlation Heatmap: Match Winner vs Team2 Runs')
plt.tight_layout()
plt.show()
print(f"Correlation between Match Winner and Team1 Runs:
 print(f"Correlation between Match Winner and Team2 Runs:⊔
 →{correlation team2 runs}")
```





Correlation between Match Winner and Team1 Runs: 0.004573690404305322 Correlation between Match Winner and Team2 Runs: 0.03801289627802205

```
[2]: import pandas as pd
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestClassifier
from sklearn.metrics import accuracy_score
import tkinter as tk
```

```
from tkinter import simpledialog, messagebox
# Load DataFrame from CSV
df = pd.read_csv("/Users/csrbharadwaj/Desktop/Projects/Woxen_project/
 ⇔synthetic_match_outcome_data.csv")
# Handle special case for 'Toss_Winner' and 'Match_Winner'
def adjust_winner_column(df):
   df['Match_Winner'] = df.apply(lambda row: row['Team1'] if_
 →row['Match_Winner'] == 'Team1' else row['Team2'], axis=1)
   df['Toss_Winner'] = df.apply(lambda row: row['Team1'] if row['Toss_Winner']_
 →== 'Team1' else row['Team2'], axis=1)
   return df
df = adjust_winner_column(df)
# Create encoding dictionaries
def create_encodings(df, columns):
   encodings = {}
   for column in columns:
        unique_values = df[column].dropna().unique()
        encodings[column] = {value: idx for idx, value in_
 →enumerate(unique_values)}
   return encodings
def reverse_encodings(encodings):
   return {col: {idx: val for val, idx in encoding.items()} for col, encoding_
 →in encodings.items()}
# Define columns to encode
columns_to_encode = ['Team1', 'Team2', 'Venue', 'Toss_Winner', 'Toss_Decision', __
 encodings = create_encodings(df, columns_to_encode)
reverse_encodings_dict = reverse_encodings(encodings)
# Encode DataFrame
def encode df(df, encodings):
   encoded_df = df.copy()
   for column, encoding in encodings.items():
        encoded_df[column + '_Encoded'] = df[column].map(encoding)
   return encoded_df
encoded_df = encode_df(df, encodings)
# Features and target
```

```
features = encoded_df[['Team1_Encoded', 'Team2_Encoded', 'Venue_Encoded', 'Venue_Encoded', 'Team2_Encoded', 'Team2_Encoded', 'Team3_Encoded', 
  ⇔'Toss_Winner_Encoded', 'Toss_Decision_Encoded']]
target = encoded_df['Match_Winner_Encoded']
# Train-test split
X_train, X_test, y_train, y_test = train_test_split(features, target,_
  →test_size=0.2, random_state=42)
# Train the model
model = RandomForestClassifier()
model.fit(X_train, y_train)
# Evaluate the model
y_pred = model.predict(X_test)
print(f"Model Accuracy: {accuracy_score(y_test, y_pred):.2f}")
# Function to predict match winner
def predict_match_winner(team1, team2, venue, toss_winner, toss_decision):
         # Encode input features
         try:
                  team1_encoded = encodings['Team1'][team1]
                  team2_encoded = encodings['Team2'][team2]
                  venue_encoded = encodings['Venue'][venue]
                  toss_winner_encoded = encodings['Toss_Winner'][toss_winner]
                  toss_decision_encoded = encodings['Toss_Decision'][toss_decision]
         except KeyError as e:
                  raise ValueError(f"Unseen label encountered: {e}")
         # Prepare input for prediction
         input_features = [[team1_encoded, team2_encoded, venue_encoded,__
   →toss_winner_encoded, toss_decision_encoded]]
         # Predict
         prediction_encoded = model.predict(input_features)[0]
         match_winner = reverse_encodings_dict['Match_Winner'][prediction_encoded]
         return match_winner
# Function to prompt user for input and make prediction
def get_user_input():
        root = tk.Tk()
         root.withdraw() # Hide the root window
         # Predefined options for selection
         teams = list(encodings['Team1'].keys())
         venues = list(encodings['Venue'].keys())
         toss_decisions = list(encodings['Toss_Decision'].keys())
```

```
# Create dialog boxes for user input
    team1 = simpledialog.askstring("Input", f"Select Team 1 from: {', '.
  →join(teams)}")
    team2 = simpledialog.askstring("Input", f"Select Team 2 from: {', '.
  →join(teams)}")
    venue = simpledialog.askstring("Input", f"Select Venue from: {', '.

