Analysis on Shopping Trends

EDA analysis by Salonee Jadhav

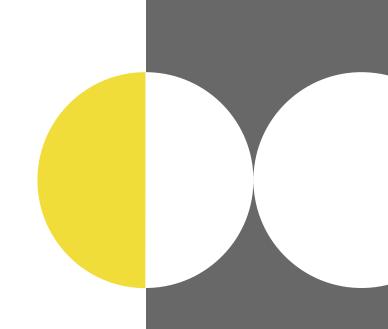
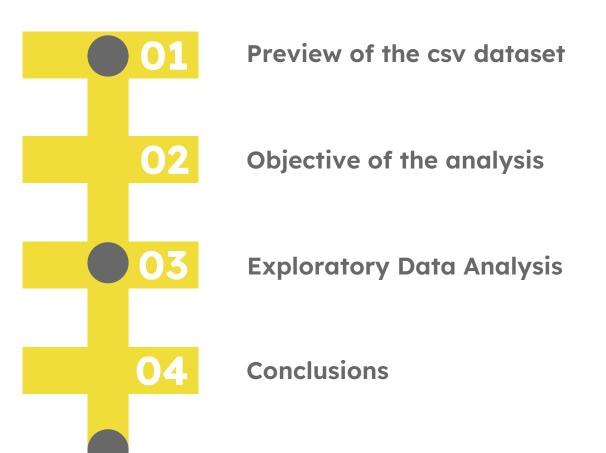
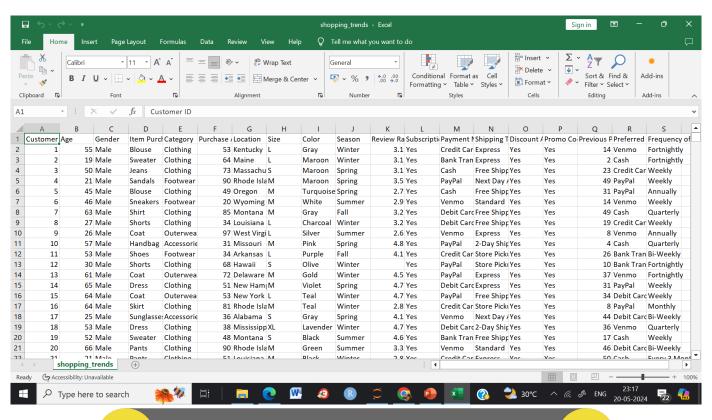


