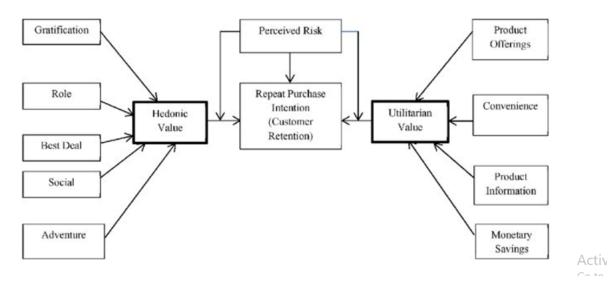
Customer Retention Case Study

Customer satisfaction has emerged as one of the most important factors that guarantee the success of online store; it has been posited as a key stimulant of purchase, repurchase intentions and customer loyalty. A comprehensive review of the literature, theories and models have been carried out to propose the models for customer activation and customer retention. Five major factors that contributed to the success of an e-commerce store have been identified as: service quality, system quality, information quality, trust and net benefit. The research furthermore investigated the factors that influence the online customers repeat purchase intention. The combination of both utilitarian value and hedonistic values are needed to affect the repeat purchase intention (loyalty) positively. The data is collected from the Indian online shoppers. Results indicate the e-retail success factors, which are very much critical for customer satisfaction.



```
# Importing neccesarry liabraries
In [1]:
         import pandas as pd
         import numpy as np
         import matplotlib.pyplot as plt
         %matplotlib inline
         import seaborn as sns
         import warnings
         warnings.filterwarnings('ignore')
         # in the above cell I have stored the excel file and then separated the spreadsheets in
In [2]:
         xls = pd.ExcelFile('E:\DS Intenship projects\Project form Mentor\Cutomer retention\cust
         df1 = pd.read_excel(xls, 'datasheet') # sheet 1
         df2 = pd.read excel(xls, 'codedsheet') # sheet 2
         df1.head(5)
In [4]:
Out[4]:
```

	1Gender of respondent	2 How old are you?	3 Which city do you shop online from?	What is the Pin Code of where you shop online from?	5 Since How Long You are Shopping Online ?	6 How many times you have made an online purchase in the past 1 year?	7 How do you access the internet while shopping on-line?	8 Which device do you use to access the online shopping?	9 What is the screen size of your mobile device? \t\t\t\t\t	10 syst y
0	Male	31- 40 years	Delhi	110009	Above 4 years	31-40 times	Dial-up	Desktop	Others	Windo
1	Female	21- 30 years	Delhi	110030	Above 4 years	41 times and above	Wi-Fi	Smartphone	4.7 inches	
2	Female	21- 30 years	Greater Noida	201308	3-4 years	41 times and above	Mobile Internet	Smartphone	5.5 inches	
3	Male	21- 30 years	Karnal	132001	3-4 years	Less than 10 times	Mobile Internet	Smartphone	5.5 inches	
4	Female	21- 30 years	Bangalore	530068	2-3 years	11-20 times	Wi-Fi	Smartphone	4.7 inches	

5 rows × 71 columns

In [5]: df1.tail(5)

Out[5]:

	1Gender of respondent	2 How old are you?	3 Which city do you shop online from?	4 What is the Pin Code of where you shop online from?	5 Since How Long You are Shopping Online ?	6 How many times you have made an online purchase in the past 1 year?	7 How do you access the internet while shopping on-line?	8 Which device do you use to access the online shopping?	9 What is the screen size of your mobile device? \t\t\t\t\t	5
264	Female	21- 30 years	Solan	173212	1-2 years	Less than 10 times	Mobile Internet	Smartphone	5.5 inches	
265	Female	31- 40 years	Ghaziabad	201008	1-2 years	31-40 times	Mobile Internet	Smartphone	Others	
266	Female	41- 50 yaers	Bangalore	560010	2-3 years	Less than 10 times	Mobile internet	Laptop	Others	Wi

	1Gender of respondent	2 How old are you?	3 Which city do you shop online from?	What is the Pin Code of where you shop online from?	5 Since How Long You are Shopping Online ?	6 How many times you have made an online purchase in the past 1 year?	7 How do you access the internet while shopping on-line?	8 Which device do you use to access the online shopping?	9 What is the screen size of your mobile device? \t\t\t\t\t	•
267	Female	Less than 20 years	Solan	173229	2-3 years	Less than 10 times	Wi-Fi	Smartphone	5.5 inches	
268	Female	41- 50 yaers	Ghaziabad	201009	2-3 years	31-40 times	Mobile Internet	Smartphone	5.5 inches	

5 rows × 71 columns

EDA

```
In [6]: df1.shape
```

Out[6]: (269, 71)

We have total 269 rows and 71 columns which is very wide range of columng

```
# lets have look on all column names
In [7]:
         df1.columns
Out[7]: Index(['1Gender of respondent', '2 How old are you?',
                '3 Which city do you shop online from?',
               '4 What is the Pin Code of where you shop online from?',
               '5 Since How Long You are Shopping Online ?',
               '6 How many times you have made an online purchase in the past 1 year?',
               '7 How do you access the internet while shopping on-line?',
               '8 Which device do you use to access the online shopping?'
               '9 What is the screen size of your mobile device?\t\t\t\t\t
               '10 What is the operating system (OS) of your device?\t\t\t
               '11 What browser do you run on your device to access the website?\t\t\t
               '12 Which channel did you follow to arrive at your favorite online store for the
        first time?
               '13 After first visit, how do you reach the online retail store?\t\t\t
               '14 How much time do you explore the e- retail store before making a purchase dec
        ision?
               '15 What is your preferred payment Option?\t\t\t\t
               '16 How frequently do you abandon (selecting an items and leaving without making
```

payment) your shopping cart?\t\t\t\t\t\t

```
'17 Why did you abandon the "Bag", "Shopping Cart"?\t\t\t\t
       '18 The content on the website must be easy to read and understand',
       '19 Information on similar product to the one highlighted is important for produ
ct comparison',
       '20 Complete information on listed seller and product being offered is important
for purchase decision.',
       '21 All relevant information on listed products must be stated clearly',
       '22 Ease of navigation in website', '23 Loading and processing speed',
       '24 User friendly Interface of the website',
       '25 Convenient Payment methods',
       '26 Trust that the online retail store will fulfill its part of the transaction a
t the stipulated time',
       '27 Empathy (readiness to assist with queries) towards the customers',
       '28 Being able to guarantee the privacy of the customer',
       '29 Responsiveness, availability of several communication channels (email, online
rep, twitter, phone etc.)',
       '30 Online shopping gives monetary benefit and discounts',
       '31 Enjoyment is derived from shopping online',
       '32 Shopping online is convenient and flexible',
       '33 Return and replacement policy of the e-tailer is important for purchase decis
ion',
       '34 Gaining access to loyalty programs is a benefit of shopping online',
       '35 Displaying quality Information on the website improves satisfaction of custom
ers',
       '36 User derive satisfaction while shopping on a good quality website or applicat
ion',
       '37 Net Benefit derived from shopping online can lead to users satisfaction',
       '38 User satisfaction cannot exist without trust',
       '39 Offering a wide variety of listed product in several category',
       '40 Provision of complete and relevant product information',
       '41 Monetary savings',
       '42 The Convenience of patronizing the online retailer',
       '43 Shopping on the website gives you the sense of adventure',
       '44 Shopping on your preferred e-tailer enhances your social status',
       '45 You feel gratification shopping on your favorite e-tailer',
       '46 Shopping on the website helps you fulfill certain roles',
       '47 Getting value for money spent',
       'From the following, tick any (or all) of the online retailers you have shopped f
rom;
       'Easy to use website or application',
       'Visual appealing web-page layout', 'Wild variety of product on offer',
       'Complete, relevant description information of products',
       'Fast loading website speed of website and application',
       'Reliability of the website or application',
       'Quickness to complete purchase',
       'Availability of several payment options', 'Speedy order delivery ',
       'Privacy of customers' information',
       'Security of customer financial information',
       'Perceived Trustworthiness',
       'Presence of online assistance through multi-channel',
       'Longer time to get logged in (promotion, sales period)',
       'Longer time in displaying graphics and photos (promotion, sales period)',
       'Late declaration of price (promotion, sales period)',
       'Longer page loading time (promotion, sales period)',
       'Limited mode of payment on most products (promotion, sales period)',
       'Longer delivery period', 'Change in website/Application design',
       'Frequent disruption when moving from one page to another',
       'Website is as efficient as before',
       'Which of the Indian online retailer would you recommend to a friend?'],
      dtype='object')
```

We need to arrange some standarized names for each columns so that we can visulize and understand in better way

Customer Retention Case Study In [8]: #Renaming column names df1.rename(columns = {'1Gender of respondent':'Gender', '2 How old are you? ':'Age', '3 Which city do you shop online from?': 'City Of Shopping' '4 What is the Pin Code of where you shop online from?':'Pi '5 Since How Long You are Shopping Online ?':'Online_Shoppi '6 How many times you have made an online purchase in the p '7 How do you access the internet while shopping on-line?': '8 Which device do you use to access the online shopping?': '9 What is the screen size of your mobile device?\t\t\t\t '10 What is the operating system (OS) of your device?\t\t\t '11 What browser do you run on your device to access the we '12 Which channel did you follow to arrive at your favorite '13 After first visit, how do you reach the online retail s '14 How much time do you explore the e- retail store before '15 What is your preferred payment Option?\t\t\t\t '16 How frequently do you abandon (selecting an items and 1 '17 Why did you abandon the "Bag", "Shopping Cart"?\t\t\t '18 The content on the website must be easy to read and und '19 Information on similar product to the one highlighted '20 Complete information on listed seller and product being '21 All relevant information on listed products must be sta '22 Ease of navigation in website': 'Website Navigation Eas '23 Loading and processing speed': 'Loading_Processing_Spee '24 User friendly Interface of the website': 'User Friendly '25 Convenient Payment methods':'Conveninet Payment Mode', '26 Trust that the online retail store will fulfill its par '27 Empathy (readiness to assist with queries) towards the '28 Being able to guarantee the privacy of the customer':'C '29 Responsiveness, availability of several communication c '30 Online shopping gives monetary benefit and discounts': '31 Enjoyment is derived from shopping online':'Online Shop '32 Shopping online is convenient and flexible':'Online Sho '33 Return and replacement policy of the e-tailer is import '34 Gaining access to loyalty programs is a benefit of shop '35 Displaying quality Information on the website improves '36 User derive satisfaction while shopping on a good quali '37 Net Benefit derived from shopping online can lead to us '38 User satisfaction cannot exist without trust':'Users Tr '39 Offering a wide variety of listed product in several ca '40 Provision of complete and relevant product information' '41 Monetary savings': 'Monetary_Savings', '42 The Convenience of patronizing the online retailer': 'Pa '43 Shopping on the website gives you the sense of adventur '44 Shopping on your preferred e-tailer enhances your socia '45 You feel gratification shopping on your favorite e-tail '46 Shopping on the website helps you fulfill certain roles '47 Getting value for money spent':'Worth_of_Money', 'From the following, tick any (or all) of the online retail 'Easy to use website or application': 'Ease Website Applica 'Visual appealing web-page layout': 'Visually Appealing lay 'Wild variety of product on offer': 'Product Variety', 'Complete, relevant description information of products':'C 'Fast loading website speed of website and application': 'F 'Reliability of the website or application': 'Reliable Websi