    join(venues)}")
    toss_winner = simpledialog.askstring("Input", f"Select Toss Winner from: u
 \hookrightarrow{', '.join(teams)}")
    toss_decision = simpledialog.askstring("Input", f"Select Toss Decision from:
 # Print for debugging
    print(f"User Input - Team1: {team1}, Team2: {team2}, Venue: {venue}, Tossu
 →Winner: {toss_winner}, Toss Decision: {toss_decision}")
    print(f"Valid Teams: {teams}")
    print(f"Valid Venues: {venues}")
    print(f"Valid Toss Decisions: {toss_decisions}")
    # Check if all inputs are valid
    if (team1 in encodings['Team1']) and (team2 in encodings['Team2']) and
  → (venue in encodings['Venue']) and (toss_winner in encodings['Toss_Winner'])
  →and (toss_decision in encodings['Toss_Decision']):
        predicted_winner = predict_match_winner(team1, team2, venue,__
 ⇔toss_winner, toss_decision)
        # Display and print predicted winner
        messagebox.showinfo("Prediction Result", f"Predicted Match Winner:
  →{predicted_winner}")
        print(f"Predicted Match Winner: {predicted_winner}") # Print in console
    else:
        messagebox.showwarning("Input Error", "Please select valid options for "
  ⇔all fields.")
    # Destroy the root window to close Tkinter
    root.destroy()
# Run the input function
get_user_input()
Model Accuracy: 0.62
User Input - Team1: PAK, Team2: IND, Venue: Mumbai, Toss Winner: IND, Toss
Decision: Bat
Valid Teams: ['PAK', 'NZ', 'IND', 'AUS', 'SA', 'ENG']
Valid Venues: ['Karachi', "Lord's", 'Sydney', 'Cape Town', 'Mumbai']
Valid Toss Decisions: ['Bat', 'Bowl']
```

/Library/Frameworks/Python.framework/Versions/3.11/lib/python3.11/site-packages/sklearn/base.py:493: UserWarning: X does not have valid feature names, but RandomForestClassifier was fitted with feature names warnings.warn(

Predicted Match Winner: IND

```
[4]: # VIZ
    import matplotlib.pyplot as plt
    import seaborn as sns
    from sklearn.metrics import confusion matrix, classification report
    # Generate confusion matrix
    cm = confusion_matrix(y_test, y_pred)
    # Plot the confusion matrix
    plt.figure(figsize=(8, 6))
    sns.heatmap(cm, annot=True, fmt='d', cmap='Blues',_
     →xticklabels=list(encodings['Match_Winner'].keys()),
     plt.title('Confusion Matrix')
    plt.xlabel('Predicted Label')
    plt.ylabel('True Label')
    plt.show()
    # Generate classification report
    report = classification_report(y_test, y_pred,__
     starget_names=list(encodings['Match_Winner'].keys()), output_dict=True)
    # Convert classification report to DataFrame for visualization
    report_df = pd.DataFrame(report).transpose()
    # Plot classification metrics (Precision, Recall, F1-Score)
    plt.figure(figsize=(10, 6))
    sns.barplot(x=report_df.index, y=report_df['precision'], color='lightblue', u
     →label='Precision')
    sns.barplot(x=report_df.index, y=report_df['recall'], color='salmon',_
     ⇔label='Recall', alpha=0.6)
    sns.barplot(x=report_df.index, y=report_df['f1-score'], color='yellow',__
      →label='F1-Score', alpha=0.4)
    plt.legend()
    plt.xticks(rotation=45)
    plt.title('Classification Report (Precision, Recall, F1-Score)')
    plt.show()
```

```
# Example loop for running multiple experiments (5 iterations)
accuracies = []
iterations = 5  # Number of runs
for i in range(iterations):
    X_train, X_test, y_train, y_test = train_test_split(features, target,_

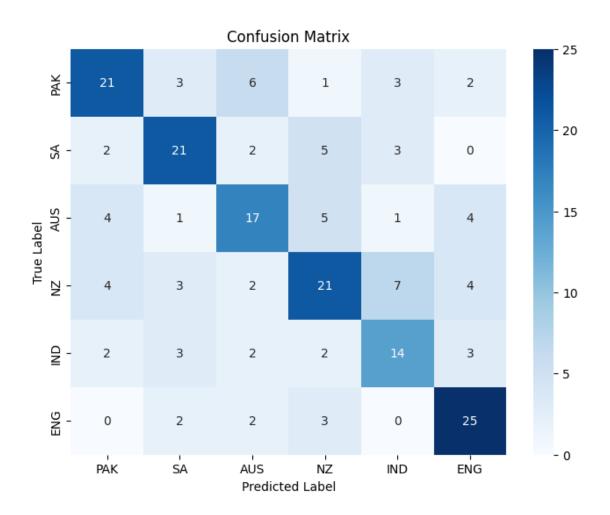
state=i)