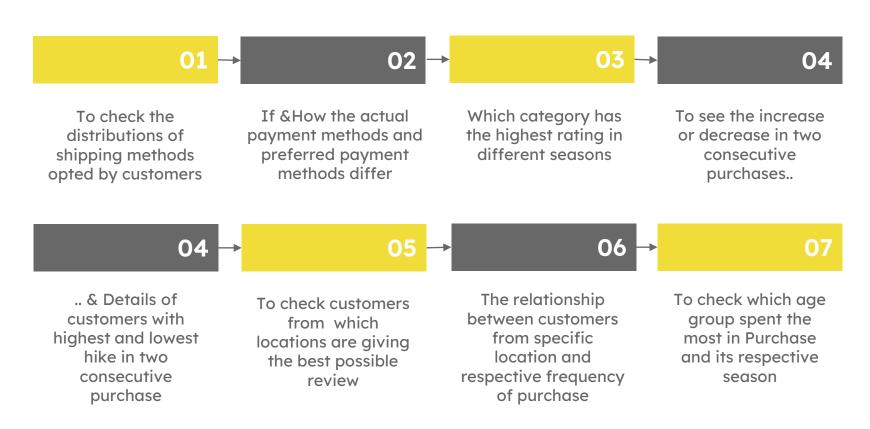
Table of contents



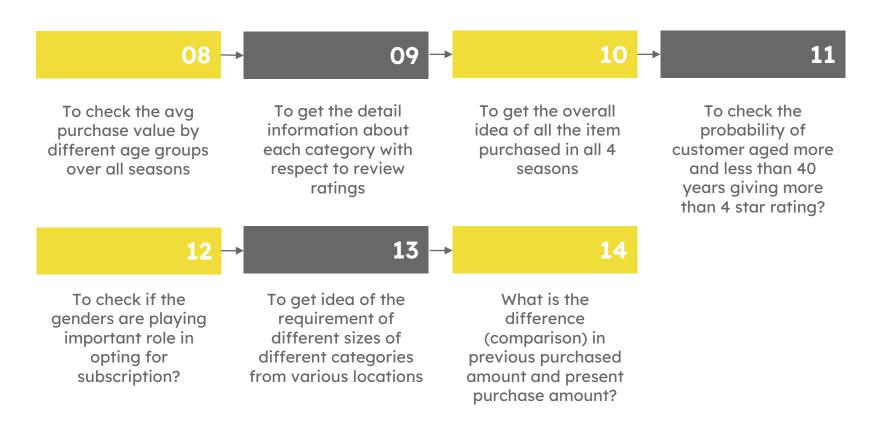
Dataset in the question:



Objectives:



Objectives:





EDA

Exploratory Data Analysis



import pandas as pd
import numpy as np
import seaborn as sns
import matplotlib.pyplot as plt
import plotly.express as px

df=pd.read_csv('C:/Users/Shubhangi/Desktop/shopping_trends.csv')

df.head()

	Customer ID	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	Location	Size	Color	Season	Review Rating	Subscription Status	Payment Method	Shipping Type	Discount Applied	Prom Cod Use
0	1	55.0	Male	Blouse	Clothing	53	Kentucky	L	Gray	Winter	3.1	Yes	Credit Card	Express	Yes	Υe
1	2	19.0	Male	Sweater	Clothing	64	Maine	L	Maroon	Winter	3.1	Yes	Bank Transfer	Express	Yes	Υe
2	3	50.0	Male	Jeans	Clothing	73	Massachusetts	S	Maroon	Spring	3.1	Yes	Cash	Free Shipping	Yes	Υe
3	4	21.0	Male	Sandals	Footwear	90	Rhode Island	М	Maroon	Spring	3.5	Yes	PayPal	Next Day Air	Yes	Υe
4	5	45.0	Male	Blouse	Clothing	49	Oregon	М	Turquoise	Spring	2.7	Yes	Cash	Free Shipping	Yes	Υe
4																-

df.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 3900 entries, 0 to 3899 Data columns (total 19 columns): Column Non-Null Count Dtype Customer ID 3900 non-null int64 3895 non-null float64 Age Gender 3900 non-null object Item Purchased 3900 non-null object 3900 non-null object Category Purchase Amount (USD) 3900 non-null int64 Location 3900 non-null object Size 3900 non-null object Color 3900 non-null object 3900 non-null object Season Review Rating 3885 non-null float64 Subscription Status 3900 non-null object Payment Method 3900 non-null object 3900 non-null object Shipping Type 3900 non-null object Discount Applied Promo Code Used 3900 non-null object 16 Previous Purchases 3897 non-null float64 Preferred Payment Method 3900 non-null object 18 Frequency of Purchases 3900 non-null obiect

dtypes: float64(3), int64(2), object(14)

memory usage: 579.0+ KB

df.describe()

	Customer ID	Age	Purchase Amount (USD)	Review Rating	Previous Purchases
count	3900.000000	3895.000000	3900.000000	3885.000000	3897.000000
mean	1950.500000	44.066239	59.764359	3.750991	25.351039
std	1125.977353	15.208489	23.685392	0.715858	14.449673
min	1.000000	18.000000	20.000000	2.500000	1.000000
25%	975.750000	31.000000	39.000000	3.100000	13.000000
50%	1950.500000	44.000000	60.000000	3.800000	25.000000
75%	2925.250000	57.000000	81.000000	4.400000	38.000000
max	3900.000000	70.000000	100.000000	5.000000	50.000000

