



VIRGINIA COMMONWEALTH UNIVERSITY

Statistical analysis and modelling (SCMA 632)

**A1a: Preliminary preparation and analysis of data- Descriptive
statistics**

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Date of Submission: 18-06-2024

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INTRODUCTION

The IPL ball-by-ball data contains detailed information on each ball bowled in the IPL, including the match ID, date, season, teams, innings number, ball number, bowler, striker, non-striker, runs scored, extras, score, and wickets. The salaries data contains information on player salaries. We will arrange the data IPL round-wise and batsman, ball, runs, and wickets per player per match. Also we will indicate the top three run-getters and tow three wicket-takers in each IPL round and fit the most appropriate distribution for runs scored and wickets taken by the top three batsmen and bowlers in the lost three IPL tournaments using Python and R.

OBJECTIVES

Step-by-Step Plan

- **Arrange Data Round-wise:**
 - Extract rounds based on match ID or dates.
 - Summarize runs and wickets per player per match.
- **Top Performers per Round:**
 - Identify top three run-getters and wicket-takers per round.
- **Distribution Fitting:**
 - Fit distributions for runs scored and wickets taken by the top three batsmen and bowlers in the last three IPL tournaments.
- **Compare the relation between R ASHWIN'S Performance and his Salary.**

RESULTS AND INTERPRETATION

USING PYTHON

arranging the data round-wise and summarizing runs and wickets per player per match.

Code and result

```
import pandas as pd
ball_by_ball_data_path = '/content/IPL_ball_by_ball_updated till 2024 (1).csv'
ball_by_ball_df = pd.read_csv(ball_by_ball_data_path)
salaries_data_path = '/content/IPL SALARIES 2024 (1).xlsx'
salaries_df = pd.read_excel(salaries_data_path)
ball_by_ball_df.head(), salaries_df.head()
```

| | Match id | Date | Season | Batting team \ |
|---|----------|------------|---------|-----------------------|
| 0 | 335982 | 18-04-2008 | 2007/08 | Kolkata Knight Riders |
| 1 | 335982 | 18-04-2008 | 2007/08 | Kolkata Knight Riders |
| 2 | 335982 | 18-04-2008 | 2007/08 | Kolkata Knight Riders |
| 3 | 335982 | 18-04-2008 | 2007/08 | Kolkata Knight Riders |
| 4 | 335982 | 18-04-2008 | 2007/08 | Kolkata Knight Riders |

| | Bowling team | Innings No | Ball No | Bowler | Striker \ |
|---|-----------------------------|------------|---------|---------|-------------|
| 0 | Royal Challengers Bangalore | 1 | 0.1 | P Kumar | SC Ganguly |
| 1 | Royal Challengers Bangalore | 1 | 0.2 | P Kumar | BB McCullum |
| 2 | Royal Challengers Bangalore | 1 | 0.2 | P Kumar | BB McCullum |
| 3 | Royal Challengers Bangalore | 1 | 0.3 | P Kumar | BB McCullum |
| 4 | Royal Challengers Bangalore | 1 | 0.4 | P Kumar | BB McCullum |

| | Non Striker | runs_scored | extras | type of extras | score | score/wicket \ |
|---|-------------|-------------|--------|----------------|-------|----------------|
| 0 | BB McCullum | 0 | 1 | legbyes | 1 | 1/0 |
| 1 | SC Ganguly | 0 | 0 | NaN | 1 | 1/0 |
| 2 | SC Ganguly | 0 | 1 | wides | 2 | 2/0 |
| 3 | SC Ganguly | 0 | 0 | NaN | 2 | 2/0 |
| 4 | SC Ganguly | 0 | 0 | NaN | 2 | 2/0 |

| | wicket_confirmation | wicket_type | fielders_involved | Player Out |
|---|---------------------|-------------|-------------------|------------|
| 0 | 0.0 | NaN | NaN | NaN |
| 1 | 0.0 | NaN | NaN | NaN |
| 2 | 0.0 | NaN | NaN | NaN |
| 3 | 0.0 | NaN | NaN | NaN |
| 4 | 0.0 | NaN | NaN | NaN , |

| | Player | Salary | Rs | international | iconic |
|---|----------------|------------|-----|---------------|--------|
| 0 | Abhishek Porel | 20 lakh | 20 | 0 | NaN |
| 1 | Anrich Nortje | 6.5 crore | 650 | 1 | NaN |
| 2 | Axar Patel | 9 crore | 900 | 0 | NaN |
| 3 | David Warner | 6.25 crore | 625 | 1 | NaN |
| 4 | Ishant Sharma | 50 lakh | 50 | 0 | NaN) |

Summary of Runs and Wickets Per Player Per Match

We now have a summarized dataset with runs scored and wickets taken per player per match, categorized by rounds. The next step is to identify the top three run-getters and wicket-takers for each round.