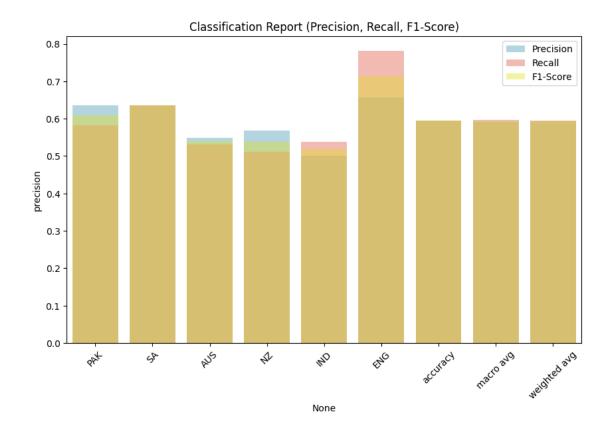
state=i)

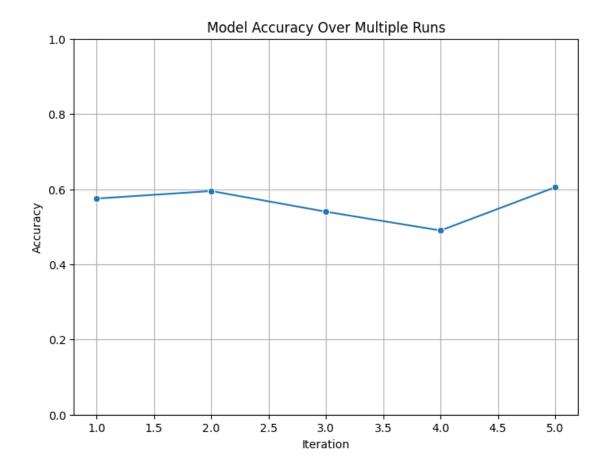
state=i)

state=i)

    # Train model
    model.fit(X_train, y_train)
    # Predict and calculate accuracy
    y_pred = model.predict(X_test)
    acc = accuracy_score(y_test, y_pred)
    accuracies.append(acc)
# Plot accuracies over multiple iterations
plt.figure(figsize=(8, 6))
sns.lineplot(x=list(range(1, iterations + 1)), y=accuracies, marker='o')
plt.title('Model Accuracy Over Multiple Runs')
plt.xlabel('Iteration')
plt.ylabel('Accuracy')
plt.ylim(0, 1)
plt.grid(True)
plt.show()
# Evaluate the model
y_pred = model.predict(X_test)
print(f"Model Accuracy: {accuracy_score(y_test, y_pred):.2f}")
```







# Model Accuracy: 0.60

```
The Kernel crashed while executing code in the current cell or a previous cell.

Please review the code in the cell(s) to identify a possible cause of the

Gailure.

Click <a href='https://aka.ms/vscodeJupyterKernelCrash'>here</a> for more info.

View Jupyter <a href='command:jupyter.viewOutput'>log</a> for further details.
```

```
[4]: # Importing required libraries
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
# Load your dataset (adjust the file path accordingly)
```