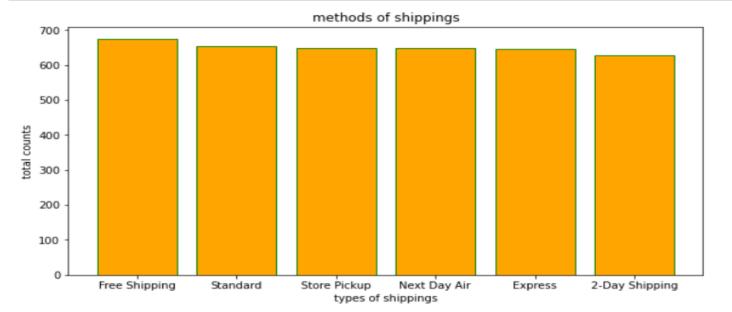
```
percentage missingval=(df.isna().sum()*100/len(df)).round(2)
percentage missingval
Customer ID
                            0.00
Age
                            0.13
Gender
                            0.00
Item Purchased
                            0.00
Category
                            0.00
                                            #filling null values
Purchase Amount (USD)
                            0.00
                                            m=df["Age"].median()
Location
                            0.00
                                            df['Age'] = df['Age'].fillna(m)
Size
                            0.00
Color
                            0.00
                                            m1=df["Review Rating"].median()
Season
                            0.00
                                            df['Review Rating'] = df['Review Rating'].fillna(m1)
Review Rating
                            0.38
Subscription Status
                            0.00
                                            m2=df["Previous Purchases"].median()
Payment Method
                            0.00
                                            df['Previous Purchases'] = df['Previous Purchases'].fillna(m2)
Shipping Type
                            0.00
Discount Applied
                            0.00
Promo Code Used
                            0.00
Previous Purchases
                            0.08
Preferred Payment Method
                            0.00
Frequency of Purchases
                            0.00
dtype: float64
```

```
(df.isna().sum()*100/len(df)).round(2)
Customer ID
                             0.0
                             0.0
Age
Gender
                             0.0
Item Purchased
                            0.0
                            0.0
Category
Purchase Amount (USD)
                            0.0
Location
                            0.0
Size
                            0.0
Color
                            0.0
Season
                            0.0
Review Rating
                            0.0
Subscription Status
                            0.0
Payment Method
                            0.0
Shipping Type
                            0.0
Discount Applied
                            0.0
Promo Code Used
                            0.0
Previous Purchases
                            0.0
Preferred Payment Method
                            0.0
Frequency of Purchases
                            0.0
dtype: float64
df.duplicated().sum()
0
```

```
import numpy
def outliers(col_df):
  q1=np.percentile(col df,25)
 q2=np.percentile(col_df,50)
 q3=np.percentile(col_df,75)
 igr=q3-q1
 upper=q3+1.5*iqr
 lower=q1-1.5*iqr
 ol=col df[(col df>upper) (col df<lower)]
 return bool(len(ol))
import numpy as np #no outliers founded
num col= df.select dtypes([int,float])
for col in num col:
 result= outliers(df[col])
 print(f'{col}:{result}')
Age:False
Review Rating:False
Previous Purchases:False
```

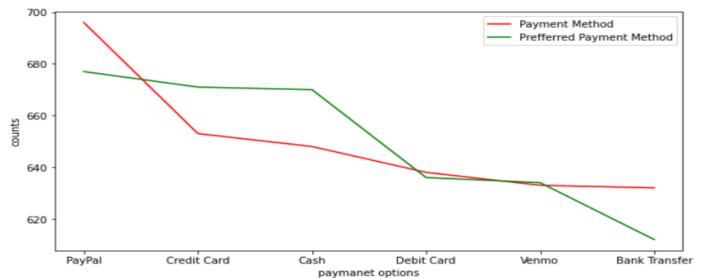
1. To check the distributions of shipping methods opted by customers

```
#To check the distributions of shipping methods opted by customers
shipping=df['Shipping Type'].value_counts()
plt.figure(figsize = (10,5))
plt.bar(shipping.index,shipping.values,color='orange',edgecolor='green')
plt.title("methods of shippings")
plt.xlabel("types of shippings")
plt.ylabel("total counts")
plt.show()
```



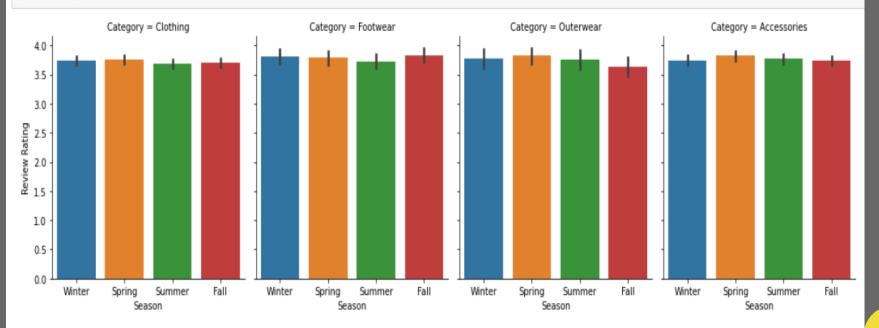
2. If &How the actual payment methods and preferred payment methods differ

```
#If &How the actual payment methods and preferred payment methods differ
pref1=df['Payment Method'].value_counts()
pref=df['Preferred Payment Method'].value_counts()
plt.figure(figsize = (10,5))
pref1.plot(color='r',label='Payment Method')
pref.plot(color='g',label='Prefferred Payment Method')
plt.ylabel("counts")
plt.xlabel("paymanet options")
plt.legend()
plt.show()
```