Top Performers Per Round

We'll find the top three batsmen and bowlers for each round based on runs scored and wickets taken, respectively.

Let's perform this calculation

```
# Convert 'Date' to datetime format for easier manipulation
ball_by_ball_df['Date'] = pd.to_datetime(ball_by_ball_df['Date'], format='%d-%m-%Y')

# Create a 'Round' column to categorize matches into rounds
# Assuming each round consists of a set number of matches
# (e.g., 10 matches per round)
# You can adjust this based on the actual tournament structure

# Assign round numbers based on match id or date
ball_by_ball_df['Round'] = (ball_by_ball_df['Match id'] -
ball_by_ball_df['Match id'].min()) // 10 + 1

# Group by relevant columns to get runs scored and wickets
taken per player per match
match_summary = ball_by_ball_df.groupby(['Round', 'Match id',
'Season', 'Date', 'Striker', 'Bowler']).agg({
    'runs_scored': 'sum',
    'wicket_confirmation': 'sum'
}).reset_index()

# Rename columns for clarity
match_summary.rename(columns={
    'Striker': 'Batsman',
    'Bowler': 'Bowler',
    'runs_scored': 'Runs Scored',
    'wicket_confirmation': 'Wickets Taken'
}, inplace=True)

match_summary.head()
```

Result

| Round | Match id | Season | Date | Batsman | Bowler | Runs Scored | Wickets Taken |
|-------|----------|--------|------|---------|--------|-------------|---------------|
|-------|----------|--------|------|---------|--------|-------------|---------------|

| | | | | | | |
|----|---|--------|---------|------------|-------------|------------|
| 0 | 1 | 335982 | 2007/08 | 2008-04-18 | AA Noffke | AB Agarkar |
| 2 | | | | | | |
| 1 | 1 | 335982 | 2007/08 | 2008-04-18 | AA Noffke | SC Ganguly |
| 7 | | | | | | |
| 2 | 1 | 335982 | 2007/08 | 2008-04-18 | B Akhil | AB Agarkar |
| 0 | | | | | | |
| 3 | 1 | 335982 | 2007/08 | 2008-04-18 | BB McCullum | AA Noffke |
| 24 | | | | | | |
| 4 | 1 | 335982 | 2007/08 | 2008-04-18 | BB McCullum | CL White |
| 16 | | | | | | |

| | Wickets Taken |
|---|---------------|
| 0 | 0 |
| 1 | 1 |
| 2 | 1 |
| 3 | 0 |
| 4 | 0 |

```
# Find top 3 run-getters and wicket-takers per round

# Helper function to get top 3 performers per round
def get_top_performers(df, column, top_n=3):
    return df.groupby('Round').apply(lambda x: x.nlargest(top_n,
column)).reset_index(drop=True)

# Top 3 run-getters per round
top_run_getters = get_top_performers(match_summary, 'Runs Scored')

# Top 3 wicket-takers per round
top_wicket_takers = get_top_performers(match_summary, 'Wickets Taken')

# Display results
top_run_getters.head(10), top_wicket_takers.head(10)
```

RESULT

| (| Round | Match id | Season | Date | Batsman | Bowler \ |
|---|-------|----------|---------|------------|---------------|-----------------|
| 0 | 1 | 335990 | 2007/08 | 2008-04-24 | A Symonds | SK Warne |
| 1 | 1 | 335982 | 2007/08 | 2008-04-18 | BB McCullum | Z Khan |
| 2 | 1 | 335982 | 2007/08 | 2008-04-18 | BB McCullum | JH Kallis |
| 3 | 2 | 335996 | 2007/08 | 2008-04-28 | MS Dhoni | DW Steyn |
| 4 | 2 | 335999 | 2007/08 | 2008-05-01 | RG Sharma | Gagandeep Singh |
| 5 | 2 | 335994 | 2007/08 | 2008-04-27 | AC Gilchrist | SM Pollock |
| 6 | 3 | 336003 | 2007/08 | 2008-05-03 | DJ Hussey | Gagandeep Singh |
| 7 | 3 | 336006 | 2007/08 | 2008-05-05 | R Dravid | VRV Singh |
| 8 | 3 | 336011 | 2007/08 | 2008-05-09 | YK Pathan | PP Ojha |
| 9 | 4 | 336018 | 2007/08 | 2008-05-14 | ST Jayasuriya | JA Morkel |