```
df = pd.read_csv('/Users/csrbharadwaj/Desktop/Projects/Woxen_project/

synthetic_match_outcome_data.csv')
# Group by Venue to calculate average runs per ground
venue_avg_runs = df.groupby('Venue')[['Team1_Runs', 'Team2_Runs']].mean().
 →reset index()
venue_avg_runs['Avg_Runs'] = venue_avg_runs[['Team1_Runs', 'Team2_Runs']].
 →mean(axis=1)
# Plot average runs per ground
plt.figure(figsize=(10, 6))
sns.barplot(x='Venue', y='Avg_Runs', data=venue_avg_runs, palette='viridis')
plt.title('Average Runs per Venue')
plt.xlabel('Venue')
plt.ylabel('Average Runs')
plt.xticks(rotation=45)
plt.show()
# Group by Venue and Team1 to get average performance per team at each ground
team_performance = df.groupby(['Venue', 'Team1'])['Team1_Runs'].mean().
 →reset_index()
# Plot team performance by venue
plt.figure(figsize=(12, 6))
sns.barplot(x='Venue', y='Team1_Runs', hue='Team1', data=team_performance,__
 →palette='Set1')
plt.title('Team Performance by Venue (Average Runs)')
plt.xlabel('Venue')
plt.ylabel('Average Runs Scored by Team1')
plt.xticks(rotation=45)
plt.legend(title='Team')
plt.show()
# Calculate the percentage of toss decisions at each venue
toss_decision percentage = df.groupby(['Venue', 'Toss_Decision']).size().

→reset_index(name='Counts')
toss decision percentage ['Toss Decision Pct'] = toss decision percentage.
 Groupby('Venue')['Counts'].transform(lambda x: 100 * x / x.sum())
# Plot toss decision percentages per ground
plt.figure(figsize=(10, 6))
sns.barplot(x='Venue', y='Toss_Decision_Pct', hue='Toss_Decision',_

data=toss_decision_percentage, palette='coolwarm')
plt.title('Toss Decision Percentage by Venue')
plt.xlabel('Venue')
plt.ylabel('Toss Decision Percentage')
```

```
plt.xticks(rotation=45)
plt.legend(title='Toss Decision')
plt.show()
# Group by Toss Decision and Match Winner
toss_decision_outcome = df.groupby(['Toss_Decision', 'Match_Winner']).size().
 →reset index(name='Counts')
toss_decision_outcome['Outcome_Pct'] = toss_decision_outcome.
 Groupby('Toss_Decision')['Counts'].transform(lambda x: 100 * x / x.sum())
# Plot toss decision impact on match outcome
plt.figure(figsize=(10, 6))
sns.barplot(x='Toss_Decision', y='Outcome_Pct', hue='Match_Winner',_

data=toss_decision_outcome, palette='Set2')

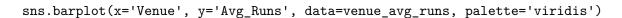
plt.title('Impact of Toss Decision on Match Outcome')
plt.xlabel('Toss Decision')
plt.ylabel('Outcome Percentage')
plt.legend(title='Match Winner')
plt.show()
# Calculate win percentage for each team per venue
team_win_percentage = df.groupby(['Venue', 'Match_Winner']).size().

