

Project One: Data Visualization, Descriptive Statistics, Confidence Intervals

This notebook contains the step-by-step directions for Project One. It is very important to run through the steps in order. Some steps depend on the outputs of earlier steps. Once you have completed the steps in this notebook, be sure to write your summary report.

You are a data analyst for a basketball team and have access to a large set of historical data that you can use to analyze performance patterns. The coach of the team and your management have requested that you use descriptive statistics and data visualization techniques to study distributions of key performance metrics that are included in the data set. These data-driven analytics will help make key decisions to improve the performance of the team. You will use the Python programming language to perform the statistical analyses and then prepare a report of your findings to present for the team's management. Since the managers are not data analysts, you will need to interpret your findings and describe their practical implications.

There are four important variables in the data set that you will study in Project One.

Variable	What does it represent?
pts	Points scored by the team in a game
elo_n	A measure of the relative skill level of the team in the league
year_id	Year when the team played the games
fran_id	Name of the NBA team
game_location	H=Home A=Away

The ELO rating, represented by the variable **elo_n**, is used as a measure of the relative skill of a team. This measure is inferred based on the final score of a game, the game location, and the outcome of the game relative to the probability of that outcome. The higher the number, the higher the relative skill of a team.

In addition to studying data on your own team, your management has assigned you a second team so that you can compare its performance with your own team's.

Team	What does it represent?
Your Team	This is the team that has hired you as an analyst. This is the team that you will pick below. See Step 2.
Assigned Team	This is the team that the management has assigned to you to compare against your team. See Step 1.

Reminder: It may be beneficial to review the summary report template for Project One prior to starting this Python script. That will give you an idea of the questions you will need to

to starting this Python script. That will give you an idea of the questions you will need to answer with the outputs of this script.

Step 1: Data Preparation & the Assigned Team

This step uploads the data set from a CSV file. It also selects the assigned team for this analysis. Do not make any changes to the code block below.

1. The **assigned team** is the **Chicago Bulls** from the years **1996-1998**

Click the block of code below and hit the **Run** button above.

```
In [1]: import numpy as np
import pandas as pd
import scipy.stats as st
import matplotlib.pyplot as plt
from IPython.display import display, HTML

nba_orig_df = pd.read_csv('nbaallelo.csv')
nba_orig_df = nba_orig_df[(nba_orig_df['lg_id']=='NBA') & (nba_orig_df['is_playoffs']
columns_to_keep = ['game_id', 'year_id', 'fran_id', 'pts', 'opp_pts', 'elo_n', 'opp_elo_n']
nba_orig_df = nba_orig_df[columns_to_keep]

# The dataframe for the assigned team is called assigned_team_df.
# The assigned team is the Chicago Bulls from 1996-1998.
assigned_years_league_df = nba_orig_df[(nba_orig_df['year_id'].between(1996, 1998))
assigned_team_df = assigned_years_league_df[(assigned_years_league_df['fran_id']=='
assigned_team_df = assigned_team_df.reset_index(drop=True)

display(HTML(assigned_team_df.head().to_html()))
print("printed only the first five observations...")
print("Number of rows in the data set =", len(assigned_team_df))
```

	game_id	year_id	fran_id	pts	opp_pts	elo_n	opp_elo_n	game_location	game_result
0	199511030CHI	1996	Bulls	105	91	1598.2924	1531.7449	H	W
1	199511040CHI	1996	Bulls	107	85	1604.3940	1458.6415	H	W
2	199511070CHI	1996	Bulls	117	108	1605.7983	1310.9349	H	W
3	199511090CLE	1996	Bulls	106	88	1618.8701	1452.8268	A	W
4	199511110CHI	1996	Bulls	110	106	1621.1591	1490.2861	H	W

```
printed only the first five observations...
Number of rows in the data set = 246
```

Step 2: Pick Your Team

In this step, you will pick your team. The range of years that you will study for your team is **2013-2015**. Make the following edits to the code block below:

1. Replace **??TEAM??** with your choice of team from one of the following team names.

Bucks, Bulls, Cavaliers, Celtics, Clippers, Grizzlies, Hawks, Heat, Jazz, Kings, Knicks, Lakers, Magic, Mavericks, Nets, Nuggets, Pacers, Pelicans, Pistons, Raptors, Rockets, Sixers, Spurs, Suns, Thunder, Timberwolves, Trailblazers, Warriors, Wizards

Remember to enter the team name within single quotes. For example, if you picked the Suns, then **??TEAM??** should be replaced with 'Suns'.

After you are done with your edits, click the block of code below and hit the **Run** button above.

```
In [2]: # Range of years: 2013-2015 (Note: The line below selects ALL teams within the three
your_years_leagues_df = nba_orig_df[(nba_orig_df['year_id'].between(2013, 2015))]

# The dataframe for your team is called your_team_df.
# ---- TODO: make your edits here ----
your_team_df = your_years_leagues_df[(your_years_leagues_df['fran_id']=='Pistons')]
your_team_df = your_team_df.reset_index(drop=True)

display(HTML(your_team_df.head().to_html()))
print("printed only the first five observations...")
print("Number of rows in the data set =", len(your_team_df))
```

	game_id	year_id	fran_id	pts	opp_pts	elo_n	opp_elo_n	game_location	game_resu
0	201210310DET	2013	Pistons	96	105	1420.1541	1512.0774	H	
1	201211020PHO	2013	Pistons	89	92	1417.8512	1523.5597	A	
2	201211040LAL	2013	Pistons	79	108	1409.0566	1527.5927	A	
3	201211060DEN	2013	Pistons	97	109	1405.2476	1558.2765	A	
4	201211070SAC	2013	Pistons	103	105	1402.0664	1411.2153	A	

printed only the first five observations...

Number of rows in the data set = 246

Step 3: Data Visualization: Points Scored by Your Team

The coach has requested that you provide a visual that shows the distribution of points scored by your team in the years 2013-2015. The code below provides two possible options. Pick **ONE** of these two plots to include in your summary report. Choose the plot that you think provides the best visual for the distribution of points scored by your team. In your summary report, you must explain why you think your visual is the best choice.

Click the block of code below and hit the **Run** button above.

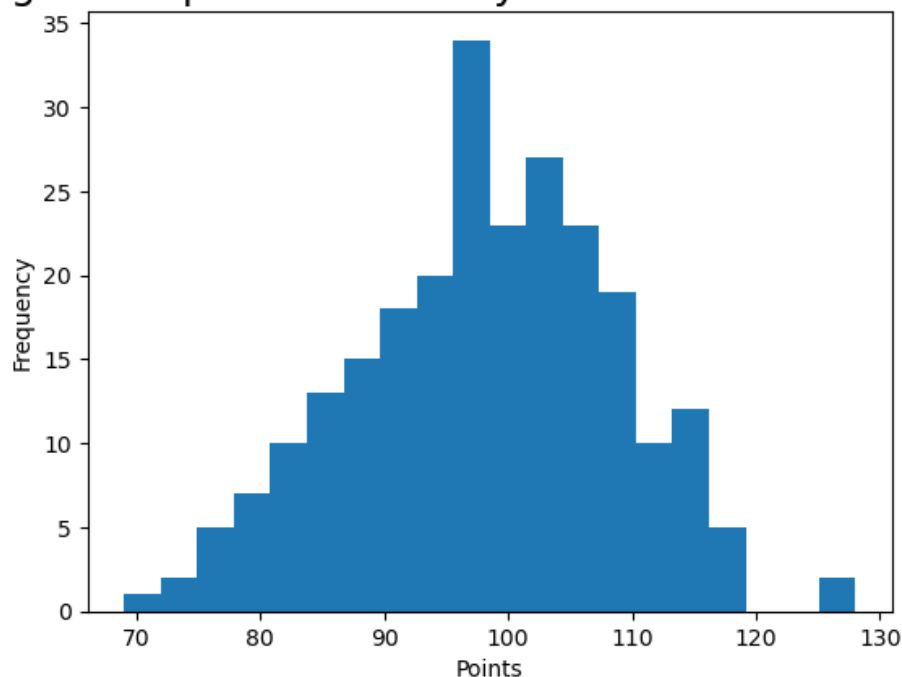
NOTE: If the plots are not created, click the code section and hit the **Run** button again.