| | Runs Scored | Wickets Taken |
|---|-------------|---------------|
| 0 | 35 | 0.0 |
| 1 | 33 | 0.0 |
| 2 | 32 | 0.0 |
| 3 | 31 | 0.0 |
| 4 | 28 | 0.0 |

```

5      27      0.0
6      33      1.0
7      27      2.0
8      25      1.0
9      36      0.0 ,
Round Match id Season   Date      Batsman      Bowler \
0    1   335991 2007/08 2008-04-25  KC Sangakkara Harbhajan Singh
1    1   335982 2007/08 2008-04-18   AA Noffke     SC Ganguly
2    1   335982 2007/08 2008-04-18    B Akhil     AB Agarkar
3    2   335997 2007/08 2008-04-29 Mohammad Hafeez ST Jayasuriya
4    2   335992 2007/08 2008-04-26    GC Smith     SB Joshi
5    2   335992 2007/08 2008-04-26   JH Kallis     SK Trivedi
6    3   336002 2007/08 2008-05-25   AS Yadav      DW Steyn
7    3   336006 2007/08 2008-05-05   R Dravid      VRV Singh
8    3   336006 2007/08 2008-05-05    V Kohli      IK Pathan
9    4   336012 2007/08 2008-05-28    B Akhil      DR Smith

Runs Scored  Wickets Taken
0          14          2.0
1           7          1.0
2           0          1.0
3           0          2.0
4          14          1.0
5           1          1.0
6           0          2.0
7          27          2.0
8           9          2.0
9           0          1.0 )

```

We now have the top three run-getters and top three wicket-takers for each round.

Fit Distributions for Runs and Wickets

Next, we will fit the most appropriate distributions for runs scored and wickets taken by the top three batsmen and bowlers in the last three IPL tournaments. We will:

1. Filter the data for the last three IPL seasons.
2. Identify the top three run-getters and wicket-takers for these seasons.
3. Fit distributions to their runs and wickets data.

Let's begin by filtering the data for the last three IPL seasons.

```

# Filter the data for the last three IPL seasons
latest_seasons = ball_by_ball_df['Season'].unique()[-3:]
latest_data =
ball_by_ball_df[ball_by_ball_df['Season'].isin(latest_seasons)]
print (latest_data)

```

RESULT

| Match id | Date | Season | Batting team | Bowling team | \ |
|----------|--------|------------|--------------|-----------------------|----------------|
| 94550 | 729279 | 2014-04-16 | 2014 | Kolkata Knight Riders | Mumbai Indians |
| 94551 | 729279 | 2014-04-16 | 2014 | Kolkata Knight Riders | Mumbai Indians |
| 94552 | 729279 | 2014-04-16 | 2014 | Kolkata Knight Riders | Mumbai Indians |
| 94553 | 729279 | 2014-04-16 | 2014 | Kolkata Knight Riders | Mumbai Indians |
| 94554 | 729279 | 2014-04-16 | 2014 | Kolkata Knight Riders | Mumbai Indians |
| ... | ... | ... | ... | ... | ... |
| 131158 | 980973 | 2016-05-08 | 2016 | Sunrisers Hyderabad | Mumbai Indians |
| 131159 | 980973 | 2016-05-08 | 2016 | Sunrisers Hyderabad | Mumbai Indians |
| 131160 | 980973 | 2016-05-08 | 2016 | Sunrisers Hyderabad | Mumbai Indians |
| 131161 | 980973 | 2016-05-08 | 2016 | Sunrisers Hyderabad | Mumbai Indians |
| 131162 | 980973 | 2016-05-08 | 2016 | Sunrisers Hyderabad | Mumbai Indians |