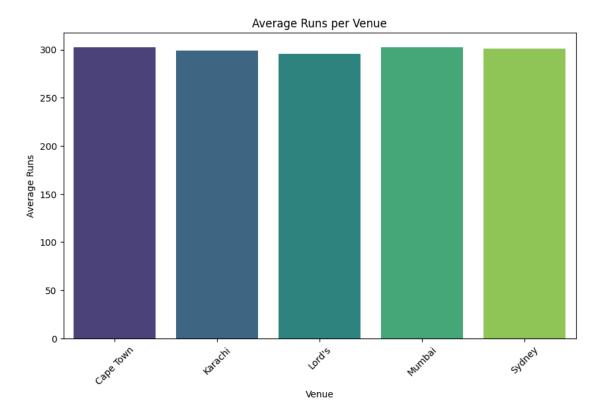
→reset index(name='Counts')
team_win_percentage['Win_Pct'] = team_win_percentage.groupby('Venue')['Counts'].
 →transform(lambda x: 100 * x / x.sum())
# Plot team win percentage by venue
plt.figure(figsize=(12, 6))
sns.barplot(x='Venue', y='Win_Pct', hue='Match_Winner',
 ⇔data=team_win_percentage, palette='Dark2')
plt.title('Team Win Percentage by Venue')
plt.xlabel('Venue')
plt.ylabel('Win Percentage')
plt.xticks(rotation=45)
plt.legend(title='Match Winner')
plt.show()
# Plot overall match outcome distribution
plt.figure(figsize=(8, 6))
sns.countplot(x='Match_Winner', data=df, palette='Set3')
plt.title('Overall Match Outcome Distribution')
plt.xlabel('Winning Team')
plt.ylabel('Number of Wins')
plt.xticks(rotation=45)
plt.show()
```

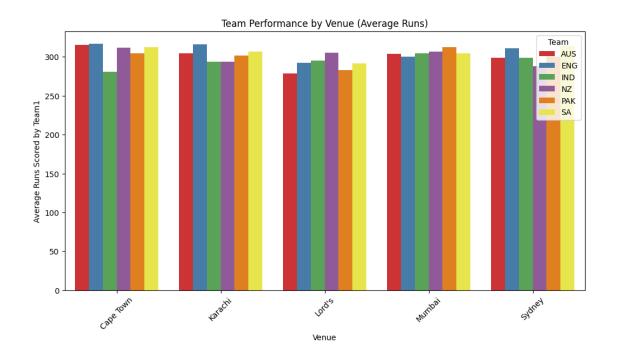
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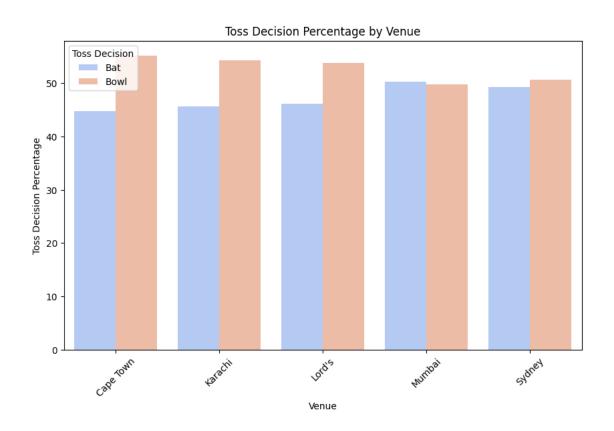
## : FutureWarning:

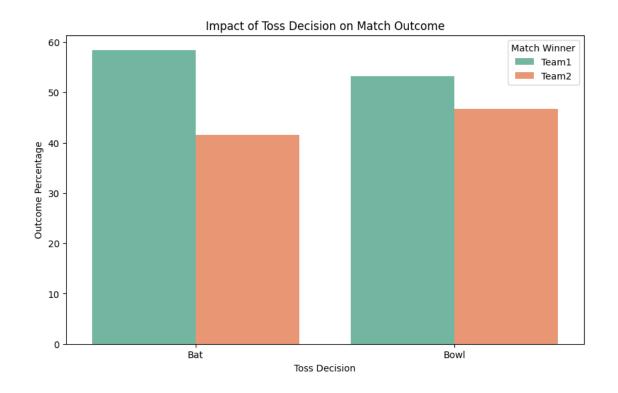
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

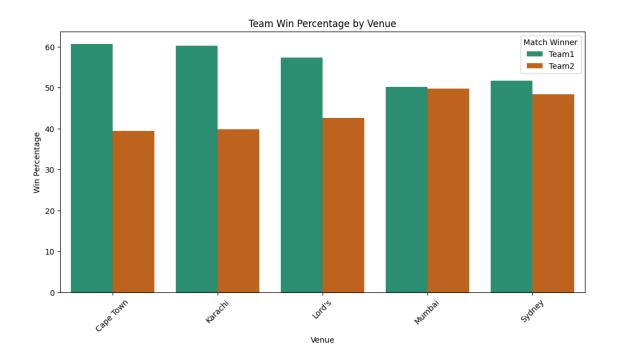






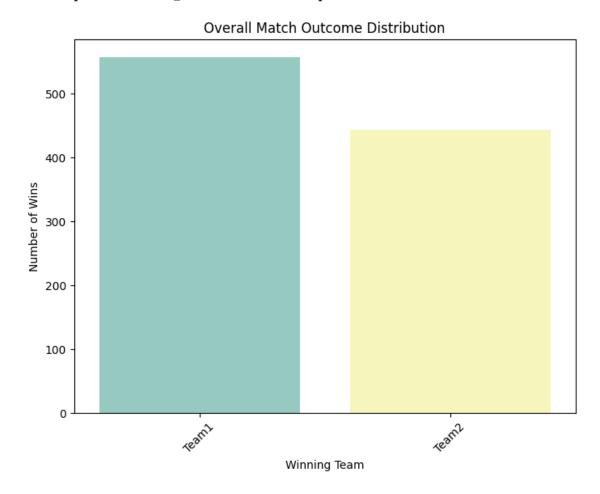






Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.countplot(x='Match\_Winner', data=df, palette='Set3')



```
[18]:
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns

# Team and Country mappings
team_country_mapping = {
    'PAK': 'Pakistan',
    'NZ': 'New Zealand',
    'IND': 'India',
```

