

```

# Import the required libraries
import requests
import time
import pandas as pd
from bs4 import BeautifulSoup
from selenium import webdriver
from selenium.webdriver.common.by import By
from selenium.webdriver.common.keys import Keys

# Create empty lists to store the user data such as Name, City, Date
# of Purchase, Review & Rating
Names = []
Cities = []
Dates = []
Reviews = []
Ratings = []

# url of the flipkart website to scrape data
url = "https://www.flipkart.com/apple-iphone-15-blue-128-gb/product-reviews/itmbf14ef54f645d?pid=MOBGTAGPAQNVFZZY&lid=LSTM0BGTAGPAQNVFZZYQRLPCQ&marketplace=FLIPKART"

driver = webdriver.Chrome()
driver.get(url)

while len(Names) < 320:

    time.sleep(2)
    soup = BeautifulSoup(driver.page_source, "html.parser")

    # Extract names
    names_elements= soup.find_all("p", {"class": "_2NsDsF AwS1CA"})
    for name in names_elements:
        Names.append(name.text)

    # Extract cities
    city_elements = soup.find_all("p", {"class": "MztJPv"})
    for city in city_elements:
        Cities.append(city.text)

    # Extract dates
    dates_elements = soup.find_all("p", {"class": "_2NsDsF"})
    for date in dates_elements:
        Dates.append(date.text)
    Actual_Dates = Dates[1::2]

    # Extract reviews
    reviews_elements = soup.find_all("div", {"class": "ZmyHeo"})
    for review in reviews_elements:

```

```

Reviews.append(review.text)

# Extract ratings
ratings_elements = soup.find_all("div", class_ = "XQDdHH Ga3i8K")
for ratings in ratings_elements:
    Ratings.append(ratings.text)

# Try to click the "Next" button
try:
    next_button = driver.find_element(By.XPATH,
    "//span[text()='Next']")
    next_button.click()
    time.sleep(5)
except:
    break

# Combine data into a DataFrame
df = pd.DataFrame({
    "Name": Names[:-1],
    "City": Cities[:-1],
    "Date": Actual_Dates[:-1],
    "Review": Reviews[:-1],
    "Ratings": Ratings
})

```

```

# Check the basic information
df.info()

```

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 323 entries, 0 to 322
Data columns (total 5 columns):
#   Column      Non-Null Count  Dtype
---  -
0   Name        323 non-null   object
1   City        323 non-null   object
2   Date        323 non-null   object
3   Review      323 non-null   object
4   Ratings     323 non-null   int64
dtypes: int64(1), object(4)
memory usage: 12.7+ KB

```

```

# Delete the duplicates from the dataframe
df1 = df.copy()
df1 = df1.drop_duplicates()
df1

```

	Name	City	
Date \			
0	Akshay Meena	Certified Buyer, Jaipur	Nov,
2023			
1	Mousam Guha Roy	Certified Buyer, Matialihat	Oct,

```

2023
2    bijaya mohanty    Certified Buyer, Baleshwar    6 months
ago
3    Prithivi Boruah    Certified Buyer, Bokajan    Oct,
2023
4    Ajin V    Certified Buyer, Balaghat    Oct,
2023
..    ...    ...
..
317    aditya verma    Certified Buyer, Khairagarh    10 months
ago
319    Devjyoti Das    Certified Buyer, Dhubri    10 months
ago
320    manish choudhary    Certified Buyer, Udaipur    11 months
ago
321    Rahul Saini    Certified Buyer, Gangapur City    11 months
ago
322    Prashanth r    Certified Buyer, Chittoor District    11 months
ago

                                Review  Ratings
0    So beautiful, so elegant, just a vowww😊♥READ ...    5
1                                Very niceREAD MORE    4
2    Just go for it.Amazing one.Beautiful camera wi...    5
3    Camera Quality Is Improved Loving ItREAD MORE    5
4                                High quality camera😊READ MORE    5
..                                ...    ...
317    Most value for money iPhone ever.READ MORE    5
319    Amazing phone just no words to say...just one ...    5
320    I was sceptical at first about moving form an ...    5
321                                Loved itREAD MORE    5
322    Awesome picturesREAD MORE    5

```

[304 rows x 5 columns]

*# Convert the Name column data to Title Case*

```

df1['Name'] = df1['Name'].str.title()
df1.head()

```

```

      Name    City    Date \
0    Akshay Meena    Certified Buyer, Jaipur    Nov, 2023
1    Mousam Guha Roy    Certified Buyer, Matialihat    Oct, 2023
2    Bijaya Mohanty    Certified Buyer, Baleshwar    6 months ago
3    Prithivi Boruah    Certified Buyer, Bokajan    Oct, 2023
4    Ajin V    Certified Buyer, Balaghat    Oct, 2023