| Innings No | Ball No | Bowler | Striker | Non Striker | \ |
|------------|---------|--------|------------|--------------|--------------|
| 94550 | 1 | 0.1 | Z Khan | G Gambhir | JH Kallis |
| 94551 | 1 | 0.2 | Z Khan | G Gambhir | JH Kallis |
| 94552 | 1 | 0.3 | Z Khan | G Gambhir | JH Kallis |
| 94553 | 1 | 0.4 | Z Khan | G Gambhir | JH Kallis |
| 94554 | 1 | 0.5 | Z Khan | G Gambhir | JH Kallis |
| ... | ... | ... | ... | ... | ... |
| 131158 | 1 | 17.1 | TG Southee | S Dhawan | Yuvraj Singh |
| 131159 | 1 | 17.2 | TG Southee | S Dhawan | Yuvraj Singh |
| 131160 | 1 | 17.3 | TG Southee | Yuvraj Singh | S Dhawan |
| 131161 | 1 | 17.4 | TG Southee | Yuvraj Singh | S Dhawan |
| 131162 | 1 | 17.5 | TG Southee | S Dhawan | Yuvraj Singh |

| runs_scored | extras | type of extras | score | score/wicket | \ |
|-------------|--------|----------------|-------|--------------|-------|
| 94550 | 0 | 0 | NaN | 0 | 0/0 |
| 94551 | 0 | 0 | NaN | 0 | 0/0 |
| 94552 | 0 | 0 | NaN | 0 | 0/0 |
| 94553 | 0 | 0 | NaN | 0 | 0/0 |
| 94554 | 0 | 0 | NaN | 0 | 0/0 |
| ... | ... | ... | ... | ... | ... |
| 131158 | 2 | 0 | NaN | 145 | 145/2 |
| 131159 | 1 | 0 | NaN | 146 | 146/2 |
| 131160 | 6 | 0 | NaN | 152 | 152/2 |
| 131161 | 1 | 0 | NaN | 153 | 153/2 |
| 131162 | 4 | 0 | NaN | 15 | NaN |

| wicket confirmation | wicket_type | fielders involved | Player Out | Round |
|---------------------|-------------|-------------------|------------|-------|
| 94550 | 0.0 | NaN | NaN | NaN |
| 39330 | | | | |

| | | | | |
|--------|-----|-----|-----|-----|
| 94551 | 0.0 | NaN | NaN | NaN |
| 39330 | | | | |
| 94552 | 0.0 | NaN | NaN | NaN |
| 39330 | | | | |
| 94553 | 0.0 | NaN | NaN | NaN |
| 39330 | | | | |
| 94554 | 0.0 | NaN | NaN | NaN |
| 39330 | | | | |
| ... | ... | ... | ... | ... |
| ... | | | | |
| 131158 | 0.0 | NaN | NaN | NaN |
| 64500 | | | | |
| 131159 | 0.0 | NaN | NaN | NaN |
| 64500 | | | | |
| 131160 | 0.0 | NaN | NaN | NaN |
| 64500 | | | | |
| 131161 | 0.0 | NaN | NaN | NaN |
| 64500 | | | | |
| 131162 | NaN | NaN | NaN | NaN |
| 64500 | | | | |

[36613 rows x 20 columns]

To analyze R ASHWIN's performance and his salary relationship, follow these steps:

1. **Filter R ASHWIN's Data:**
 - Extract R ASHWIN's performance data from the ball-by-ball dataset.
 - Get his salary data from the salary dataset.
2. **Summarize Performance Metrics:**
 - Calculate the total runs scored and total wickets taken by R ASHWIN's.
3. **Merge Data:**
 - Combine the performance summary with the salary data for R ASHWIN.
4. **Analyze the Relationship:**
 - Use visualizations and statistical methods to analyze the relationship between R ASHWIN performance metrics and salary.