```
'AUS': 'Australia',
    'SA': 'South Africa',
    'ENG': 'England'
}
# Venue to Country mapping
venue_country_mapping = {
    'Karachi': 'Pakistan',
    'Lord\'s': 'England',
    'Sydney': 'Australia',
    'Cape Town': 'South Africa',
    'Mumbai': 'India'
}
# Load DataFrame from CSV
df = pd.read_csv("/Users/csrbharadwaj/Desktop/Projects/Woxen_project/
 ⇔synthetic_match_outcome_data.csv")
# Handle special case for 'Toss Winner' and 'Match Winner'
def adjust_winner_column(df):
   df['Match Winner'] = df.apply(lambda row: row['Team1'] if___
 →row['Match Winner'] == 'Team1' else row['Team2'], axis=1)
   df['Toss_Winner'] = df.apply(lambda row: row['Team1'] if row['Toss_Winner']_
 →== 'Team1' else row['Team2'], axis=1)
   return df
df = adjust_winner_column(df)
# Function to determine if the match is HOME or AWAY for Team1
def assign_home_away(row):
   team_country = team_country_mapping.get(row['Team1'])
   venue_country = venue_country_mapping.get(row['Venue'])
   if team_country and venue_country:
        return 'HOME' if team_country == venue_country else 'AWAY'
   return 'UNKNOWN'
# Apply the function to the DataFrame
df['Home_Away'] = df.apply(assign_home_away, axis=1)
# Check the updated DataFrame (for debugging)
print(df[['Team1', 'Venue', 'Home_Away']].head())
# Function to calculate win percentage for Home or Away matches
def calculate_win_percentage(df, home_away_value):
   matches = df[df['Home_Away'] == home_away_value]
   total_matches = matches.shape[0]
   if total_matches == 0:
```

```
return 0
    wins = (matches['Match_Winner'] == matches['Team1']).sum()
    return (wins / total_matches) * 100
# Calculate win percentages for Home vs Away matches
home_win_percentage = calculate_win_percentage(df, 'HOME')
away_win_percentage = calculate_win_percentage(df, 'AWAY')
# Calculate average runs for Home vs Away matches
home_away_stats = df.groupby('Home_Away').agg({
    'Team1_Runs': 'mean',
    'Team2 Runs': 'mean'
}).reset index()
# Update stats DataFrame
home_away_stats['Win_Percentage'] = home_away_stats['Home_Away'].apply(
    lambda x: home_win_percentage if x == 'HOME' else away_win_percentage
# Calculate home advantage
home_away_stats['Avg_Runs'] = home_away_stats[['Team1_Runs', 'Team2_Runs']].
 →mean(axis=1)
home_away_stats['Advantage'] = home_away_stats.apply(
    lambda row: row['Team1_Runs'] - row['Team2_Runs'] if row['Home_Away'] ==__

   HOME' else 0,

    axis=1
)
# Plot average runs for Home vs Away matches
plt.figure(figsize=(12, 6))
sns.barplot(x='Home_Away', y='Avg_Runs', data=home_away_stats,_
 →palette='coolwarm')
plt.title('Average Runs: Home vs Away')
plt.xlabel('Match Location')
plt.ylabel('Average Runs')
plt.show()
# Plot win percentage for Home vs Away matches
plt.figure(figsize=(12, 6))
sns.barplot(x='Home_Away', y='Win_Percentage', data=home_away_stats,_
 ⇒palette='Set1')
plt.title('Win Percentage: Home vs Away')
plt.xlabel('Match Location')
plt.ylabel('Win Percentage')
plt.show()
# Display home advantage
```

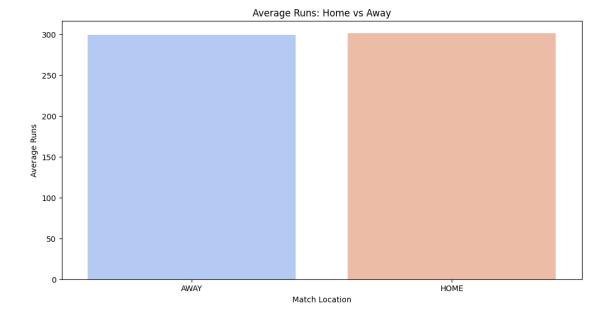
```
home_advantage = home_away_stats.loc[home_away_stats['Home_Away'] == 'HOME', \( \triangle 'Advantage'].values \)
if len(home_advantage) > 0:
    print(f"Home Advantage (Average Runs Difference): {home_advantage[0]:.2f}\( \triangle \tria
```

	Team1	Venue	${\tt Home\_Away}$
0	PAK	Karachi	HOME
1	NZ	Lord's	AWAY
2	IND	Karachi	AWAY
3	PAK	Lord's	AWAY
4	AUS	Sydney	HOME

/var/folders/4w/8nc72yd54xn14md6yf7nj8wr0000gn/T/ipykernel\_10661/2773637128.py:8 2: FutureWarning:

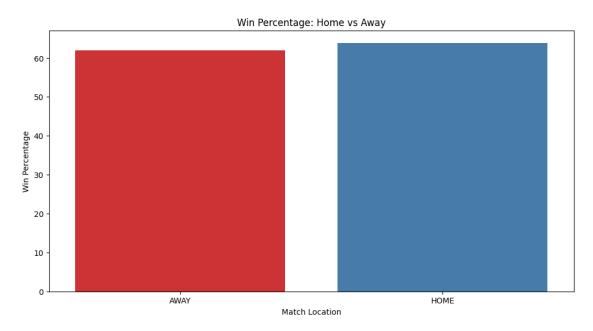
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.barplot(x='Home\_Away', y='Avg\_Runs', data=home\_away\_stats,
palette='coolwarm')



Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.barplot(x='Home\_Away', y='Win\_Percentage', data=home\_away\_stats,
palette='Set1')



Home Advantage (Average Runs Difference): 0.32 runs