3.Which category has the highest rating in different seasons?

```
#Which category has the highest rating in different seasons
sns.catplot(data=df, x="Season", y="Review Rating",col="Category",kind='bar',height=4, aspect=.9)
plt.show()
```



4.To check the hike increase or decrease in two consecutive purchases & Details of customers with highest and lowest hike in two consecutive purchase

df.loc[[1496,2171,3394]]

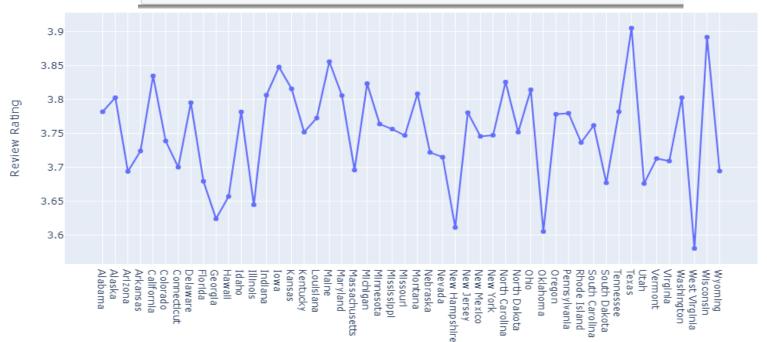
ı	Category	Purchase Amount (USD)	Location	Size	Color	Season	Review Rating	Subscription Status	Payment Method	Shipping Type	Discount Applied	Promo Code Used	Previous Purchases	Payment	Frequency of Purchases	Purchase Gap
t	Clothing	98	Idaho	М	Purple	Winter	5.0	No	Credit Card	Standard	Yes	Yes	9.0	Venmo	Bi-Weekly	988.89%
3	Clothing	98	Missouri	М	Yellow	Summer	4.6	No	Credit Card	Store Pickup	No	No	9.0	Cash	Fortnightly	988.89%
3	Footwear	98	Vermont	s	Yellow	Spring	4.2	No	Cash	Store Pickup	No	No	9.0	PayPal	Annually	988.89%
	•															+

4.To check the hike increase or decrease in two consecutive purchases & Details of customers with highest and lowest hike in two consecutive purchase

```
min(df['Purchase Gap'])
: '-10.0%'
  row index1 = df.index[df['Purchase Gap'] == '-10.0%'].tolist()
  print(row index1)
  [2917, 2967, 3602]
  df.loc[[2917, 2967, 3602]]
           Purchase
                                                                                                                                             Purchase
                                                     Review Subscription
                                                                         Payment Shipping
  Category
            Amount Location Size
                                                      Rating
              (USD)
                                                                                                       Used
                                                                                                                          Method Purchases
                                                                                      Store
                               XΙ
                                                         29
                                                                             Cash
                                                                                                  No
                                                                                                         Nο
   Clothina
                 45 Colorado
                                      White
                                              Winter
                                                                                                                   50.0
                                                                                                                           Venmo
                                                                                                                                    Annually
                                                                                                                                               -10.0%
                                                                                     Pickup
                                                                                                  No
                                                                                                         No
                                                                                                                   40.0
  Footwear
                       Indiana
                                      Silver Summer
                                                                                                                           Venmo
                                                                                                                                    Annually
                                                                                                                                               -10.0%
                                                                                    Shipping
                                                                             Bank
                                                                                      Store
                                                                                                  No
   Clothing
                                 S Magenta Summer
                                                                                                                                    Quarterly
                 36 Wyoming
                                                         3.3
                                                                                                                                               -10.0%
                                                                                     Pickup
```

5. To check customers from which locations are giving the best possible review

```
#Which location is giving the best possible review
df_rating=df.groupby('Location')['Review Rating'].mean().reset_index()
fig = px.line(df_rating, x='Location', y="Review Rating",markers=True)
fig.show()
```