Implementation in Python

Here's how you can do it:

```
# Filter R Ashwin's performance data
ashwin_performance = ball_by_ball_df[(ball_by_ball_df['Striker'] == 'R
Ashwin') | (ball_by_ball_df['Bowler'] == ' R Ashwin ')]

# Summarize performance metrics
ashwin_summary = ashwin_performance.groupby('Season').agg({
    'runs_scored': lambda x: x[(ashwin_performance['Striker'] == 'R
Ashwin')].sum(),
```

```

    'wicket_confirmation': lambda x: x[(ashwin_performance['Bowler'] ==
'R Ashwin')].sum()
}).reset_index()

# Check if 'R Ashwin' is in the salary dataset
ashwin_salary = salaries_df[salaries_df['Player'].str.contains(' R
Ashwin ', case=False)]

# If the salary information for Ashwin is found, add it to the summary
if not ashwin_salary.empty:
    ashwin_summary['Salary'] = ashwin_salary['Salary'].values[0]

ashwin_summary.head()

```

RESULT

| Season | runs_scored | wicket_confirmation | Salary |
|--------|-------------|---------------------|--------------|
| 0 | 2012 | 7 | 14.0 5 crore |
| 1 | 2013 | 35 | 16.0 5 crore |
| 2 | 2014 | 45 | 17.0 5 crore |
| 3 | 2015 | 52 | 10.0 5 crore |
| 4 | 2016 | 11 | 4.0 5 crore |

```

import seaborn as sns
import matplotlib.pyplot as plt
from scipy.stats import pearsonr

if not ashwin_salary.empty:
    # Scatter plot for runs scored vs salary
    sns.scatterplot(data=ashwin_summary, x='runs_scored', y='Salary')
    plt.title('R Ashwin: Runs Scored vs Salary')
    plt.xlabel('Total Runs Scored')
    plt.ylabel('Salary (in lakhs)')
    plt.show()

    # Scatter plot for wickets taken vs salary
    sns.scatterplot(data=ashwin_summary, x='wicket_confirmation',
y='Salary')
    plt.title('R Ashwin: Wickets Taken vs Salary')
    plt.xlabel('Total Wickets Taken')
    plt.ylabel('Salary (in lakhs)')

```

```

plt.show()

# Calculate Pearson correlation coefficients
runs_salary_corr, _ = pearsonr(ashwin_summary['runs_scored'],
ashwin_summary['Salary'])
wickets_salary_corr, _ =
pearsonr(ashwin_summary['wicket_confirmation'],
ashwin_summary['Salary'])

print(f'Pearson correlation between runs scored and salary for R
Ashwin: {runs_salary_corr}')
print(f'Pearson correlation between wickets taken and salary for R
Ashwin: {wickets_salary_corr}')
else:
print("R Ashwin's salary data not found in the dataset.")

```

RESULT

Pearson correlation coefficients is calculated to find the relation between R Ashwin performance and his salary.

USING R

To analyze the IPL data as requested, we'll follow these steps:

1. Load the provided CSV and Excel files.
2. Organize the data round-wise, summarizing runs and wickets per player per match.
3. Identify the top three run-getters and wicket-takers in each IPL round.
4. Fit appropriate distributions for runs scored and wickets taken by the top performers in the last three IPL tournaments.
5. Analyze the relationship between the performance of R Ashwin and his salary.

- **Load the required libraries:**

- `dplyr` for data manipulation.
- `readr` for reading CSV files.
- `readxl` for reading Excel files.
- `fitdistrplus` for fitting distributions.

- **Load the data from the CSV and Excel files.**

- **Process the data:**

- Calculate total runs per player per match.
- Calculate total wickets per bowler per match.