```
[20]: import pandas as pd
      from sklearn.model_selection import train_test_split, cross_val_score
      from sklearn.ensemble import RandomForestClassifier
      from sklearn.metrics import mean_absolute_error
      import numpy as np
      import random
      import matplotlib.pyplot as plt
      # Load DataFrame from CSV
      df = pd.read_csv("/Users/csrbharadwaj/Desktop/Projects/Woxen_project/
       ⇔synthetic_match_outcome_data.csv")
      # Handle special case for 'Toss_Winner' and 'Match_Winner'
      def adjust winner column(df):
          df['Match_Winner'] = df.apply(lambda row: row['Team1'] if__
       →row['Match_Winner'] == 'Team1' else row['Team2'], axis=1)
          df['Toss_Winner'] = df.apply(lambda row: row['Team1'] if row['Toss_Winner']_

¬== 'Team1' else row['Team2'], axis=1)
```

```
return df
df = adjust_winner_column(df)
# Create encoding dictionaries
def create_encodings(df, columns):
          encodings = {}
          for column in columns:
                    unique_values = df[column].dropna().unique()
                    encodings[column] = {value: idx for idx, value in_
   →enumerate(unique_values)}
          return encodings
def reverse_encodings(encodings):
          return {col: {idx: val for val, idx in encoding.items()} for col, encoding_
  →in encodings.items()}
# Define columns to encode
columns_to_encode = ['Team1', 'Team2', 'Venue', 'Toss_Winner', 'Toss_Decision', __
  encodings = create_encodings(df, columns_to_encode)
reverse_encodings_dict = reverse_encodings(encodings)
# Encode DataFrame
def encode df(df, encodings):
          encoded_df = df.copy()
          for column, encoding in encodings.items():
                    encoded_df[column + '_Encoded'] = df[column].map(encoding)
          return encoded_df
encoded_df = encode_df(df, encodings)
# Features and target
features = encoded_df[['Team1_Encoded', 'Team2_Encoded', 'Venue_Encoded', 'Venue_Encoded', 'Team2_Encoded', 'Team2_Encoded', 'Venue_Encoded', 'Team3_Encoded', 
  ⇔'Toss_Winner_Encoded', 'Toss_Decision_Encoded']]
target = encoded_df['Match_Winner_Encoded']
# Train-test split
X_train, X_test, y_train, y_test = train_test_split(features, target,_

state=42)

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state=42)

# Train the model
model = RandomForestClassifier()
model.fit(X_train, y_train)
# Monte Carlo Simulation
def monte_carlo_simulation(model, encodings, num_simulations=1000):
```