6. The relationship between customers from specific location and respective frequency of purchase

```
#The relationship between customers from specific location and their frequency of purchase
df_corr=df.pivot_table(columns='Location',index='Frequency of Purchases',aggfunc='size')
plt.figure(figsize = (20,7))
sns.heatmap(df_corr,fmt='d',annot=True,cmap='coolwarm') #annot dsplays the data values
plt.show()
```

- 22.5

- 20.0

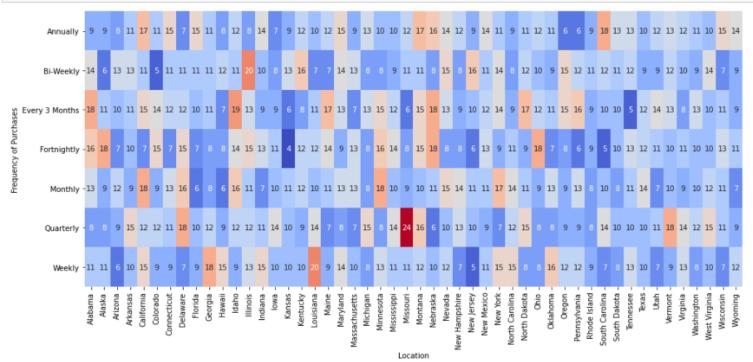
- 17.5

- 15.0

- 12.5

- 10.0

- 7.5



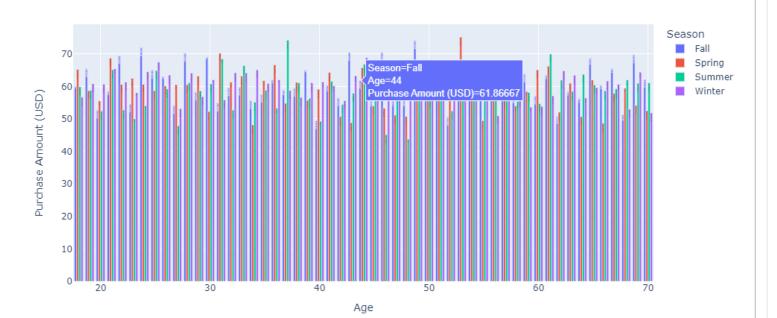
7. To check which age group spent the most in Purchase and its respective season

```
#To check which age group spent the most in Purchase and its respective season
season wiseitem=df.groupby(['Season','Age'])["Purchase Amount (USD)"].mean().reset index()
#for summer season
s=season wiseitem.loc[season wiseitem['Season'] == 'Summer']
s.loc[s['Purchase Amount (USD)'].idxmax()]
Season
                          Summer
Age
                              37
Purchase Amount (USD)
                         74.2222
Name: 125, dtype: object
#for winter season
w=season wiseitem.loc[season wiseitem['Season'] == 'Winter']
w.loc[w['Purchase Amount (USD)'].idxmax()]
Season
                          Winter
                              44
Age
Purchase Amount (USD)
                         68.8125
Name: 185, dtype: object
#for fall
f=season wiseitem.loc[season wiseitem['Season'] == 'Fall']
f.loc[f['Purchase Amount (USD)'].idxmax()]
                            Fall.
Season
Age
                              49
Purchase Amount (USD)
                         74.0833
Name: 31, dtype: object
#for spring
sp=season wiseitem.loc[season wiseitem['Season'] == 'Spring']
sp.loc[sp['Purchase Amount (USD)'].idxmax()]
Season
                          Spring
Age
Purchase Amount (USD)
                         75.1579
Name: 88, dtype: object
```

8. To check the avg purchase value by different age groups over all seasons

```
#To check the avg purchase value by different age groups over all seasons
(px.bar(season_wiseitem, x='Age',y='Purchase Amount (USD)', color='Season',text_auto=True,
barmode='group',title='Average purchased value by age groups over the seasons')
.update_layout(title_font_size=20)
.update_xaxes(showgrid=True)
).show()
```

Average purchased value by age groups over the seasons



9. To get the detail information about each category with respect to review ratings

```
#To get the detail information about each category with respect to review ratings
k=df.groupby("Category")[["Review Rating"]].aggregate([min,max,'mean'])
print("Minimum,Maximum and Average ratings for different categories purchased")
k
```