'Quickness to complete purchase':'Quick_Purchase',

'Speedy order delivery ':'Fast_Delivery',

'Availability of several payment options': 'Payment Options'

'Privacy of customers' information': 'Customer Info Privacy'

df1.columns

```
'Security of customer financial information':'Customer_Fina
'Perceived Trustworthiness':'Perceived_Trustworthiness',
'Presence of online assistance through multi-channel': 'Mul
'Longer time to get logged in (promotion, sales period)':'L
'Longer time in displaying graphics and photos (promotion,
'Late declaration of price (promotion, sales period)':'Late
'Longer page loading time (promotion, sales period)':'Page_
'Limited mode of payment on most products (promotion, sales
'Longer delivery period':'Late_Delivery',
'Change in website/Application design': 'Design_Change_of_W
'Frequent disruption when moving from one page to another':
'Website is as efficient as before':'Website_Efficiency',
'Which of the Indian online retailer would you recommend to
```

```
Out[8]: Index(['Gender', 'Age', 'City_Of_Shopping', 'Pin_Code',
                     'Online_Shopping_Since', 'Purchase_Frequency', 'Internet_Access_Mode',
                    'Device_Used', 'Mobile_Screen_Size', 'Device_Operating_System',
                    'Browser Used', 'Channel Followed', 'Login Mode',
                    'Exploring_Time_Spent', 'Payment_Mode',
                    'Shopping_Cart_Abandon_Frequency', 'Bag_Abandon_Reason',
                    'Content_Readability', 'Similar_Product_Info', 'Seller_Product_Info', 'Product_Info_Clarity', 'Website_Navigation_Ease',
                    'Loading_Processing_Speed', 'User_Friendly_Interface',
                    'Conveninet Payment Mode', 'Timely Fulfilment Trust',
                    'Customer_Empathy', 'Customer_Privacy_Guarantee',
                    'Several_Channels_Responses', 'Discount_Benefit', 'Online_Shopping_Enjoyment', 'Online_Shopping_Convenience_Flexibility',
                    'Return_Replace_Policy', 'Loyalty_Program_Access',
                    'Quality_Information_Satisfaction', 'Quality_Satisfaction', 'Net_Benefit_Satisfaction', 'Users_Trust', 'Product_Categories',
                    'Relevant Product Information', 'Monetary Savings',
                    'Patronizing_Convenience', 'Adventure_Sense', 'Enhances_Social_Status', 'Shopping_Gratification', 'Role_Fulfilment', 'Worth_of_Money', 'Shopped_From_Retailer', 'Ease_Website_Application',
                    'Visually_Appealing_layout', 'Product_Variety',
                    'Complete_Product_Information', 'Fast_Loading_Speed_Web_App',
'Reliable_Website_Application', 'Quick_Purchase', 'Payment_Options',
                    'Fast Delivery', 'Customer Info Privacy',
                    'Customer Financial Info Security', 'Perceived Trustworthiness',
                    'Multi Channel Assistance', 'Loading Logging Time',
                    'Loading_Graphics_Photo_Display_Time', 'Late_Price_Declare',
                    'Page_Loading_Time', 'Limited_Payment_Mode', 'Late_Delivery', 'Design_Change_of_Web_App', 'Page_Disruption', 'Website_Efficiency',
                    'Recommend to Friend'],
                   dtype='object')
```

```
In [9]: # Checking our columns namen after rename

df1.head()
```

```
Age City_Of_Shopping Pin_Code Online_Shopping_Since Purchase_Frequency Internet_Acc
Out[9]:
             Gender
                       31-
          0
               Male
                        40
                                        Delhi
                                                 110009
                                                                   Above 4 years
                                                                                          31-40 times
                      years
                       21-
             Female
                        30
                                        Delhi
                                                 110030
                                                                   Above 4 years
                                                                                  41 times and above
                      years
```

				Cust	omer Retention Case Study					
	Gender	Age	City_Of_Shopping	Pin_Code	Online_Shopping_Since	Purchase_Frequency	Internet_Acc			
2	Female	21- 30 years	Greater Noida	201308	3-4 years	41 times and above	Mobi			
3	Male	21- 30 years	Karnal	132001	3-4 years	Less than 10 times	Mobi			
4	Female	21- 30 years	Bangalore	530068	2-3 years	11-20 times				
5 rows × 71 columns										
4							•			
i	<pre>import pandas as pd</pre>									

```
In [35]:
          pd.set_option('display.max_rows', 500)
          pd.set option('display.max columns', 500)
          pd.set option('display.width', 1000)
```

In [36]: #Checking data type df1.dtypes

```
Out[36]: Gender
                                                      object
         Age
                                                      object
         City_Of_Shopping
                                                      object
         Pin Code
                                                       int64
         Online_Shopping_Since
                                                      object
         Purchase_Frequency
                                                      object
         Internet_Access_Mode
                                                      object
         Device Used
                                                      object
         Mobile_Screen_Size
                                                      object
         Device_Operating_System
                                                      object
         Browser Used
                                                      object
          Channel Followed
                                                      object
          Login Mode
                                                      object
          Exploring_Time_Spent
                                                      object
          Payment Mode
                                                      object
          Shopping Cart Abandon Frequency
                                                      object
          Bag_Abandon_Reason
                                                      object
         Content_Readability
                                                      object
          Similar Product Info
                                                      object
         Seller_Product_Info
                                                      object
         Product_Info_Clarity
                                                      object
         Website_Navigation_Ease
                                                      object
          Loading Processing Speed
                                                      object
         User_Friendly_Interface
                                                      object
         Conveninet_Payment_Mode
                                                      object
         Timely_Fulfilment_Trust
                                                      object
         Customer_Empathy
                                                      object
                                                      object
         Customer_Privacy_Guarantee
         Several_Channels_Responses
                                                      object
         Discount_Benefit
                                                      object
         Online_Shopping_Enjoyment
                                                      object
         Online Shopping Convenience Flexibility
                                                      object
          Return Replace Policy
                                                      object
          Loyalty Program Access
                                                      object
         Quality Information Satisfaction
                                                      object
```

```
Quality_Satisfaction
                                            object
Net Benefit Satisfaction
                                            object
Users Trust
                                            object
Product Categories
                                            object
Relevant_Product_Information
                                            object
Monetary_Savings
                                            object
Patronizing Convenience
                                            object
Adventure Sense
                                            object
Enhances_Social_Status
                                            object
Shopping_Gratification
                                            object
Role Fulfilment
                                            object
Worth_of_Money
                                            object
Shopped_From_Retailer
                                            object
Ease_Website_Application
                                            object
Visually Appealing layout
                                            object
Product Variety
                                            object
Complete_Product_Information
                                            object
Fast Loading Speed Web App
                                            object
Reliable Website Application
                                            object
Quick Purchase
                                            object
Payment Options
                                            object
Fast Delivery
                                            object
Customer Info Privacy
                                            object
Customer Financial Info Security
                                            object
Perceived Trustworthiness
                                            object
Multi Channel Assistance
                                            object
Loading Logging Time
                                            object
Loading_Graphics_Photo_Display_Time
                                            object
Late_Price_Declare
                                            object
Page Loading Time
                                            object
Limited Payment Mode
                                            object
Late Delivery
                                            object
Design_Change_of_Web_App
                                            object
Page Disruption
                                            object
Website Efficiency
                                            object
Recommend_to_Friend
                                            object
dtype: object
```

We can see above only "pin code" Column is Int64 and countineous in nature and rest all are objects

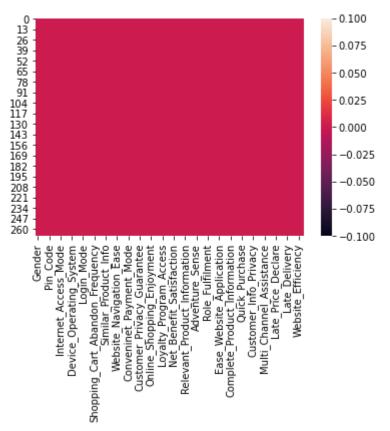
```
In [37]:
          #Checking for null values
          df1.isnull().sum()
         Gender
                                                      0
Out[37]:
                                                      0
          Age
          City Of Shopping
                                                      0
          Pin Code
         Online Shopping Since
                                                      0
         Purchase Frequency
                                                      0
          Internet Access Mode
         Device Used
         Mobile Screen Size
                                                      0
          Device Operating System
          Browser Used
          Channel Followed
          Login Mode
                                                      0
          Exploring Time Spent
          Payment Mode
          Shopping_Cart_Abandon_Frequency
                                                      0
          Bag Abandon Reason
                                                      0
          Content Readability
                                                      0
          Similar Product Info
                                                      0
         Seller_Product_Info
```

```
Product Info Clarity
Website Navigation Ease
                                            0
                                            0
Loading Processing Speed
User_Friendly_Interface
                                            0
Conveninet_Payment_Mode
                                            0
Timely_Fulfilment_Trust
                                            a
Customer Empathy
Customer Privacy Guarantee
Several Channels Responses
Discount Benefit
                                            0
Online Shopping Enjoyment
Online_Shopping_Convenience_Flexibility
Return_Replace_Policy
                                            0
Loyalty_Program_Access
                                            0
Quality_Information_Satisfaction
Quality_Satisfaction
Net_Benefit_Satisfaction
                                            0
Users_Trust
                                            0
Product Categories
Relevant Product Information
Monetary_Savings
                                            0
                                            0
Patronizing Convenience
Adventure Sense
Enhances Social Status
Shopping Gratification
                                            0
Role Fulfilment
                                            0
Worth_of_Money
Shopped_From_Retailer
                                            0
Ease Website Application
                                            0
Visually Appealing layout
Product Variety
Complete_Product_Information
Fast_Loading_Speed_Web_App
                                            0
Reliable_Website_Application
Quick_Purchase
Payment_Options
Fast_Delivery
Customer Info Privacy
Customer_Financial_Info_Security
Perceived_Trustworthiness
Multi Channel Assistance
Loading Logging Time
Loading_Graphics_Photo_Display_Time
Late Price Declare
                                            0
Page Loading Time
Limited Payment Mode
Late_Delivery
Design_Change_of_Web_App
                                            0
Page Disruption
                                            0
Website Efficiency
                                            0
Recommend_to_Friend
dtype: int64
```