```
teams = list(encodings['Team1'].keys())
  venues = list(encodings['Venue'].keys())
  toss_decisions = list(encodings['Toss_Decision'].keys())
  # Initialize win counts
  team_wins = {team: 0 for team in teams}
  total_matches = {team: 0 for team in teams}
  for _ in range(num_simulations):
      # Randomly select inputs
      team1 = random.choice(teams)
      team2 = random.choice(teams)
      venue = random.choice(venues)
      toss_winner = random.choice(teams)
      toss_decision = random.choice(toss_decisions)
      if team1 == team2:
          continue
      try:
          # Encode input features
          team1_encoded = encodings['Team1'][team1]
          team2_encoded = encodings['Team2'][team2]
          venue encoded = encodings['Venue'][venue]
          toss_winner_encoded = encodings['Toss_Winner'][toss_winner]
          toss_decision_encoded = encodings['Toss_Decision'][toss_decision]
      except KeyError as e:
          continue
      # Prepare input for prediction
      input_features = [[team1_encoded, team2_encoded, venue_encoded,__
stoss_winner_encoded, toss_decision_encoded]]
      # Predict
      prediction_encoded = model.predict(input_features)[0]
      match_winner =_
→reverse_encodings_dict['Match_Winner'][prediction_encoded]
      # Update win counts
      total_matches[team1] += 1
      total_matches[team2] += 1
      if match_winner == team1:
          team wins[team1] += 1
      elif match_winner == team2:
          team wins[team2] += 1
  # Calculate win percentages
```

```
win_percentages = {team: (team_wins[team] / total_matches[team]) * 100 if__
 stotal_matches[team] > 0 else 0 for team in teams}
   return win_percentages
# Run Monte Carlo Simulation
win percentages = monte carlo simulation(model, encodings)
print("Monte Carlo Simulation Win Percentages:")
for team, percentage in win_percentages.items():
   print(f"{team}: {percentage:.2f}%")
# Plot Monte Carlo Simulation Results
def plot_win_percentages(win_percentages):
   teams = list(win_percentages.keys())
   percentages = list(win_percentages.values())
   plt.figure(figsize=(12, 6))
   plt.bar(teams, percentages, color='skyblue')
   plt.xlabel('Teams')
   plt.ylabel('Win Percentage')
   plt.title('Monte Carlo Simulation Win Percentages')
   plt.xticks(rotation=45)
   plt.tight_layout()
   plt.show()
plot_win_percentages(win_percentages)
# Model Evaluation
def evaluate_model(model, X, y):
    # Cross-validation scores
    cv_scores = cross_val_score(model, X, y, cv=5, scoring='accuracy')
   print(f"Cross-Validation Accuracy Scores: {cv_scores}")
   print(f"Mean CV Accuracy Score: {cv_scores.mean():.2f}")
    # Make predictions on the entire dataset
   y_pred = model.predict(X)
    # Calculate mean absolute error
   mae = mean_absolute_error(y, y_pred)
   print(f"Mean Absolute Error: {mae:.2f}")
    # Plot actual vs. predicted values
   plt.figure(figsize=(12, 6))
   plt.scatter(y, y_pred, alpha=0.5)
   plt.xlabel('Actual Values')
   plt.ylabel('Predicted Values')
   plt.title('Actual vs. Predicted Values')
   plt.plot([min(y), max(y)], [min(y), max(y)], 'r--', lw=2) # Diagonal line
```

```
plt.grid(True)
    plt.tight_layout()
    plt.show()
# Evaluate the model
evaluate_model(model, features, target)
/Library/Frameworks/Python.framework/Versions/3.11/lib/python3.11/site-
packages/sklearn/base.py:493: UserWarning: X does not have valid feature names,
but RandomForestClassifier was fitted with feature names
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Monte Carlo Simulation Win Percentages:
PAK: 35.82%
NZ: 39.13%
IND: 34.43%
AUS: 55.08%
SA: 51.60%
ENG: 56.67%
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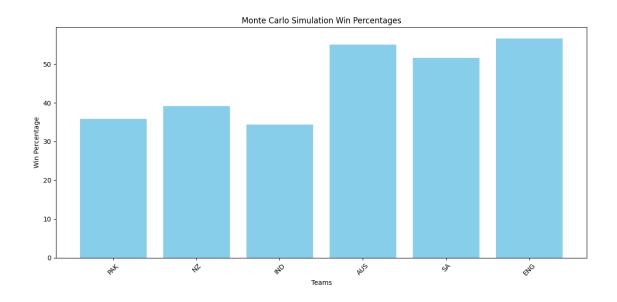
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Cross-Validation Accuracy Scores: [0.595 0.59 0.63 0.55 0.59 ]

Mean CV Accuracy Score: 0.59 Mean Absolute Error: 0.46