Minimum, Maximum and Average ratings for different categories purchased

Review Rating

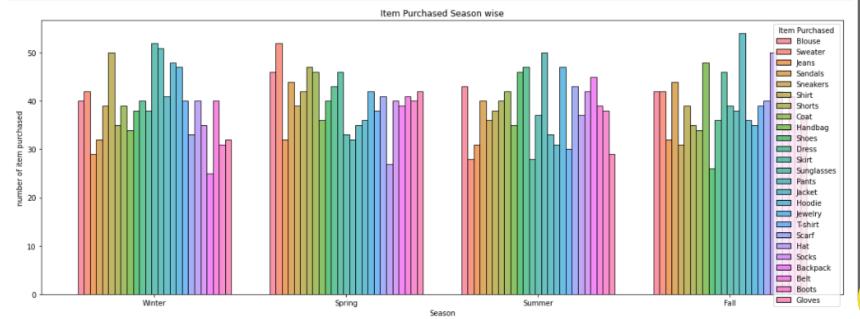
min max mean

Category

Accessories	2.5	5.0	3.770565
Clothing	2.5	5.0	3.724352
Footwear	2.5	5.0	3.791152
Outerwear	2.5	5.0	3.746914

10. To get the overall idea of all the item purchased in all 4 seasons

```
#visualize the item purchased in all 4 seasons
plt.figure(figsize = (20,7))
sns.histplot(df, x="Season", hue="Item Purchased", multiple="dodge",stat="count",shrink=.8)
plt.title("Item Purchased Season wise")
plt.ylabel("number of item purchased")
plt.show()
```



11. To check the probability of customer aged more and less than 40 years giving more than 4 star rating?

```
#whats the probability of customer aged more and less than 40 years giving more than 4 star rating?
#Customer aged more than 40
Total_customers = df[df['Age']>40].shape[0]
more_than_4_review = df[df['Review Rating'] >4 ].shape[0]
probability_of_customers_giving_more_than_4_rating_old = (more_than_4_review/Total_customers)*100
print("probability_of_customers_giving_more_than_4_rating_old )
```

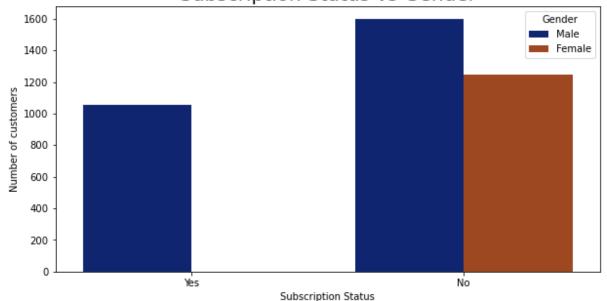
probability of customers giving more than 4 star ratings older than 40 years old is : 65.43985637342908

probability of customers giving more than 4 star ratings younger than 40 years old is : 91.125

12. To check if the genders are playing important role in opting for subscription?

```
#To check if the genders are playing important role in opting for subscription?
plt.figure(figsize = (10,5))
sns.countplot(x = 'Subscription Status', data = df, hue = 'Gender', palette = 'dark')
plt.ylabel("Number of customers")
plt.title('Subscription Status vs Gender', fontweight = 30, fontsize = 20)
plt.show()
```





13. To get idea of the requirement of different sizes of different categories from various locations

```
#to get idea of the requirement of different sizes of different categories through various loactions df_1=df.groupby(["Category","Location"])['Size'].value_counts().to_frame(name='count') df_1 df_1.to_csv('C:/Users/Shubhangi/Desktop/df_1.csv')
```

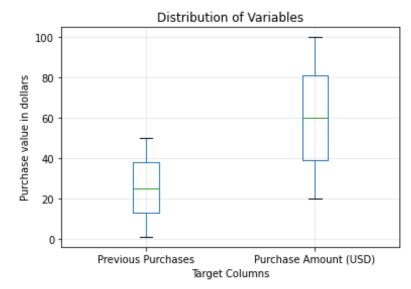
			count
Category	Location	Size	
Accessories	Alabama	М	12
		s	6
		L	5
		XL	2
	Alaska	М	9
Outerwear	Wisconsin	L	1
	Wyoming	М	3
		L	1
		S	1
		XL	1