No Null values are present in data set

```
In [38]: sns.heatmap(df1.isnull())
```

Out[38]: <AxesSubplot:>



We can see same result on heatmap

```
In [39]:
```

```
# Lest check further details about dataset

df1.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 269 entries, 0 to 268
Data columns (total 71 columns):

columns (total 71 columns):		
Column	Non-Null Count	Dtype
	2.60	
		object
		object
· · · ·		object
-		int64
		object
	269 non-null	object
Payment_Mode	269 non-null	object
Shopping_Cart_Abandon_Frequency	269 non-null	object
Bag_Abandon_Reason	269 non-null	object
Content_Readability	269 non-null	object
Similar_Product_Info	269 non-null	object
Seller_Product_Info	269 non-null	object
Product_Info_Clarity	269 non-null	object
Website_Navigation_Ease	269 non-null	object
Loading_Processing_Speed	269 non-null	object
User_Friendly_Interface	269 non-null	object
	Column Gender Age City_Of_Shopping Pin_Code Online_Shopping_Since Purchase_Frequency Internet_Access_Mode Device_Used Mobile_Screen_Size Device_Operating_System Browser_Used Channel_Followed Login_Mode Exploring_Time_Spent Payment_Mode Shopping_Cart_Abandon_Frequency Bag_Abandon_Reason Content_Readability Similar_Product_Info Product_Info_Clarity Website_Navigation_Ease Loading_Processing_Speed	Column Gender Ge

```
Conveninet Payment Mode
                                              269 non-null
                                                              object
25 Timely Fulfilment Trust
                                                             object
                                              269 non-null
26 Customer Empathy
                                                             object
                                              269 non-null
27 Customer_Privacy_Guarantee
                                              269 non-null
                                                             object
28 Several_Channels_Responses
                                              269 non-null
                                                             object
29 Discount_Benefit
                                             269 non-null
                                                             object
30 Online Shopping Enjoyment
                                              269 non-null
                                                              object
31 Online_Shopping_Convenience_Flexibility 269 non-null
                                                              object
32 Return_Replace_Policy
                                              269 non-null
                                                              object
33
    Loyalty_Program_Access
                                              269 non-null
                                                              object
34 Quality_Information_Satisfaction
                                                              object
                                              269 non-null
    Quality Satisfaction
                                              269 non-null
                                                              object
36 Net_Benefit_Satisfaction
                                              269 non-null
                                                             object
37
    Users Trust
                                              269 non-null
                                                             object
                                                             object
38 Product Categories
                                              269 non-null
39
    Relevant_Product_Information
                                              269 non-null
                                                             object
40 Monetary_Savings
                                              269 non-null
                                                             object
    Patronizing_Convenience
                                              269 non-null
                                                             object
41
    Adventure_Sense
42
                                              269 non-null
                                                             object
43
    Enhances Social Status
                                              269 non-null
                                                             object
44
    Shopping Gratification
                                              269 non-null
                                                             object
                                              269 non-null
45
    Role Fulfilment
                                                             object
46 Worth of Money
                                              269 non-null
                                                             object
    Shopped From Retailer
                                              269 non-null
47
                                                             object
                                             269 non-null
48 Ease Website Application
                                                             object
49 Visually Appealing layout
                                              269 non-null
                                                              object
50 Product Variety
                                              269 non-null
                                                             object
51 Complete_Product_Information
                                              269 non-null
                                                             object
52 Fast_Loading_Speed_Web_App
                                             269 non-null
                                                             object
53 Reliable Website Application
                                             269 non-null
                                                             object
54 Quick Purchase
                                              269 non-null
                                                             object
                                                             object
55 Payment Options
                                              269 non-null
56 Fast Delivery
                                              269 non-null
                                                             object
57
    Customer Info Privacy
                                              269 non-null
                                                             object
    Customer_Financial_Info_Security
                                              269 non-null
                                                             object
59
    Perceived_Trustworthiness
                                              269 non-null
                                                             object
60 Multi_Channel_Assistance
                                              269 non-null
                                                             object
                                              269 non-null
61 Loading Logging Time
                                                              object
62 Loading_Graphics_Photo_Display_Time
                                              269 non-null
                                                              object
63 Late Price Declare
                                              269 non-null
                                                              object
64 Page Loading Time
                                              269 non-null
                                                              object
65 Limited Payment Mode
                                              269 non-null
                                                             object
66 Late Delivery
                                              269 non-null
                                                             object
67 Design Change of Web App
                                                             object
                                              269 non-null
68 Page Disruption
                                             269 non-null
                                                             object
69 Website Efficiency
                                             269 non-null
                                                             object
70 Recommend to Friend
                                             269 non-null
                                                              object
dtypes: int64(1), object(70)
```

We can see multiple information of dataset from above chart as below

Numbers of columnsName of columns Missing dataData type of every column *Data is using 149.3 KB memory

memory usage: 149.3+ KB

Purchase_Frequency	0
Internet_Access_Mode	0
<u> </u>	
Device_Used	0
Mobile_Screen_Size	0
Device_Operating_System	0
Browser_Used	0
Channel_Followed	0
Login_Mode	0
<pre>Exploring_Time_Spent</pre>	0
Payment_Mode	0
Shopping_Cart_Abandon_Frequency	0
Bag_Abandon_Reason	0
Content_Readability	0
Similar_Product_Info	0
Seller_Product_Info	0
Product_Info_Clarity	0
Website_Navigation_Ease	0
Loading_Processing_Speed	0
User_Friendly_Interface	0
Conveninet_Payment_Mode	0
Timely_Fulfilment_Trust	0
Customer_Empathy	0
Customer_Privacy_Guarantee	0
Several_Channels_Responses	0
Discount_Benefit	0
Online_Shopping_Enjoyment	0
Online_Shopping_Convenience_Flexibility	0
Return_Replace_Policy	0
Loyalty_Program_Access	0
Quality_Information_Satisfaction	0
Quality_Satisfaction	0
Net_Benefit_Satisfaction	0
Users_Trust	0
Product_Categories	0
Relevant_Product_Information	0
Monetary_Savings	0
Patronizing_Convenience	0
Adventure_Sense	0
Enhances_Social_Status	0
Shopping_Gratification	0
Role_Fulfilment	0
Worth_of_Money	0
Shopped_From_Retailer	0
Ease_Website_Application	0
Visually_Appealing_layout	0
Product_Variety	0
Complete_Product_Information	0
Fast_Loading_Speed_Web_App	0
Reliable_Website_Application	0
Quick_Purchase	0
Payment_Options	0
Fast_Delivery	0
Customer_Info_Privacy	0
Customer_Financial_Info_Security	0
Perceived_Trustworthiness	0
Multi_Channel_Assistance	0
Loading_Logging_Time	0
Loading_Graphics_Photo_Display_Time	0
	0
Late_Price_Declare	_
Late_Price_Declare Page_Loading_Time	0
Late_Price_Declare Page_Loading_Time Limited_Payment_Mode	0
Late_Price_Declare Page_Loading_Time Limited_Payment_Mode Late_Delivery	
Late_Price_Declare Page_Loading_Time Limited_Payment_Mode Late_Delivery Design_Change_of_Web_App	0
Late_Price_Declare Page_Loading_Time Limited_Payment_Mode Late_Delivery	0 0
Late_Price_Declare Page_Loading_Time Limited_Payment_Mode Late_Delivery Design_Change_of_Web_App	0 0 0

Recommend_to_Friend

dtype: int64

Checking how much unique values are present in each columns

In [41]:	df1.nunique()		
[+].	a. Ishaniiqae()		
Out[41]:	Gender	2	
	Age	5	
	City_Of_Shopping	11	
	Pin_Code	39	
	Online_Shopping_Since	5	
	Purchase_Frequency	6	
	Internet_Access_Mode	4	
	Device_Used	4	
	Mobile_Screen_Size	4	
	Device_Operating_System	3	
	Browser_Used	4	
	Channel_Followed	3	
	Login_Mode	5	
	Exploring_Time_Spent	5	
	Payment_Mode	3	
	Shopping_Cart_Abandon_Frequency	4	
	Bag_Abandon_Reason	5	
	Content_Readability	4	
	Similar_Product_Info	4	
	Seller_Product_Info	5	
	Product_Info_Clarity	4	
	Website_Navigation_Ease	4	
	Loading_Processing_Speed	5	
	User_Friendly_Interface	5	
	Conveninet_Payment_Mode	3	
	Timely_Fulfilment_Trust	4	
	Customer_Empathy	4	
	Customer_Privacy_Guarantee	3	
	Several_Channels_Responses	4	
	Discount_Benefit	5	
	Online_Shopping_Enjoyment	5	
	Online_Shopping_Convenience_Flexibility	4	
	Return_Replace_Policy	3	
	Loyalty_Program_Access	5	
	Quality_Information_Satisfaction	3	
	Quality_Satisfaction	3	
	Net_Benefit_Satisfaction	4	
	Users_Trust	5	
	Product_Categories	4	
	Relevant_Product_Information	4	
	Monetary_Savings	4	
	Patronizing_Convenience	3	
	Adventure_Sense	5	
	Enhances_Social_Status	5	
	Shopping_Gratification	5	
	Role_Fulfilment	5	
	Worth_of_Money	3	
	Shopped_From_Retailer	9	
	Ease_Website_Application	10	
	Visually_Appealing_layout	10	
	Product_Variety	9	
	Complete_Product_Information	11	
	Fast_Loading_Speed_Web_App	10	
	Reliable_Website_Application	10	
	Quick_Purchase	9	
	Payment_Options	11	
	Fast_Delivery	6	

11

Customer_Info_Privacy