                                Review  Ratings
0    So beautiful, so elegant, just a vowww😊♥READ ...    5
1                                Very niceREAD MORE    4
2    Just go for it.Amazing one.Beautiful camera wi...    5

```

3	Camera Quality Is Improved Loving It	READ MORE	5
4	High quality camera😊	READ MORE	5

```
# Cleaning the data of city column by removing unnecessary data
df1['City'] = df1['City'].str.replace("Certified Buyer, ", "",
regex=False).str.strip()
df1.head()
```

	Name	City	Date \
0	Akshay Meena	Jaipur	Nov, 2023
1	Mousam Guha Roy	Matialihat	Oct, 2023
2	Bijaya Mohanty	Baleshwar	6 months ago
3	Prithivi Boruah	Bokajan	Oct, 2023
4	Ajin V	Balaghat	Oct, 2023

	Review	Ratings
0	So beautiful, so elegant, just a vowww😊♥	5
1	Very nice	4
2	Just go for it.Amazing one.Beautiful camera wi...	5
3	Camera Quality Is Improved Loving It	5
4	High quality camera😊	5

```
# Cleaning data of Review column by removing unnecessary data &
converting to lowercase
df1['Review'] = df1['Review'].str.lower().str.replace("read more", "",
regex=False)
df1head()
```

	Name	City	Date \
0	Akshay Meena	Jaipur	Nov, 2023
1	Mousam Guha Roy	Matialihat	Oct, 2023
2	Bijaya Mohanty	Baleshwar	6 months ago
3	Prithivi Boruah	Bokajan	Oct, 2023
4	Ajin V	Balaghat	Oct, 2023

	Review	Ratings
0	so beautiful, so elegant, just a vowww😊♥	5
1	very nice	4
2	just go for it.amazing one.beautiful camera wi...	5
3	camera quality is improved loving it	5
4	high quality camera😊	5

```
# Import libraries for Sentimental analysis of review sentences
import nltk
from nltk.corpus import stopwords
from nltk.tokenize import sent_tokenize
from nltk.tokenize import word_tokenize
from textblob import TextBlob
import string

nltk.download('stopwords')
```

```

nltk.download('punkt')
nltk.download('wordnet')

```

```

[nltk_data] Downloading package stopwords to
[nltk_data] C:\Users\ethen\AppData\Roaming\nltk_data...
[nltk_data] Package stopwords is already up-to-date!
[nltk_data] Downloading package punkt to
[nltk_data] C:\Users\ethen\AppData\Roaming\nltk_data...
[nltk_data] Package punkt is already up-to-date!
[nltk_data] Downloading package wordnet to
[nltk_data] C:\Users\ethen\AppData\Roaming\nltk_data...
[nltk_data] Package wordnet is already up-to-date!

```

True

*# Create a column called Reviews\_t that stores tokenized sentences from the Review column using the sent\_tokenize function.*

```

df1["Reviews_t"] = df1['Review'].apply(sent_tokenize)
df1

```

	Name	City	Date \
0	Akshay Meena	Jaipur	Nov, 2023
1	Mousam Guha Roy	Matialihat	Oct, 2023
2	Bijaya Mohanty	Baleswar	6 months ago
3	Prithivi Boruah	Bokajan	Oct, 2023
4	Ajin V	Balaghat	Oct, 2023
...	...	...	...
317	Aditya Verma	Khairagarh	10 months ago
319	Devjyoti Das	Dhubri	10 months ago
320	Manish Choudhary	Udaipur	11 months ago
321	Rahul Saini	Gangapur City	11 months ago
322	Prashanth R	Chittoor District	11 months ago

	Review	Ratings \
0	so beautiful, so elegant, just a vowww😊❤	5
1	very nice	4
2	just go for it.amazing one.beautiful camera wi...	5
3	camera quality is improved loving it	5
4	high quality camera😊	5
...	...	...
317	most value for money iphone ever.	5
319	amazing phone just no words to say...just one ...	5
320	i was sceptical at first about moving form an ...	5
321	loved it	5
322	awesome pictures	5

	Reviews_t
0	[so beautiful, so elegant, just a vowww😊❤]
1	[very nice]
2	[just go for it.amazing one.beautiful camera w...