714	rows.	× 1	coli	ımns

	А	В	С	D
1	Category	Location	Size	count
2	Accessories	Alabama	M	12
3	Accessories	Alabama	S	6
4	Accessories	Alabama	L	5
5	Accessories	Alabama	XL	2
6	Accessories	Alaska	M	9
7	Accessories	Alaska	L	7
8	Accessories	Alaska	S	7
9	Accessories	Alaska	XL	3
10	Accessories	Arizona	M	7
11	Accessories	Arizona	L	5
12	Accessories	Arizona	S	5
13	Accessories	Arizona	XL	3
14	Accessories	Arkansas	M	17
15	Accessories	Arkansas	L	4
16	Accessories	Arkansas	S	4
17	Accessories	Arkansas	XL	1
18	Accessories	California	M	17
19	Accessories	California	1	7

14. What is the difference (comparison) in previously purchased amount and present purchase amount?

```
# whats the difference in previosuly purchased amount and present purchase amount?
b=df[['Previous Purchases','Purchase Amount (USD)']]|
b.boxplot()
plt.xlabel('Target Columns')
plt.ylabel('Purchase value in dollars')
plt.title('Distribution of Variables')
plt.grid(alpha=0.3)
plt.show()
```



1 The most frequently used delivery method is free shipping.

PayPal is most preferred as well as most used payment method where as bank transfer is least preferred as well as used payment method among the customers.

The clothing category is performing well and getting best reviews in spring season where as footwear category is doing well and getting best reviews in fall season. The outerwear category as well as the accessory category too are getting best reviews in spring season.

There is maximum hike between two consecutive purchases of the following customers (customers id): 1496, 2171, 3394. All the customers gave rating above 4.2 star. Customer id 1496 gave 5 star ,used a promo code resulting in a discount. The mostly Used payment method among the 3 customer is credit card.

There is decrease in between two consecutive purchases of the following customers(customers id): 2917, 2967, 3602. All the customers gave rating below 3.4 star. Customer id 2917 gave 2.9 star. The mostly used Payment method among 3 customer is cash.

The customers from Texas are giving 3.90 star rating on average followed by customers from Wisconsin giving 3.89 ratings. The lowest ratings are from customers coming from West Virginia with 3.5 rating.

There's a very strong correlation between Customers from Missouri and the frequency of purchase which is quarterly. Hence Customers from Missouri tends to buy products every 3 months followed by customers from Illinois who tends to buy products bi weekly.

Following are the seasons and the respective age groups with maximum amount spent in shopping:

Summer-Age37-74.22\$

Winter-Age44-68.81\$

Fall-Age49-74.08\$

Spring-Age53-75.15\$

To get a better understanding of all age groups spending habit through out the seasons. Example for age group 44 In fall season average spending limit is 61.86\$

The minimum and the maximum ratings for every individual category i.e; Clothing, Footwear, Outerwear, Accessory are 2.5 and 5 respectively, with mean rating 3.72, 3.79, 3.74, 3.77 respectively.

In winter most purchased item is Sunglass.
In spring most purchased item is Sweater.
In summer most purchased item is Pant.
In fall most purchased item is Jacket

The customers older than 40 years are less likely to give more than 4 stars with probability 65.43 than the customers younger than 40 years are more likely to give greater than 4 stars with probability 91.125

12

Males are opting for subscription way more than females.

13

To get idea of the requirement of different sizes of different categories from various locations.

Example: Customers from Hawaii requires L size garment more than S size OR Customers from Washington requires M size more than size L and S.

14

For previously purchased amount the range of purchase is 1\$ to 50\$ with mean of 25\$ and with no exception of extreme expensive or cheap purchase. As for Current purchased amount the range of purchase is 20\$ to 100\$ with mean of 60\$ and with no exception of extreme expensive or cheap purchase.

Methods used in analysis(EDA)



Data Importing



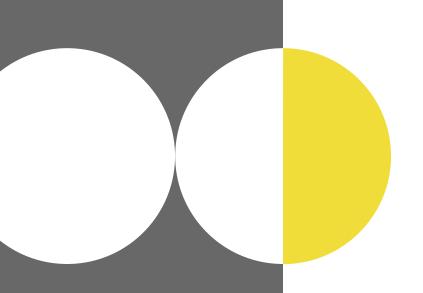
Data preprocessing



Data visualization



Univariate and Bivariate Data Analysis.



Thanks!

HAPPY ANALYSIS!