```
Customer Financial Info Security
                                            11
Perceived Trustworthiness
                                             9
Multi Channel Assistance
                                            10
Loading Logging Time
                                            10
Loading_Graphics_Photo_Display_Time
                                            10
Late Price Declare
                                             8
Page Loading Time
                                            11
Limited Payment Mode
Late_Delivery
                                             6
Design_Change_of_Web_App
                                             7
Page Disruption
                                             8
Website Efficiency
                                             8
Recommend_to_Friend
dtype: int64
```

Checking all value of each columns

```
In [43]:
        for i in df1.columns:
               print(df1[i].value counts(),"\n\n", "-"*100, "\n\n")
        Female
                181
        Male
                 88
        Name: Gender, dtype: int64
        31-40 years
                          81
        21-30 years
                          79
        41-50 yaers
                          70
        Less than 20 years
                          20
        51 years and above 19
        Name: Age, dtype: int64
        ______
        Delhi
                      58
        Greater Noida
                      43
        Noida
                      40
        Bangalore
                      37
        Karnal
                      27
        Ghaziabad
                     18
        Solan
                     18
        Gurgaon
                     12
        Merrut
        Moradabad
        Bulandshahr
        Name: City_Of_Shopping, dtype: int64
         ______
        201308
                38
        132001
                19
        201310
                18
        110044
                16
        173212
                 9
                 9
        250001
        173229
```

```
560037
         8
132036
560010
         8
122018
         7
110011
         7
201306
         7
110008
110014
110018
         6
244001
         5
         5
201312
530068
         5
201305
         5
         5
201009
         5
201008
201005
         4
201001
201304
         4
110039
110030
110009
         4
560018
560003
122009
         4
560002
110042
         4
201303
         4
         3
560013
203001
         2
560001
         1
203207
203202
        1
Name: Pin_Code, dtype: int64
Above 4 years
2-3 years
3-4 years
                 65
                 47
Less than 1 year
                 43
1-2 years
                 16
Name: Online_Shopping_Since, dtype: int64
 ______
Less than 10 times 114
31-40 times 63
41 times and above 47
11-20 times
                   29
21-30 times
                   10
42 times and above 6
Name: Purchase_Frequency, dtype: int64
Mobile internet 142
Wi-Fi
                 76
Mobile Internet
                 47
Dial-up
```

```
Name: Internet_Access_Mode, dtype: int64
______
Smartphone 141
Laptop
         86
Desktop 30
Tablet 12
Name: Device_Used, dtype: int64
Others 134
5.5 inches 99
4.7 inches 29 5 inches 7
Name: Mobile_Screen_Size, dtype: int64
______
Window/windows Mobile
                122
Android
                 85
IOS/Mac
                 62
Name: Device_Operating_System, dtype: int64
_____
Google chrome 216
Safari
Opera 8
Mozilla Firefox 5
Name: Browser_Used, dtype: int64
Search Engine 230
            20
19
Content Marketing
Display Adverts
Name: Channel Followed, dtype: int64
-----
Search Engine 87
Via application
            86
Direct URL
            70
E-mail
            18
Social Media
            8
Name: Login_Mode, dtype: int64
 -----
-----
```

```
more than 15 mins
              123
              71
6-10 mins
11-15 mins
              46
           15
Less than 1 min
1-5 mins
              14
Name: Exploring_Time_Spent, dtype: int64
______
_____
Credit/Debit cards
                         148
Cash on delivery (CoD)
                          76
E-wallets (Paytm, Freecharge etc.)
                          45
Name: Payment Mode, dtype: int64
-----
Sometimes 171
Never
Frequently
Frequently 35
Very frequently 15
Name: Shopping_Cart_Abandon_Frequency, dtype: int64
______
Better alternative offer
                   133
                    54
Promo code not applicable
Change in price
                     37
Lack of trust
                      31
No preferred mode of payment
Name: Bag_Abandon_Reason, dtype: int64
______
Strongly agree (5) 164
Agree (4)
Strongly disagree (1) 18
Indifferent (3)
Name: Content Readability, dtype: int64
______
_ _ _ _ _ _ _ _ _ _ _ _ _ _ _ _
Strongly agree (5)
              116
Agree (4)
               92
Indifferent (3) 43
Dis-agree (2)
              18
Name: Similar_Product_Info, dtype: int64
Agree (4)
                101
Strongly agree (5)
                 87
Indifferent (3)
                 52
Dis-agree (2)
                 18
```

```
Strongly disagree (1) 11
Name: Seller Product Info, dtype: int64
Agree (4) 132
Strongly agree (5) 107
Strongly disagree (1) 18
Dis-agree (2) 12
Name: Product_Info_Clarity, dtype: int64
 ______
Strongly agree (5) 141
Agree (4) 105
Strongly disagree (1) 18
Dis-agree (2) 5
Name: Website Navigation Ease, dtype: int64
Strongly agree (5) 115
                       112
Agree (4) 112
Dis-agree (2) 18
Strongly disagree (1) 12
Indifferent (3) 12
Agree (4)
Name: Loading_Processing_Speed, dtype: int64
Strongly agree (5) 189
Agree (4) 45
Strongly disagree (1) 18
Dis-agree (2) 12
Indifferent (3) 5
Name: User 5
Name: User_Friendly_Interface, dtype: int64
 ______
Strongly agree (5)
Agree (4) 80
Dis-agree (2) 30
Name: Conveninet_Payment_Mode, dtype: int64
-----
Strongly agree (5) 141
Agree (4)
Agree (4)
Disagree (2)
                     30
indifferent (3) 12
Name: Timely Fulfilment Trust, dtype: int64
```

```
Strongly agree (5) 194
Agree (4)
                 42
Strongly disagree (1)
                  18
indifferent (3)
                 15
Name: Customer_Empathy, dtype: int64
 ______
Strongly agree (5) 185
Agree (4)
Agree (4) 58 indifferent (3) 26
Name: Customer_Privacy_Guarantee, dtype: int64
 Strongly agree (5)
               149
Agree (4)
Agree (4) 94 indifferent (3) 15 Strongly disagree (1) 11
Name: Several_Channels_Responses, dtype: int64
 ______
_ _ _ _ _ _ _ _ _ _ _ _ _ _ _ _
Strongly agree (5) 105
Agree (4) 85 indifferent (3) 50 Strongly disagree (1) 18
Dis-agree (2)
                  11
Name: Discount_Benefit, dtype: int64
______
-----
Strongly agree (5)
                 86
indifferent (3) 75
                 59
Agree (4)
Strongly disagree (1) 30
Dis-agree (2)
                 19
Name: Online Shopping Enjoyment, dtype: int64
_____
Strongly agree (5) 146
Agree (4)
                78
indifferent (3)
               33
Dis-agree (2)
               12
Name: Online_Shopping_Convenience_Flexibility, dtype: int64
 ______
```

Strongly agree (5) 198

```
Agree (4)
                 51
Dis-agree (2) 20
Name: Return Replace Policy, dtype: int64
Strongly agree (5) 115
Agree (4)
                   64
indifferent (3)
                   64
Dis-agree (2)
Strongly disagree (1) 11
Name: Loyalty_Program_Access, dtype: int64
 -----
-----
Strongly agree (5)
                133
Agree (4)
                 80
Agree (4) 80 indifferent (3) 56
Name: Quality Information Satisfaction, dtype: int64
-----
Strongly agree (5) 175
Agree (4)
Dis-agree (2)
Name: Quality_Satisfaction, dtype: int64
 ______
Strongly agree (5) 164
Agree (4)
indifferent (3) 40
Dis-agree (2)
                 11
Name: Net Benefit Satisfaction, dtype: int64
-----
Strongly agree (5) 122
Agree (4)
                   117
Strongly disagree (1) 18
Dis-agree (2)
indifferent (3)
Name: Users_Trust, dtype: int64
-----
Strongly agree (5) 111
Agree (4)
                 94
                 57
indifferent (3)
             7
Dis-agree (2)
Name: Product_Categories, dtype: int64
```

```
Strongly agree (5) 135
Agree (4) 98 indifferent (3) 31 Disagree (2) 5
Name: Relevant_Product_Information, dtype: int64
 ______
Strongly agree (5) 148
Agree (4)
Disagree (2)
indifferent (3) 15
Name: Monetary_Savings, dtype: int64
Agree (4) 138 indifferent (3) 77 Strongly agree (5) 54
Name: Patronizing_Convenience, dtype: int64
 ______
_____
Agree (4) 101 indifferent (3) 59 Strongly agree (5) 54 Dis-agree (2) 50 Strongly dis
Strongly disagree (1) 50
Name: Adventure_Sense, dtype: int64
 ______
_____
indifferent (3) 100
Agree (4) 59
Strongly agree (5) 48
Strongly disagree (1) 33
Dis-agree (2) 29
Dis-agree (2)
                      29
Name: Enhances Social Status, dtype: int64
_____
indifferent (3) 101
Strongly agree (5) 65
Agree (4) 63
Disagree (2) 22
Disagree (2)
Strongly disagree (1) 18
Name: Shopping_Gratification, dtype: int64
 -----
```