```

3          [camera quality is improved loving it]
4          [high quality camera😊]
..          ...
317         [most value for money iphone ever.]
319 [amazing phone just no words to say...just one...
320 [i was sceptical at first about moving form an...
321         [loved it]
322         [awesome pictures]

[304 rows x 6 columns]

# Import mean from statistics
from statistics import mean

# Function created for assigning Polarity to the Reviews_t column
def get_polarity(sentences):
    return [TextBlob(sentence).sentiment.polarity for sentence in
sentences]

# Apply the get_polarity function to the Reviews_t column to calculate
and assign polarity values
df1['Polarity'] = df1['Reviews_t'].apply(get_polarity)

# function is designed to compute the average polarity of each review
by calculating the mean polarity of all sentences within the review
def calculate_average_polarity(polarities):
    return mean(polarities) if polarities else 0

# Calculates and shows the overall average polarity score for all the
reviews in the dataset
df1['Average_Polarity'] =
df1['Polarity'].apply(calculate_average_polarity)
df1['Average_Polarity'] = df1['Average_Polarity'].round(2)
df1.head(10)

```

	Name	City	Date \
0	Akshay Meena	Jaipur	Nov, 2023
1	Mousam Guha Roy	Matialihat	Oct, 2023
2	Bijaya Mohanty	Baleshwar	6 months ago
3	Prithivi Boruah	Bokajan	Oct, 2023
4	Ajin V	Balaghat	Oct, 2023
5	Sheetla Prasad Maurya	Sultanpur	Oct, 2023
6	Kriti Customer	Sarkaghat	10 months ago
7	Flipkart Customer	Aizawl	10 months ago
8	Nikhil Kumar	Meerut Division	10 months ago
9	Rahul Shedge	Satara	Oct, 2023

	Review	Ratings \
0	so beautiful, so elegant, just a vovww😊♥	5
1	very nice	4

2	just go for it.amazing one.beautiful camera wi...	5
3	camera quality is improved loving it	5
4	high quality camera😊	5
5	best mobile phonecamera quality is very nice b...	4
6	just loved the product , colour , design is wo...	5
7	awesome photography experience. battery backup...	5
8	switch from oneplus to iphone i am stunned wit...	5
9	totally happy!camera 5battery 5 display 5design 5	5

	Reviews_t	
Polarity \		
0	[so beautiful, so elegant, just a vowww😊♥]	
	[0.675]	
1	[very nice]	
	[0.78]	
2	[just go for it.amazing one.beautiful camera w...	
	[0.26666666666666666]	
3	[camera quality is improved loving it]	
	[0.6]	
4	[high quality camera😊]	
	[0.16]	
5	[best mobile phonecamera quality is very nice ...	
	[0.738]	
6	[just loved the product , colour , design is w...	
	[0.4125]	
7	[awesome photography experience., battery back...	[1.0, 0.7,
	0.5]	
8	[switch from oneplus to iphone i am stunned wi...	[0.0,
	1.0]	
9	[totally happy!camera 5battery 5 display 5desi...	
	[0.0]	

	Average_Polarity
0	0.68
1	0.78
2	0.27
3	0.60
4	0.16
5	0.74
6	0.41
7	0.73
8	0.50
9	0.00

```
# Function to assign the Class to the Polarity
def sentiment_class(polarity):
    if polarity > 0.75:
        return 'extremely positive'
    elif 0 < polarity <= 0.75:
        return 'positive'
```

```

elif polarity == 0:
    return 'neutral'
elif -0.75 <= polarity < 0:
    return 'negative'
else:
    return 'extremely negative'

```

*# Calls sentiment\_class function on the Average\_Polarity column to assign the sentiment class*