CODE

```
# Load necessary libraries
```

```
library(readr)
```

```
library(readxl)
```

```
library(dplyr)
```

```
library(fitdistrplus)
```

```
# Load the data
```

```
ball_by_ball_data <- read_csv("/mnt/data/IPL_ball_by_ball_updated till 2024 (1).csv")
```

```
salaries_data <- read_excel("/mnt/data/IPL SALARIES 2024.xlsx")
```

```
# Display the first few rows of each dataset to understand their structure
```

```
head(ball_by_ball_data)
```

```
head(salaries_data)
```

```
# Rename columns to make them easier to work with in R
```

```
colnames(ball_by_ball_data) <- c("match_id", "date", "season", "batting_team",  
"bowling_team", "innings_no",
```

```
"ball_no", "bowler", "striker", "non_striker", "runs_scored",  
"extras",
```

```
"type_of_extras", "score", "score_wicket", "wicket_confirmation",
```

```
"wicket_type", "fielders_involved", "player_out")
```

```
# Calculate total runs per player per match
```

```
runs_data <- ball_by_ball_data %>%
```

```
group_by(match_id, striker) %>%
```

```
summarise(total_runs = sum(runs_scored, na.rm = TRUE)) %>%
```

```
ungroup()
```

```
# Calculate total wickets per bowler per match
```

```
wickets_data <- ball_by_ball_data %>%
```

```
filter(!is.na(player_out)) %>%
```

```
group_by(match_id, bowler) %>%
```

```
summarise(total_wickets = n()) %>%
```

```
ungroup()
```

```
# Function to find top 3 run-getters and wicket-takers per match
```

```
top_performers <- function(data, metric, top_n = 3) {
```

```

data %>%

  group_by(match_id) %>%

  top_n(n = top_n, wt = !!sym(metric)) %>%

  ungroup()

}

# Identify top performers

top_run_getters <- top_performers(runs_data, "total_runs")

top_wicket_takers <- top_performers(wickets_data, "total_wickets")


# Display top performers

head(top_run_getters)

head(top_wicket_takers)


# Filter data for the last three IPL tournaments

last_three_seasons <- c(2022, 2023, 2024)

filtered_runs_data <- runs_data %>%

  filter(season %in% last_three_seasons)

filtered_wickets_data <- wickets_data %>%

  filter(season %in% last_three_seasons)


# Extract top 3 performers in the last three seasons

top_run_getters_last_three <- top_performers(filtered_runs_data, "total_runs")

top_wicket_takers_last_three <- top_performers(filtered_wickets_data,
"total_wickets")

```

```
# Fit distributions
```

```
fit_distribution <- function(data, column) {
```

```
  fit <- fitdist(data[[column]], "norm")
```

```
  plot(fit)
```

```
  fit
```

```
}
```

```
# Fit distributions for runs and wickets
```

```
run_distribution_fit <- fit_distribution(top_run_getters_last_three, "total_runs")
```

```
wicket_distribution_fit <- fit_distribution(top_wicket_takers_last_three,  
"total_wickets")
```

```
# Display the results
```

```
run_distribution_fit
```

```
wicket_distribution_fit
```

RESULT

This program will:

1. Load the necessary libraries.
2. Load the data from the specified CSV and Excel files.
3. Process the ball-by-ball data to calculate runs and wickets per player per match.
4. Identify the top three run-getters and wicket-takers per match.
5. Filter data for the last three IPL tournaments.
6. Fit normal distributions for the runs scored and wickets taken by the top performers in the last three IPL tournaments and plot the fitted distributions.

NOW WE WILL ANALYSE THE RELATIONSHIP BETWEEN THE PERFORMANCE OF R ASHWIN AND HIS SALARY.

```
# Compare R Ashwin's salary and performance
```

```
# Filter R Ashwin's performance data
```

```
ashwin_wickets <- wickets_data %>%
```

```
  filter(bowler == "R Ashwin")
```

```
# Extract R Ashwin's salary
```

```
ashwin_salary <- salaries_data %>%
```

```
  filter(Player == "R Ashwin") %>%
```

```
  select(Salary)
```

```
# Display R Ashwin's performance and salary
```

```
ashwin_wickets_summary <- ashwin_wickets %>%
```

```
  summarise(total_wickets = sum(total_wickets), average_wickets_per_match =  
  mean(total_wickets))
```

```
ashwin_salary
```

```
ashwin_wickets_summary
```

```
# Merge Ashwin's performance and salary data
```

```
ashwin_performance_salary <- merge(ashwin_wickets, ashwin_salary, by.x = "season",  
  by.y = "Season")
```

```
# Compute the correlation between Ashwin's salary and his performance metrics
```

```
correlation_total_wickets <- cor(ashwin_performance_salary$total_wickets,  
  ashwin_performance_salary$Salary, use = "complete.obs")
```

```
correlation_average_wickets <-  
cor(ashwin_performance_salary$average_wickets_per_match,  
  ashwin_performance_salary$Salary, use = "complete.obs")
```



```
# Print the correlation results
```

```
cat("Correlation between Ashwin's total wickets and salary: ",  
correlation_total_wickets, "\n")
```

```
cat("Correlation between Ashwin's average wickets per match and salary: ",  
correlation_average_wickets, "\n")
```

RESULT

The output will provide you the correlation between Ashwin's overall performance and salary.