```
Agree (4)
                   88
indifferent (3)
                   88
Strongly agree (5)
                   38
Strongly disagree (1)
                   33
Dis-agree (2)
                   22
Name: Role_Fulfilment, dtype: int64
______
_____
Agree (4)
                 149
Strongly agree (5)
                 82
indifferent (3)
                 38
Name: Worth_of_Money, dtype: int64
______
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
                                                  82
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                  44
Amazon.in, Flipkart.com
                                                  32
Amazon.in, Flipkart.com, Paytm.com, Snapdeal.com
                                                  29
Amazon.in, Flipkart.com, Snapdeal.com
                                                  27
Amazon.in, Paytm.com, Myntra.com
                                                  20
Amazon.in
                                                  16
Amazon.in, Paytm.com
                                                  12
Amazon.in, Flipkart.com, Paytm.com
                                                   7
Name: Shopped From Retailer, dtype: int64
______
_____
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
                                                  64
Amazon.in, Flipkart.com
                                                  44
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                  44
                                                  29
Amazon.in
Amazon.in, Flipkart.com, Paytm.com, Snapdeal.com
                                                  22
Amazon.in, Paytm.com, Myntra.com
                                                  20
Amazon.in, Flipkart.com, Myntra.com
                                                  19
Paytm.com
                                                  12
Flipkart.com
                                                   8
                                                   7
Amazon.in, Paytm.com
Name: Ease Website Application, dtype: int64
______
_ _ _ _ _ _ _ _ _ _ _ _ _ _ _
Amazon.in, Flipkart.com
                                                  87
Amazon.in
                                                  44
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
Amazon.in, Paytm.com, Myntra.com
                                                  20
Amazon.in, Myntra.com
                                                  15
Myntra.com
                                                  15
Flipkart.com, Myntra.com
                                                  15
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                  14
Flipkart.com
                                                  12
Amazon.in, Flipkart.com, Paytm.com, Snapdeal.com
                                                  11
Name: Visually_Appealing_layout, dtype: int64
```

localhost:8888/nbconvert/html/Customer Retention Case Study.ipynb?download=false

```
Amazon.in, Flipkart.com
                                              130
Amazon.in
                                              43
Amazon.in, Myntra.com
                                              20
Myntra.com
                                              15
Flipkart.com, Myntra.com
                                              15
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                              14
Amazon.in, Flipkart.com, Paytm.com
                                              13
Flipkart.com
                                              12
Paytm.com
Name: Product_Variety, dtype: int64
 ______
-----
Amazon.in, Flipkart.com
                                                       100
Amazon.in
                                                        43
Amazon.in, Flipkart.com, Paytm.com
                                                        24
Amazon.in, Paytm.com, Myntra.com
                                                        20
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
                                                        15
Amazon.in, Flipkart.com, Myntra.com
                                                        15
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                        14
                                                        12
Snapdeal.com
Flipkart.com, Snapdeal.com
                                                        11
Flipkart.com
                                                         8
Amazon.in, Flipkart.com, Snapdeal.com
Name: Complete Product Information, dtype: int64
 ______
_____
Amazon.in
                                                       51
Amazon.in, Paytm.com
                                                       44
Amazon.in, Flipkart.com
                                                       30
Amazon.in, Flipkart.com, Myntra.com
                                                       30
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
Amazon.in, Flipkart.com, Paytm.com
                                                       25
Amazon.in, Flipkart.com, Snapdeal.com
                                                       25
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                       14
Snapdeal.com
                                                       12
Flipkart.com
Name: Fast Loading Speed Web App, dtype: int64
 -----
Amazon.in
                                              61
Amazon.in, Flipkart.com
                                              50
Amazon.in, Flipkart.com, Paytm.com
                                              36
Amazon.in, Paytm.com, Myntra.com
                                              35
Amazon.in, Flipkart.com, Snapdeal.com
                                              18
Myntra.com
                                              15
Flipkart.com
                                              15
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                              14
Amazon.in, Flipkart.com, Paytm.com, Snapdeal.com
                                              13
Paytm.com
                                              12
Name: Reliable Website Application, dtype: int64
_ _ _ _ _ _ _ _ _ _ _ _ _
```

Amazon.com, Flipkart.com, Paytm.com Amazon.com, Flipkart.com Amazon.com, Flipkart.com, Myntra.com Paytm.com Amazon.com, Paytm.com, Myntra.com Amazon.com, Flipkart.com, Paytm.com, Myntra.com, Snapdeal Flipkart.com	66 47 37 30 25 20 15 15
Amazon.in, Flipkart.com Amazon.in, Flipkart.com, Myntra.com Amazon.in, Flipkart.com, Patym.com, Myntra.com, Snapdeal.com Amazon.in Patym.com, Myntra.com Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com Amazon.in, Flipkart.com, Snapdeal.com Flipkart.com, Myntra.com, Snapdeal.com Patym.com Amazon.in, Patym.com Flipkart.com Name: Payment_Options, dtype: int64	65 40 39 23 20 19 18 14 12 11
Amazon.in 107 Amazon.in, Flipkart.com 82 Amazon.in, Flipkart.com, Snapdeal.com 36 Amazon.in, Flipkart.com, Myntra.com 15 Flipkart.com 15 Flipkart.com, Myntra.com, Snapdeal.com 14 Name: Fast_Delivery, dtype: int64	
Amazon.in Amazon.in, Flipkart.com Amazon.in, Flipkart.com, Myntra.com Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com Paytm.com Myntra.com Flipkart.com Amazon.in, Paytm.com Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com Amazon.in, Flipkart.com, Paytm.com Amazon.in, Flipkart.com, Snapdeal.com Amazon.in, Flipkart.com, Snapdeal.com Name: Customer_Info_Privacy, dtype: int64	71 54 25 24 18 15 15 17 17 18 18 17 18 18 18 19 19 19 19 19 19 19 19 19 19 19 19 19
Amazon.in Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com Flipkart.com	51 42 33

```
Amazon.in, Flipkart.com, Snapdeal.com
                                                       25
Amazon.in, Flipkart.com
                                                       24
Amazon.in, Paytm.com, Myntra.com
                                                       20
Amazon.in, Snapdeal.com
                                                       19
Myntra.com
                                                       15
Paytm.com
                                                       15
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                       14
Amazon.in, Flipkart.com, Paytm.com
                                                       11
Name: Customer_Financial_Info_Security, dtype: int64
 ______
                                                       76
Amazon.in
Amazon.in, Flipkart.com, Snapdeal.com
                                                       36
Amazon.in, Myntra.com
                                                       35
Amazon.in, Flipkart.com
                                                       31
Flipkart.com
                                                       27
Amazon.in, Flipkart.com, Myntra.com, Snapdeal.com
                                                       25
Myntra.com
                                                       15
Amazon.in, Flipkart.com, Paytm.com, Myntra.com, Snapdeal.com
                                                       13
Amazon.in, Flipkart.com, Paytm.com
                                                       11
Name: Perceived Trustworthiness, dtype: int64
 ______
Amazon.in, Flipkart.com, Myntra.com, Snapdeal
                                          61
Amazon.in
Amazon.in, Flipkart.com
                                          39
Amazon.in, Snapdeal
                                          26
Myntra.com
                                          20
Amazon.in, Myntra.com
                                          15
Amazon.in, Flipkart.com, Myntra.com
                                          15
Amazon.in, Flipkart.com, Paytm.com
                                          13
Paytm.com
                                          12
Flipkart.com
Name: Multi Channel Assistance, dtype: int64
 ______
Amazon.in
                                   57
Amazon.in, Flipkart.com
                                   38
Paytm.com
                                   38
Myntra.com
                                   35
Amazon.in, Flipkart.com, Snapdeal.com
                                   29
Snapdeal.com
                                   25
Flipkart.com, Paytm.com
                                   15
Flipkart.com, Paytm.com, Snapdeal.com
                                   13
Amazon.in, Paytm.com
                                   11
Flipkart.com
                                    8
Name: Loading_Logging_Time, dtype: int64
Amazon.in, Flipkart.com
                                 60
Amazon.in
                                 39
Myntra.com
                                 35
Snapdeal.com
```

```
Myntra.com, Snapdeal.com
                                 25
Flipkart.com, Snapdeal.com
                                 19
Flipkart.com
                                 15
Paytm.com
                                 15
Amazon.in, Myntra.com, Snapdeal.com
                                 14
                                 13
Amazon.in, Paytm.com
Name: Loading Graphics Photo Display Time, dtype: int64
Myntra.com
                       75
Paytm.com
                       52
snapdeal.com
                       41
Amazon.in
                       38
Flipkart.com
                       38
Amazon.in, Paytm.com
                       13
Paytm.com, snapdeal.com
                       7
Amazon.in, Flipkart.com
                       5
Name: Late Price Declare, dtype: int64
 -----
Myntra.com
                               61
Paytm.com
                               59
Flipkart.com
                               32
Snapdeal.com
                               23
Amazon.in, Flipkart.com
                               18
Amazon.in
                               16
Paytm.com, Snapdeal.com
                               15
Amazon.in, Snapdeal.com
                               14
Amazon.in, Paytm.com
                               13
Flipkart.com, Snapdeal.com
                               11
Amazon.in, Paytm.com, Myntra.com
Name: Page_Loading_Time, dtype: int64
_____
Snapdeal.com
                        87
Amazon.in
                        62
Flipkart.com
                        31
Amazon.in, Flipkart.com
                       29
Paytm.com
                        25
Paytm.com, Snapdeal.com
                       15
Amazon.in, Paytm.com
                        13
Myntra.com, Snapdeal.com
                        7
Name: Limited_Payment_Mode, dtype: int64
 ______
_____
Paytm.com
                       72
Snapdeal.com
                       64
Flipkart.com
                       44
Amazon.in
                       37
Paytm.com, Snapdeal.com
                       26
Myntra.com
Name: Late Delivery, dtype: int64
```