```

df1['Sentiment_Class'] =
df1['Average_Polarity'].apply(sentiment_class)

```

```
df1.head()
```

	Name	City	Date \
0	Akshay Meena	Jaipur	Nov, 2023
1	Mousam Guha Roy	Matialihat	Oct, 2023
2	Bijaya Mohanty	Baleshwar	6 months ago
3	Prithivi Boruah	Bokajan	Oct, 2023
4	Ajin V	Balaghat	Oct, 2023

	Review	Ratings \
0	so beautiful, so elegant, just a vovww😊♥	5
1	very nice	4
2	just go for it.amazing one.beautiful camera wi...	5
3	camera quality is improved loving it	5
4	high quality camera😊	5

	Reviews_t
Polarity \	
0	[so beautiful, so elegant, just a vovww😊♥]
	[0.675]
1	[very nice]
	[0.78]
2	[just go for it.amazing one.beautiful camera w...
	[0.26666666666666666]
3	[camera quality is improved loving it]
	[0.6]
4	[high quality camera😊]
	[0.16]

	Average_Polarity	Sentiment_Class
0	0.68	positive
1	0.78	extremely positive
2	0.27	positive
3	0.60	positive
4	0.16	positive

*# Calculates and prints the overall average polarity score of the entire dataset of reviews*

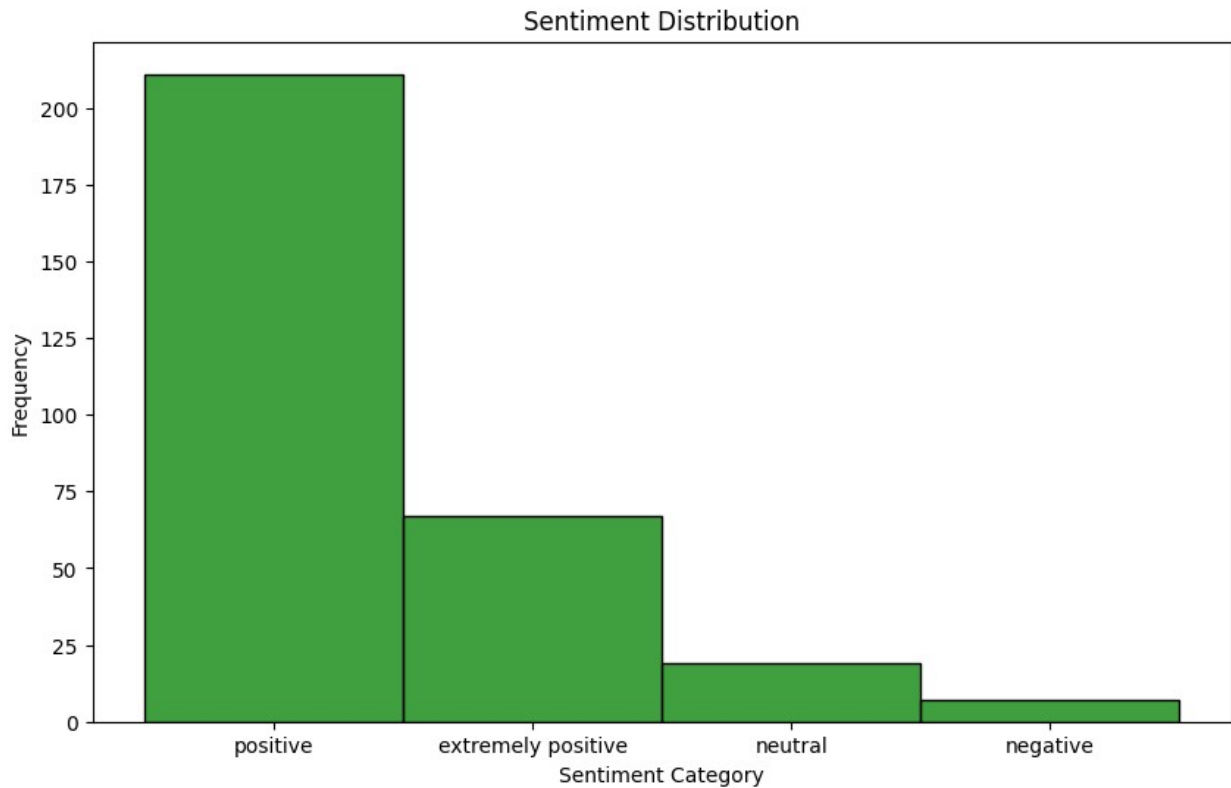