In [3]: `import seaborn as sns`

```
# Histogram
fig, ax = plt.subplots()
plt.hist(your_team_df['pts'], bins=20)
plt.title('Histogram of points scored by Your Team in 2013 to 2015', fontsize=18)
ax.set_xlabel('Points')
ax.set_ylabel('Frequency')
plt.show()
print("")

# Scatterplot
#plt.title('Scatterplot of points scored by Your Team in 2013 to 2015', fontsize=18)
#sns.regplot(x=your_team_df['year_id'], y=your_team_df['pts'], ci=None)
#plt.show()
```

Histogram of points scored by Your Team in 2013 to 2015



Step 4: Data Visualization: Points Scored by the Assigned Team

The coach has also requested that you provide a visual that shows a distribution of points scored by the Bulls from years 1996-1998. The code below provides two possible options. Pick **ONE** of these two plots to include in your summary report. Choose the plot that you think provides the best visual for the distribution of points scored by your team. In your summary report, you will explain why you think your visual is the best choice.

Click the block of code below and hit the **Run** button above.

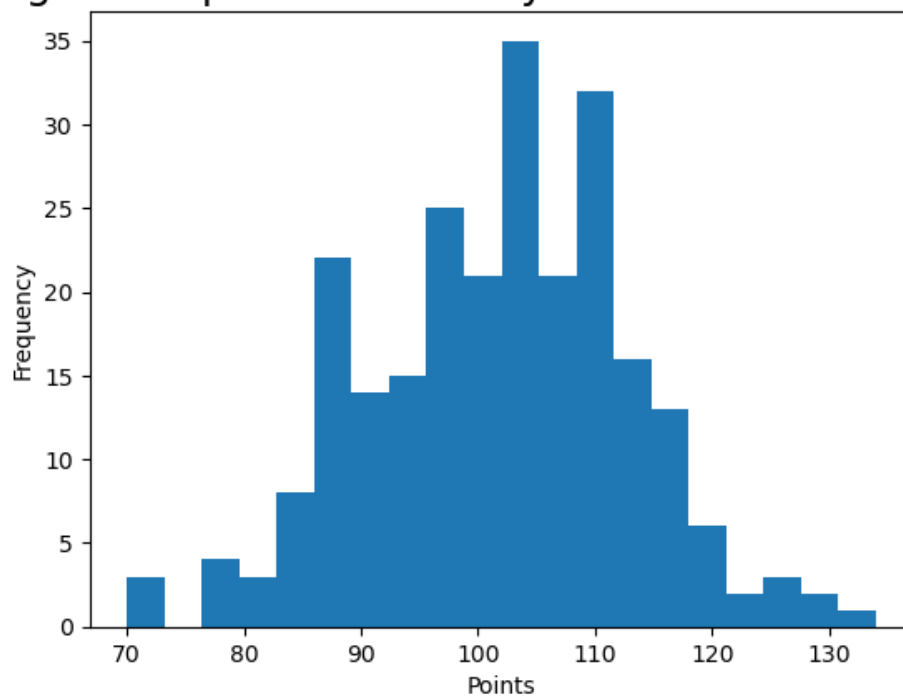
NOTE: If the plots are not created, click the code section and hit the **Run** button again.