```
Amazon.in
                                   96
        Paytm.com
                                   63
        Amazon.in, Flipkart.com
                                   45
        Myntra.com
                                   30
                                   20
        Flipkart.com
        Snapdeal.com
                                    8
         Flipkart.com, Myntra.com
                                    7
        Name: Design_Change_of_Web_App, dtype: int64
          ______
        Amazon.in
                                     53
        Myntra.com
                                     52
        Snapdeal.com
                                     49
                                     39
        Paytm.com
        Flipkart.com
                                     26
         Amazon.in, Flipkart.com
                                     25
        Myntra.com, Snapdeal.com
                                     14
        Flipkart.com, Snapdeal.com
                                     11
        Name: Page Disruption, dtype: int64
        Amazon.in
                                            94
        Flipkart.com
                                            47
         Amazon.in, Flipkart.com
                                            45
        Amazon.in, Flipkart.com, Paytm.com
                                            25
        Amazon.in, Paytm.com
                                            18
        Paytm.com
                                            15
        Myntra.com, Snapdeal.com
                                            14
        Snapdeal.com
        Name: Website Efficiency, dtype: int64
         Amazon.in
                                                           79
         Amazon.in, Flipkart.com
                                                           62
         Flipkart.com
                                                           39
        Amazon.in, Myntra.com
                                                           30
        Amazon.in, Paytm.com, Myntra.com
                                                           20
        Amazon.in, Flipkart.com, Myntra.com
                                                           15
        Amazon.in, Paytm.com
                                                           13
        Flipkart.com, Paytm.com, Myntra.com, snapdeal.com
                                                           11
        Name: Recommend_to_Friend, dtype: int64
         #Column name "Purchase Frequency" have value "41 times and above" and "42 times and abo
In [45]:
         df1['Purchase_Frequency'].replace("42 times and above","41 times and above",inplace=Tru
```

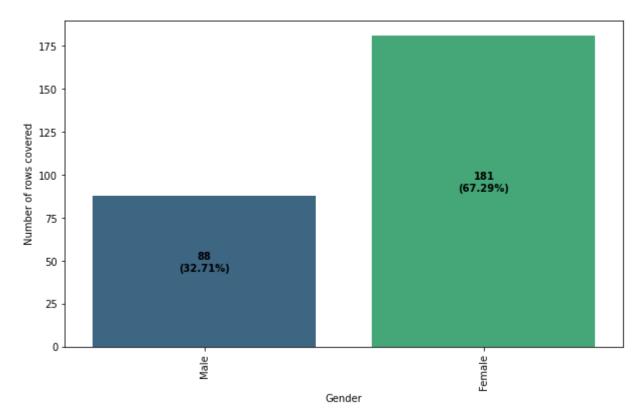
```
localhost:8888/nbconvert/html/Customer Retention Case Study.ipynb?download=false
```

df1['Purchase_Frequency'].value_counts()

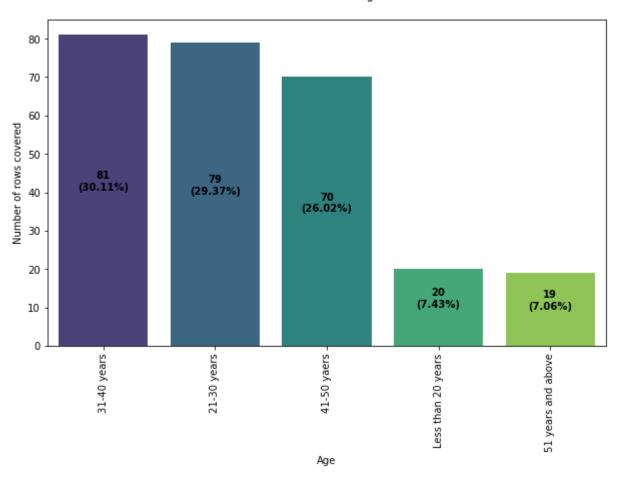
```
Out[45]: Less than 10 times
                                 114
          31-40 times
                                  63
         41 times and above
                                  53
          11-20 times
                                  29
          21-30 times
                                  10
         Name: Purchase Frequency, dtype: int64
In [46]:
          #Column name "Internet Access Mode" have "Mobile internet" value 2 times("I" of "Intern
          df1["Internet Access Mode"].replace("Mobile internet", "Mobile Internet", inplace=True)
          df1['Internet Access Mode'].value counts()
         Mobile Internet
                             189
Out[46]:
          Wi-Fi
                              76
         Dial-up
         Name: Internet_Access_Mode, dtype: int64
In [48]:
          object_datatype = []
          for x in df1.dtypes.index:
               if df1.dtypes[x] == '0':
                   object datatype.append(x)
          object datatype
          ['Gender',
Out[48]:
           'Age',
           'City Of Shopping',
           'Online Shopping_Since',
           'Purchase_Frequency',
           'Internet Access Mode',
           'Device Used',
           'Mobile Screen Size',
           'Device_Operating_System',
           'Browser Used',
           'Channel Followed',
           'Login_Mode',
           'Exploring_Time_Spent',
           'Payment_Mode',
           'Shopping Cart Abandon Frequency',
           'Bag Abandon Reason',
           'Content Readability'
           'Similar Product Info',
           'Seller Product_Info',
           'Product Info Clarity',
           'Website Navigation Ease',
           'Loading Processing Speed',
           'User Friendly Interface',
           'Conveninet Payment Mode',
           'Timely Fulfilment Trust',
           'Customer_Empathy',
           'Customer_Privacy_Guarantee',
           'Several_Channels_Responses',
           'Discount Benefit',
           'Online Shopping Enjoyment',
           'Online Shopping Convenience Flexibility',
           'Return_Replace_Policy',
           'Loyalty Program Access'
           'Quality Information Satisfaction',
           'Quality Satisfaction',
           'Net_Benefit_Satisfaction',
           'Users Trust',
           'Product Categories',
           'Relevant Product Information',
           'Monetary Savings',
           'Patronizing_Convenience',
           'Adventure Sense',
```