```
polarity_score = df1['Average_Polarity'].mean().round(2)
print(f'Average Polarity Score : {polarity_score}')
if polarity_score > 0.75:
    print('The Average Polarity Score is Extremely Positive')
elif 0 < polarity_score <= 0.75:
    print('The Average Polarity Score is Positive')
elif polarity_score == 0:
    print('The Average Polarity Score is Neutral')
elif -0.75 <= polarity_score < 0:
    print('The Average Polarity Score is Negative')
else:
    print('The Average Polarity Score is Extremely Negative')
```

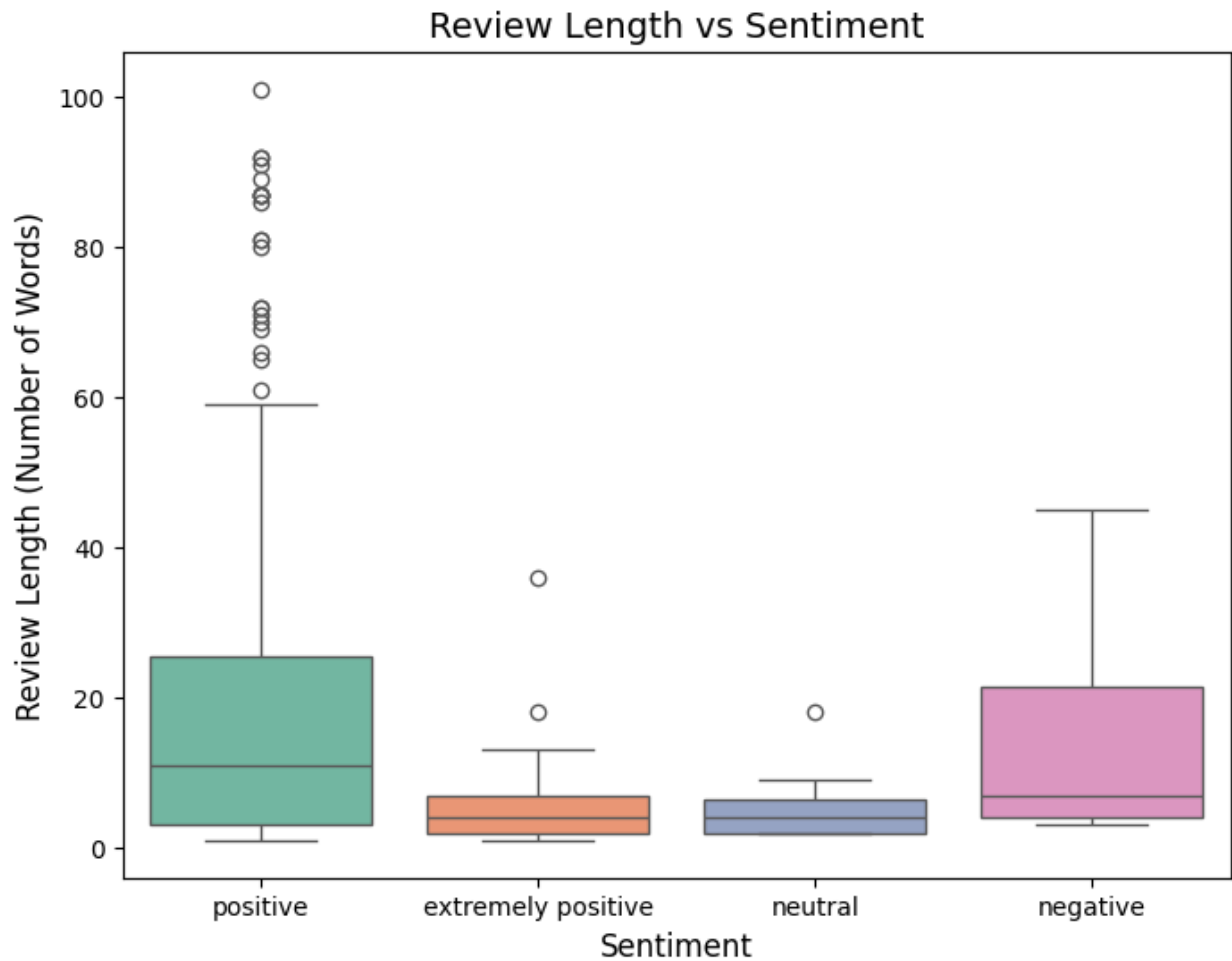
Average Polarity Score : 0.52  
The Average Polarity Score is Positive

```
# Imports libraries for visualisation
import matplotlib.pyplot as plt
import seaborn as sns

# Plots figure for Sentiment Distribution based on Sentiment Category
plt.figure(figsize=(10, 6))
sns.histplot(x=new_df1.Sentiment_Class, color='green')
plt.title('Sentiment Distribution')
plt.xlabel('Sentiment Category')
plt.ylabel('Frequency')
plt.xticks(rotation=0)
plt.show()
```



```
df1['Review_Length'] = df1['Review'].apply(lambda x: len(x.split()))  
  
# Box Plot for Review Length by Sentiment  
plt.figure(figsize=(8, 6))  
sns.boxplot(x='Sentiment_Class', y='Review_Length', data=df1, hue =  
            'Sentiment_Class', palette='Set2')  
plt.title('Review Length vs Sentiment', fontsize=14)  
plt.xlabel('Sentiment', fontsize=12)  
plt.ylabel('Review Length (Number of Words)', fontsize=12)  
plt.show()
```



```
# Plotting ratings vs average polarity
plt.figure(figsize=(10, 6))
sns.boxplot(x='Average_Polarity', y='Ratings', data = df1, hue =
'Average_Polarity', palette='coolwarm')
plt.title('Ratings vs Average Polarity')
plt.xlabel('Average Polarity')
plt.ylabel('Ratings')
plt.xticks(rotation=90)
plt.show()
```