In [4]: `import seaborn as sns`

```
# Histogram
fig, ax = plt.subplots()
plt.hist(assigned_team_df['pts'], bins=20)
plt.title('Histogram of points scored by the Bulls in 1996 to 1998', fontsize=18)
ax.set_xlabel('Points')
ax.set_ylabel('Frequency')
plt.show()

# Scatterplot
#plt.title('Scatterplot of points scored by the Bulls in 1996 to 1998', fontsize=18)
#sns.regplot(x=assigned_team_df['year_id'], y=assigned_team_df['pts'], ci=None)
#plt.show()
```

Histogram of points scored by the Bulls in 1996 to 1998



Step 5: Data Visualization: Comparing the Two Teams

Now the coach wants you to prepare one plot that provides a visual of the differences in the distribution of points scored by the assigned team and your team. The code below provides two possible visuals. Choose the plot that allows for the best comparison of the data distributions.

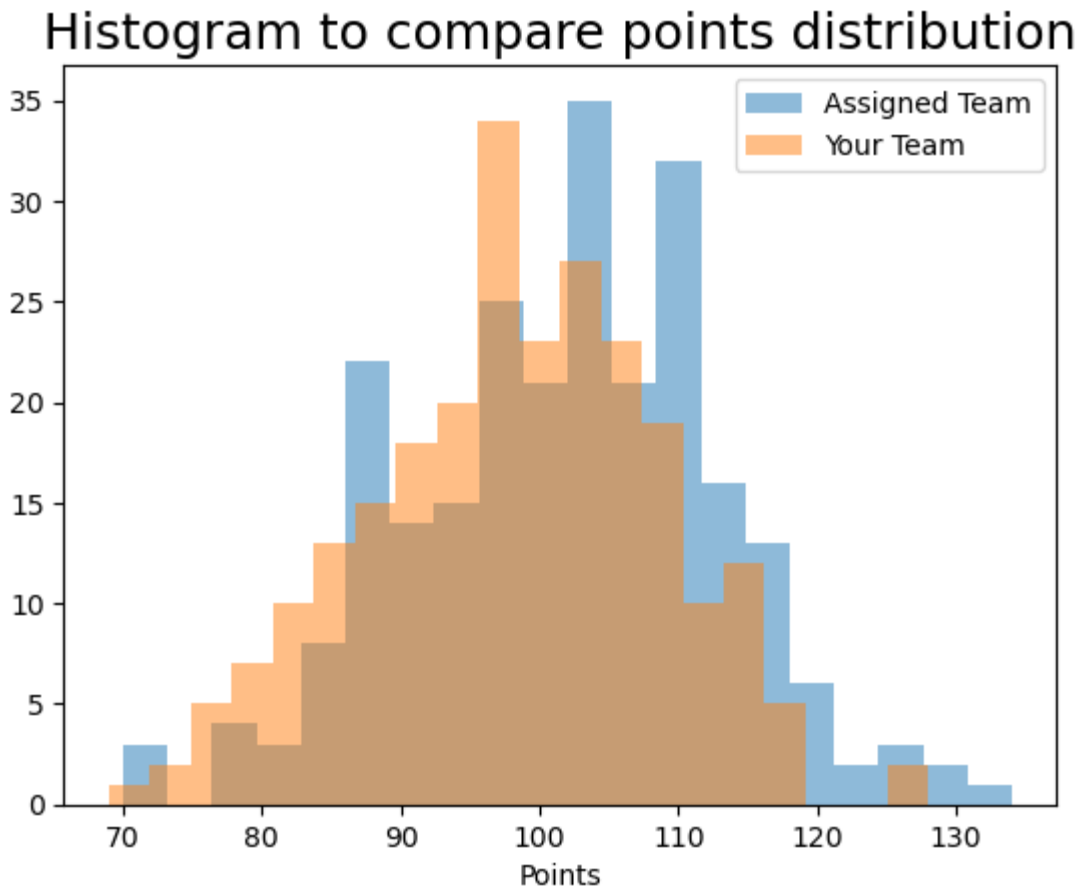
Click the block of code below and hit the **Run** button above.