```
'Enhances_Social_Status',
           'Shopping Gratification',
           'Role Fulfilment',
           'Worth_of_Money',
           'Shopped From Retailer',
           'Ease_Website_Application',
           'Visually Appealing layout',
           'Product Variety',
           'Complete Product Information',
           'Fast_Loading_Speed_Web_App',
           'Reliable_Website_Application',
           'Quick Purchase',
           'Payment_Options',
           'Fast_Delivery',
           'Customer Info Privacy',
           'Customer Financial Info Security',
           'Perceived_Trustworthiness',
           'Multi_Channel_Assistance',
           'Loading Logging_Time',
           'Loading Graphics Photo Display Time',
           'Late_Price_Declare',
           'Page Loading Time',
           'Limited Payment Mode',
           'Late_Delivery',
           'Design Change of Web App',
           'Page_Disruption',
           'Website Efficiency'
           'Recommend to Friend']
In [49]:
          for col in df1[object datatype]:
               plt.figure(figsize=(10,6))
               col name = col
               values = df1[col name].value counts()
               ax = sns.countplot(df1[col name], palette="viridis")
               for i in ax.patches:
                   h = i.get height() # getting the count of each value
                   t = len(df1[col_name]) # getting the total number of records using length
                   s = f''\{h\} \setminus (\{round(h*100/t,2)\}\%)'' # making the string for displaying in count b
                   plt.text(index, h/2, s, ha="center", fontweight="bold")
                   index += 1
               plt.title(f"Count Plot for {col name}\n")
               plt.xlabel(col_name)
               plt.ylabel(f"Number of rows covered")