NOTE: If the plots are not created, click the code section and hit the **Run** button again.

```
In [5]: import seaborn as sns

# Side-by-side boxplots
#both_teams_df = pd.concat((assigned_team_df, your_team_df))
#plt.title('Boxplot to compare points distribution', fontsize=18)
#sns.boxplot(x='fran_id',y='pts',data=both_teams_df)
#plt.show()
#print("")

# Histograms
fig, ax = plt.subplots()
plt.hist(assigned_team_df['pts'], 20, alpha=0.5, label='Assigned Team')
plt.hist(your_team_df['pts'], 20, alpha=0.5, label='Your Team')
plt.title('Histogram to compare points distribution', fontsize=18)
plt.xlabel('Points')
plt.legend(loc='upper right')
plt.show()
```



Step 6: Descriptive Statistics: Points Scored By Your Time in Home Games

The management of your team wants you to run descriptive statistics on the points scored by your team in the games played at your team's venue in 2013-2015. Calculate descriptive statistics including the mean, median, variance, and standard deviation for points scored by your team played at Home. Make the following edits to the code block below:

1. Replace **??MEAN_FUNCTION??** with the name of Python function that calculates the mean.
2. Replace **??MEDIAN_FUNCTION??** with the name of Python function that calculates the median.
3. Replace **??VAR_FUNCTION??** with the name of Python function that calculates the variance.
4. Replace **??STD_FUNCTION??** with the name of Python function that calculates the standard deviation.

After you are done with your edits, click the block of code below and hit the **Run** button above.

```
In [6]: print("Points Scored by Your Team in Home Games (2013 to 2015)")
print("-----")

your_team_home_df = your_team_df[your_team_df['game_location']=='H'].copy()

# ---- TODO: make your edits here ----
mean = your_team_home_df['pts'].mean()
median = your_team_home_df['pts'].median()
variance = your_team_home_df['pts'].var()
stdeviation = your_team_home_df['pts'].std()

print('Mean =', round(mean,2))
print('Median =', round(median,2))
print('Variance =', round(variance,2))
print('Standard Deviation =', round(stdeviation,2))
```

```
Points Scored by Your Team in Home Games (2013 to 2015)
-----
Mean = 99.48
Median = 99.0
Variance = 118.55
Standard Deviation = 10.89
```

Step 7 - Descriptive Statistics - Points Scored By Your Time in Away Games

The management also wants you to run descriptive statistics on the points scored by your team in games played at opponent's venue (Away) in 2013-2015. They want you to analyze measures of central tendency (e.g. mean, median) and measures of spread (e.g. standard deviation) in explaining if the team is doing better in Home games compared to Away games. Calculate descriptive statistics including the mean, median, variance, and standard deviation for points scored by your team played in opponent's venue (Away). Make the following edits to the code block below:

You are to write this code block yourself.

Use Step 6 to help you write this code block. Here is some information that will help you write this code block.

1. Since you are calculating statistics for games played at opponent's venue, `game_location` variable should be set to 'A'.
2. Functions for all statistics are the same as those in step 6.
3. Your statistics should be rounded to two decimal places.

Write your code in the code block section below. After you are done, click this block of code and hit the **Run** button above. Reach out to your instructor if you need more help with this step.


```
In [7]: print("Points Scored by Your Team in Away Games (2013 to 2015)")
print("-----")

your_team_away_df = your_team_df[your_team_df['game_location']=='A'].copy()

# Descriptive Statistics
mean = your_team_away_df['pts'].mean()
median = your_team_away_df['pts'].median()
variance = your_team_away_df['pts'].var()
stdeviation = your_team_away_df['pts'].std()

print('Mean =', round(mean,2))
print('Median =', round(median,2))
print('Variance =', round(variance,2))
print('Standard Deviation =', round(stdeviation,2))
```

```
Points Scored by Your Team in Away Games (2013 to 2015)
-----
Mean = 96.89
Median = 98.0
Variance = 107.38
Standard Deviation = 10.36
```

Step 8: Confidence Intervals for the Average Relative Skill of All Teams in Your Team's Years

The management wants you to calculate a 95% confidence interval for the average relative skill of all teams in 2013-2015. You will use the variable 'elo_n' to represent the relative skill of the teams. To construct a confidence interval, you will need the mean and standard error of the relative skill level in these years. The code block below calculates the mean and the standard deviation. Your edits will calculate the standard error and the confidence interval. Make the following edits to the code block below:

1. Replace **??SD_VARIABLE??** with the variable name representing the standard deviation of relative skill of all teams from your years. (Hint: the *standard deviation* variable is in the code block below)
2. Replace **??CL??** with the confidence level of the confidence interval.
3. Replace **??MEAN_VARIABLE??** with the variable name representing the mean relative skill of all teams from your years. (Hint: the *mean* variable is in the code block below)
4. Replace **??SE_VARIABLE??** with the variable name representing the standard error. (Hint: the *standard error* variable is in the code block below)

The management also wants you to calculate the probability that a team in the league has a relative skill level less than that of the team that you picked. Assuming that the relative skill of teams is Normally distributed, Python methods for a Normal distribution can be used to answer this question. The code block below uses two of these Python methods. Your task is to identify the correct Python method and report the probability.

After you are done with your edits, click the block of code below and hit the **Run** button above.

```
In [8]: print("Confidence Interval for Average Relative Skill in the years 2013 to 2015")
print("-----")

# Mean relative skill of all teams from the years 2013-2015
mean = your_years_leagues_df['elo_n'].mean()

# Standard deviation of the relative skill of all teams from the years 2013-2015
stdev = your_years_leagues_df['elo_n'].std()

n = len(your_years_leagues_df)

#Confidence interval
# ---- TODO: make your edits here ----
stderr = stdev/(n ** 0.5)
conf_int_95 = st.norm.interval(0.95, mean, stdev)

print("95% confidence interval (unrounded) for Average Relative Skill (ELO) in the years 2013 to 2015")
print("95% confidence interval (rounded) for Average Relative Skill (ELO) in the years 2013 to 2015")

print("\n")
print("Probability a team has Average Relative Skill LESS than the Average Relative Skill in the years 2013 to 2015")
print("-----")

mean_elo_your_team = your_team_df['elo_n'].mean()

choice1 = st.norm.sf(mean_elo_your_team, mean, stdev)
choice2 = st.norm.cdf(mean_elo_your_team, mean, stdev)

# Pick the correct answer.
print("Which of the two choices is correct?")
#print("Choice 1 =", round(choice1,4))
print("Choice 2 =", round(choice2,4))
```

Confidence Interval for Average Relative Skill in the years 2013 to 2015

95% confidence interval (unrounded) for Average Relative Skill (ELO) in the years 2013 to 2015

95% confidence interval (rounded) for Average Relative Skill (ELO) in the years 2013 to 2015

Probability a team has Average Relative Skill LESS than the Average Relative Skill in the years 2013 to 2015

Which of the two choices is correct?

Choice 2 = 0.1931

Step 9 - Confidence Intervals for the Average Relative Skill of All Teams in the Assigned Team's Years

The management also wants to you to calculate a 95% confidence interval for the average relative skill of all teams in the years 1996-1998. Calculate this confidence interval.

You are to write this code block yourself.

Use Step 8 to help you write this code block. Here is some information that will help you write this code block. Reach out to your instructor if you need help.

1. The dataframe for the years 1996-1998 is called `assigned_years_league_df`
2. The variable `'elo_n'` represents the relative skill of teams.
3. Start by calculating the mean and the standard deviation of relative skill (ELO) in years 1996-1998.
4. Calculate `n` that represents the sample size.
5. Calculate the standard error which is equal to the standard deviation of Relative Skill (ELO) divided by the square root of the sample size `n`.
6. Assuming that the population standard deviation is known, use Python methods for the Normal distribution to calculate the confidence interval.
7. Your statistics should be rounded to two decimal places.

The management also wants you to calculate the probability that a team had a relative skill level less than the Bulls in years 1996-1998. Assuming that the relative skill of teams is Normally distributed, calculate this probability.

You are to write this code block yourself.

Use Step 8 to help you write this code block. Here is some information that will help you write this code block.

1. Calculate the mean relative skill of the Bulls. Note that the dataframe for the Bulls is called `assigned_team_df`. The variable `'elo_n'` represents the relative skill.
2. Use Python methods for a Normal distribution to calculate this probability.
3. The probability value should be rounded to four decimal places.

Write your code in the code block section below. After you are done, click this block of code and hit the **Run** button above. Reach out to your instructor if you need more help with this step.

```
In [9]: assigned_years_league_df.head(10)
```

Out[9]:

	game_id	year_id	fran_id	pts	opp_pts	elo_n	opp_elo_n	game_location	gam
76084	199511030ATL	1996	Pacers	111	106	1603.6818	1508.0967	A	
76085	199511030ATL	1996	Hawks	106	111	1508.0967	1603.6818	H	
76086	199511030BOS	1996	Bucks	101	100	1438.2195	1464.7432	A	
76087	199511030BOS	1996	Celtics	100	101	1464.7432	1438.2195	H	
76088	199511030CHI	1996	Pelicans	91	105	1531.7449	1598.2924	A	
76089	199511030CHI	1996	Bulls	105	91	1598.2924	1531.7449	H	
76090	199511030DET	1996	Knicks	106	100	1605.9930	1365.7269	A	
76091	199511030DET	1996	Pistons	100	106	1365.7269	1605.9930	H	
76092	199511030HOU	1996	Rockets	110	92	1628.2434	1392.5458	H	
76093	199511030HOU	1996	Warriors	92	110	1392.5458	1628.2434	A	

In [10]:

```

print("Confidence Interval for Average Relative Skill in the years 1996 to 1998")
print("-----")

# Mean relative skill of all teams from the years 1996-1998
mean = assigned_years_league_df['elo_n'].mean()

# Standard deviation of the relative skill of all teams from the years 1996-1998
stdev = assigned_years_league_df['elo_n'].std()

# Length or size of dataframe, storing number of lines to n.
n = len(assigned_years_league_df)

#Confidence interval
stderr = stdev/(n ** 0.5)
conf_int_95 = st.norm.interval(0.95, mean, stdev)

print("95% confidence interval (unrounded) for Average Relative Skill (ELO) in the years 1996 to 1998")
print("95% confidence interval (rounded) for Average Relative Skill (ELO) in the years 1996 to 1998")
print("")

print("Probability that a team had a relative skill level LESS than the Bulls in years 1996 to 1998")
print("-----")

mean_elo_assigned_team = assigned_team_df['elo_n'].mean()
assigned_cdf = st.norm.cdf(mean_elo_assigned_team, mean, stdev)

print("Probablility is =", round(assigned_cdf,4))

```

Confidence Interval for Average Relative Skill in the years 1996 to 1998

95% confidence interval (unrounded) for Average Relative Skill (ELO) in the years 1996 to 1998: 1471.35347, 1743.6167714232652)

95% confidence interval (rounded) for Average Relative Skill (ELO) in the years 1996 to 1998: 1471.35, 1743.62)

Probability that a team had a relative skill level LESS than the Bulls in years 1996 to 1998:

Probablility is = 0.9732

End of Project One

Download the HTML output and submit it with your summary report for Project One. The HTML output can be downloaded by clicking **File**, then **Download as**, then **HTML**. Do not include the Python code within your summary report.