               plt.xticks(rotation=90)
               plt.show()
```

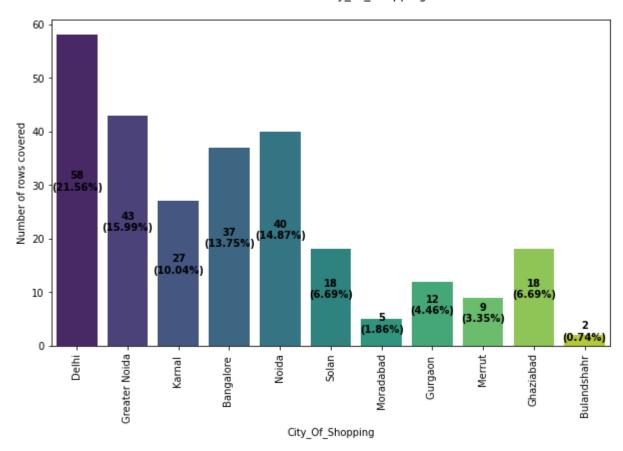
Count Plot for Gender



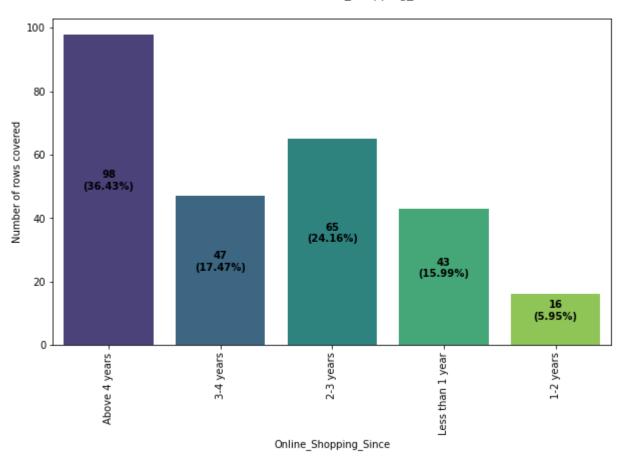
Count Plot for Age



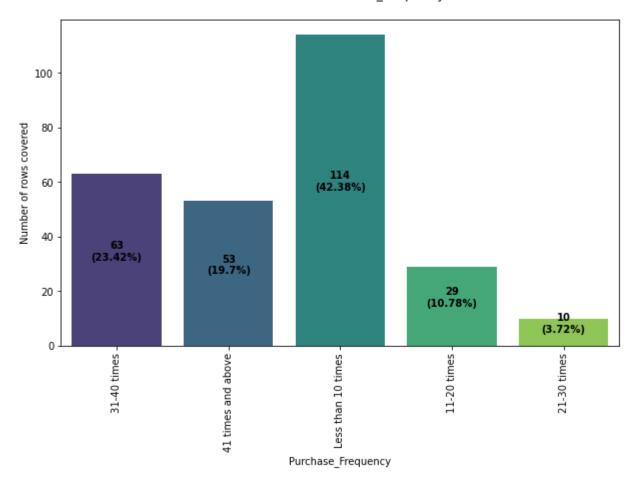
Count Plot for City_Of_Shopping



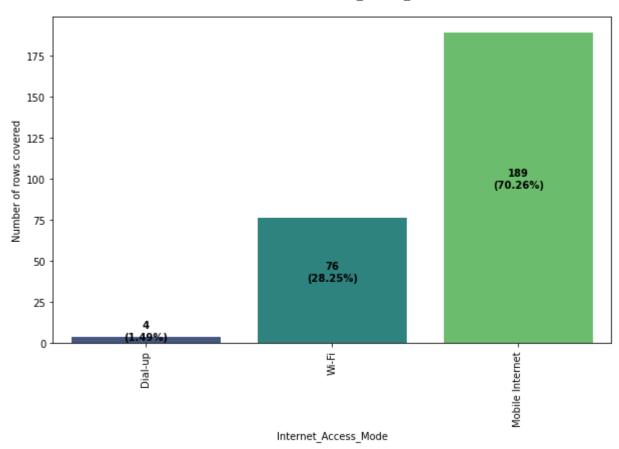




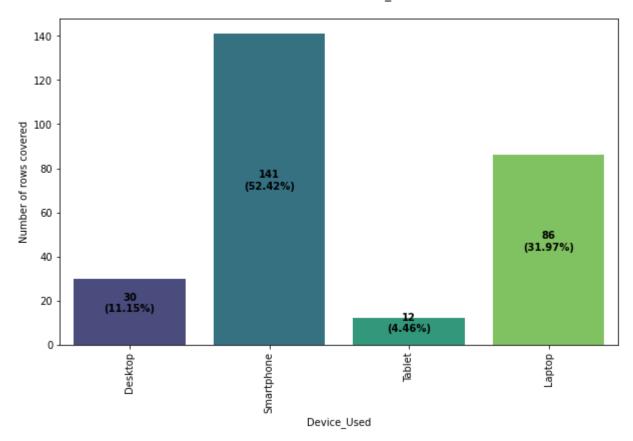
Count Plot for Purchase_Frequency



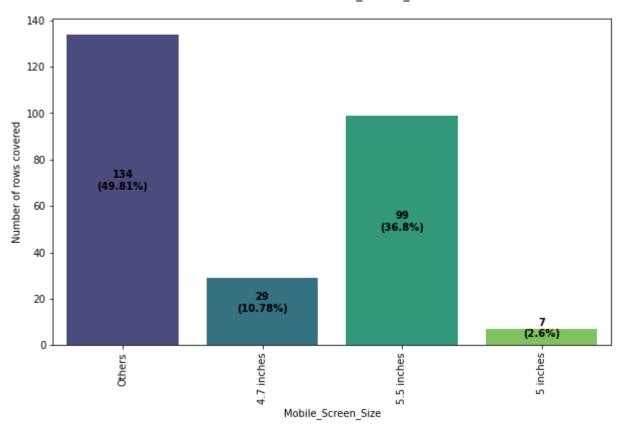
Count Plot for Internet_Access_Mode



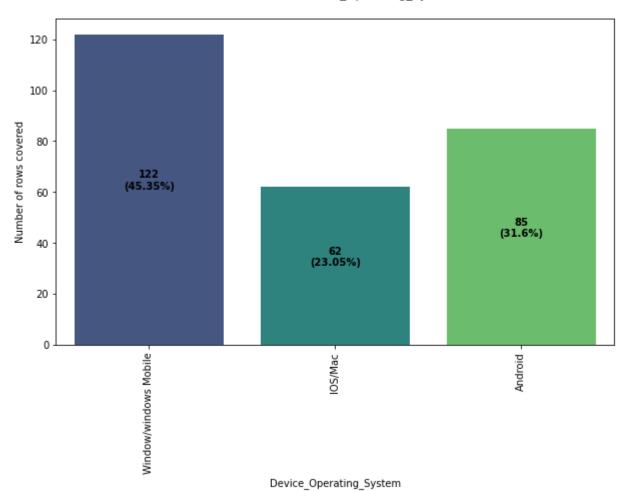
Count Plot for Device_Used



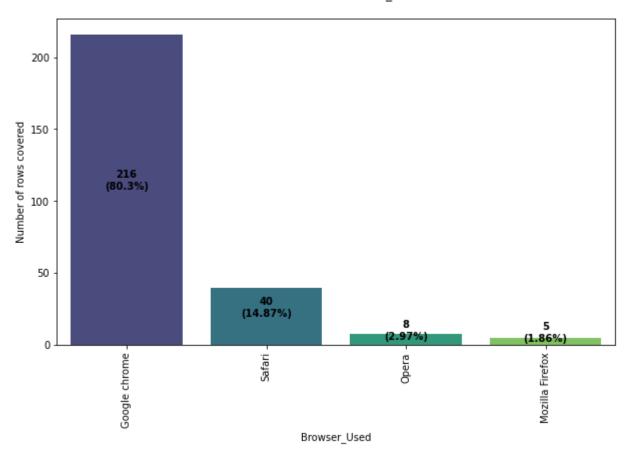
Count Plot for Mobile_Screen_Size



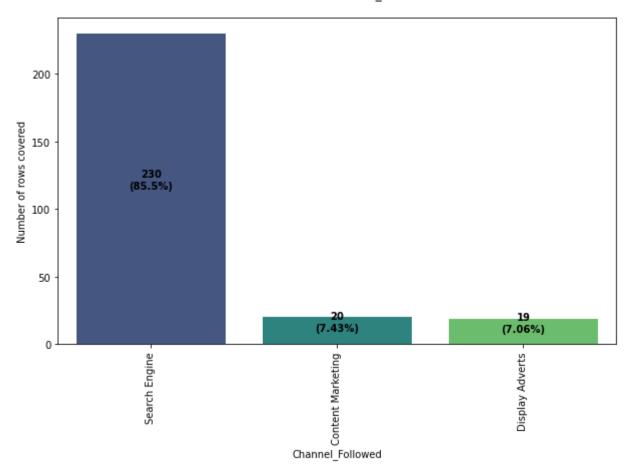
Count Plot for Device_Operating_System



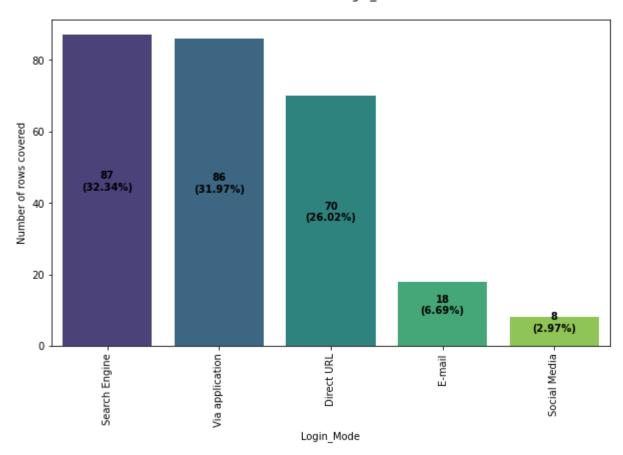
Count Plot for Browser_Used



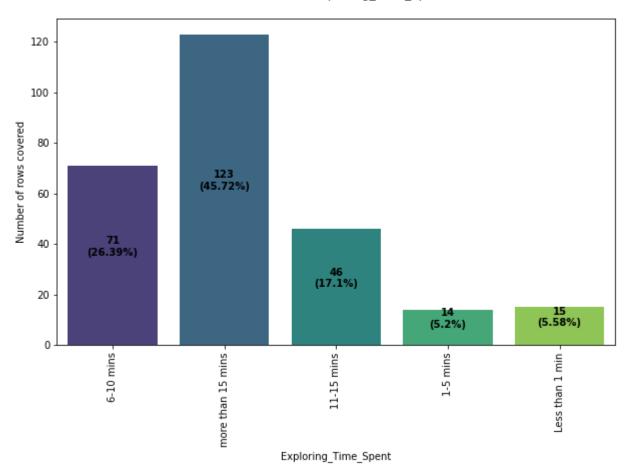
Count Plot for Channel_Followed



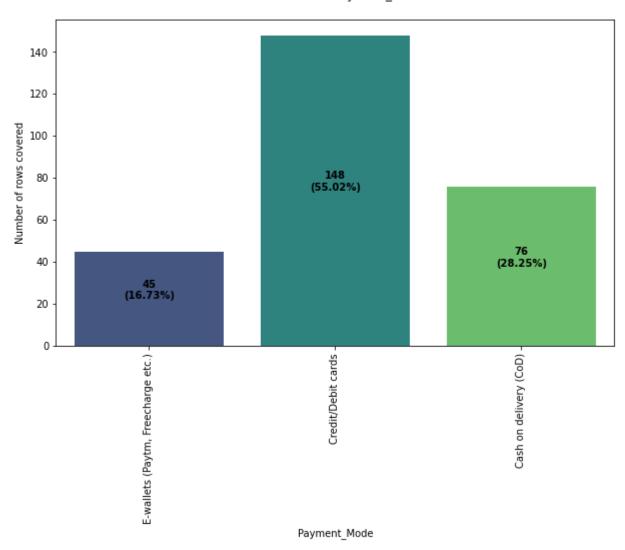
Count Plot for Login_Mode



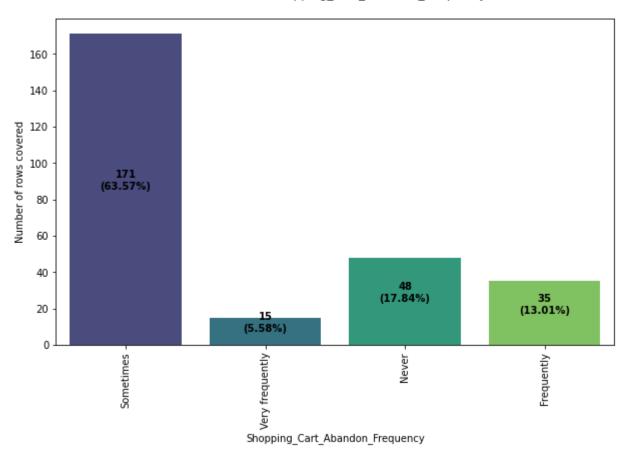




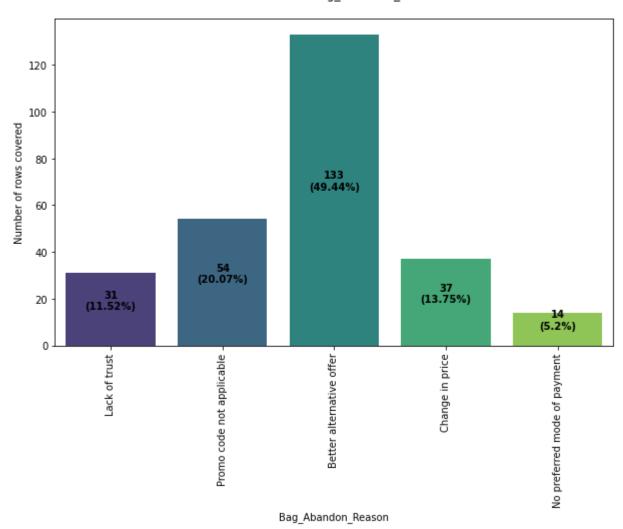
Count Plot for Payment_Mode



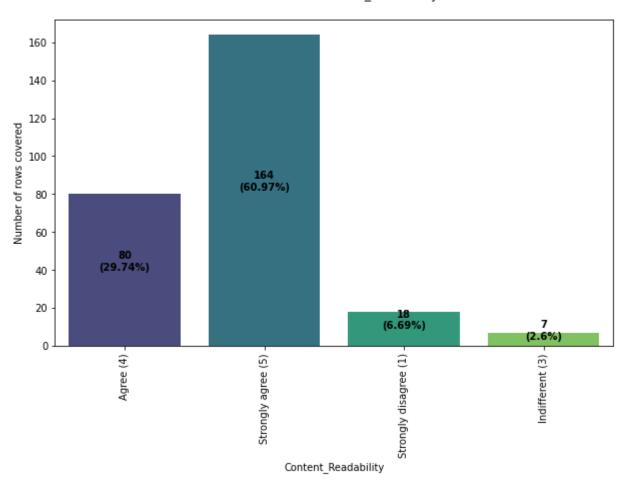
Count Plot for Shopping_Cart_Abandon_Frequency



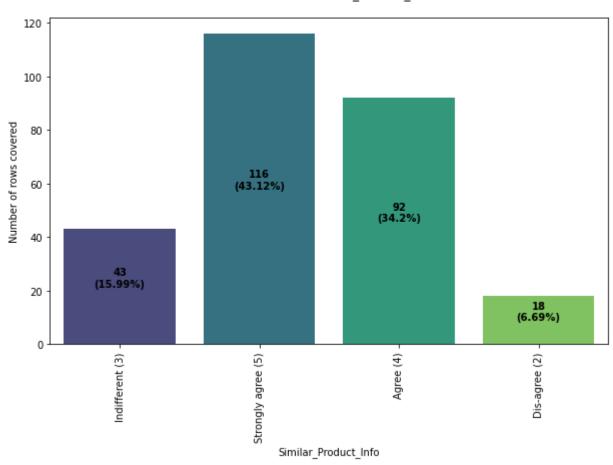
Count Plot for Bag_Abandon_Reason



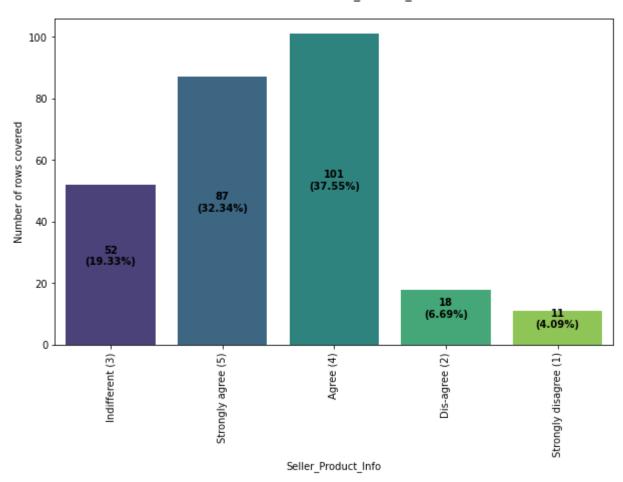
Count Plot for Content_Readability



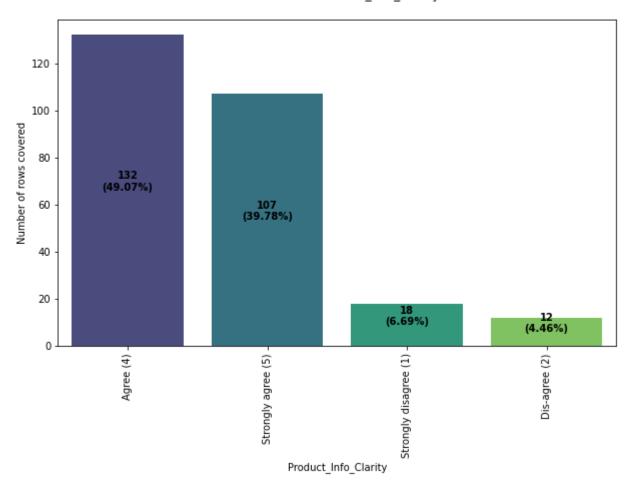
Count Plot for Similar_Product_Info



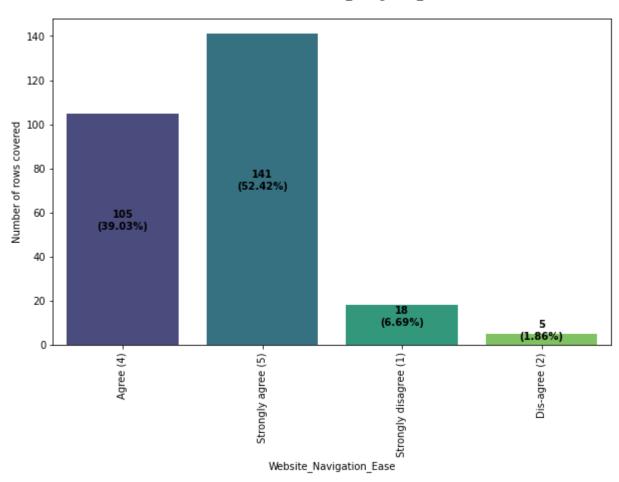
Count Plot for Seller_Product_Info



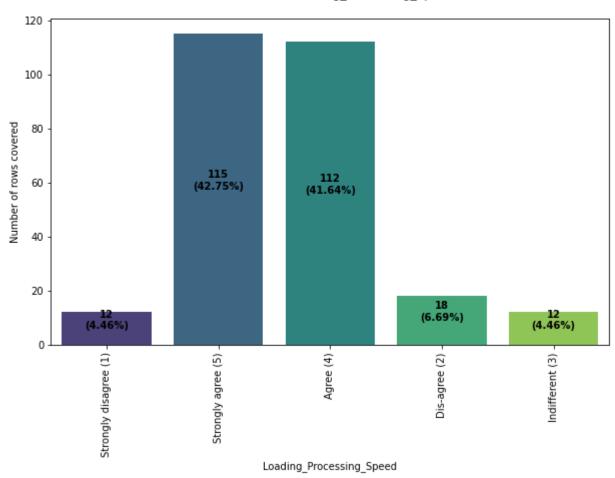
Count Plot for Product_Info_Clarity



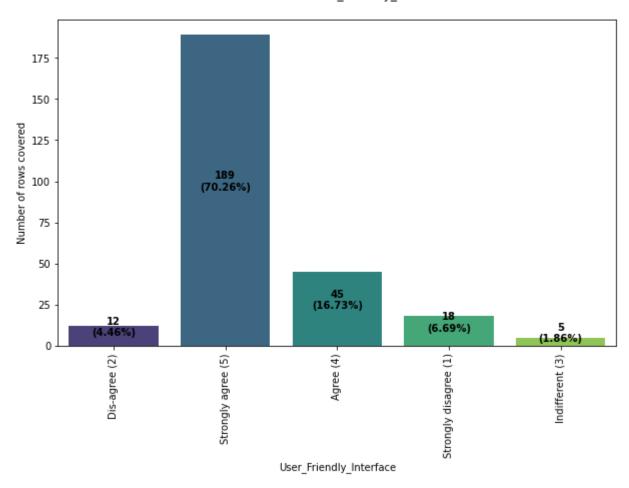
Count Plot for Website_Navigation_Ease



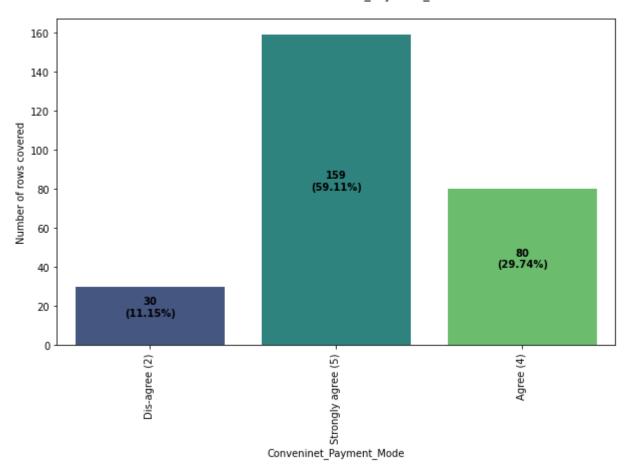
Count Plot for Loading_Processing_Speed



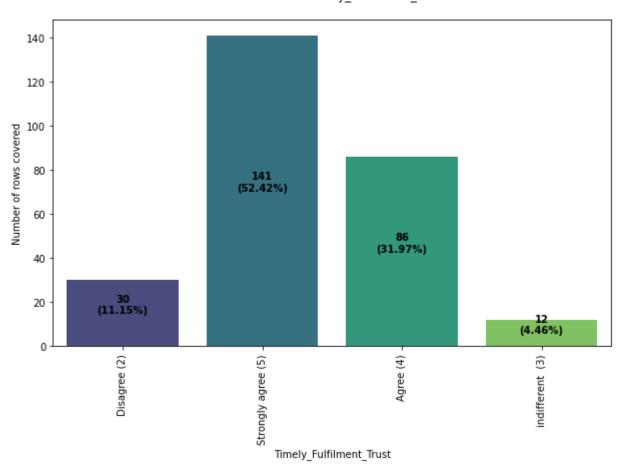
Count Plot for User_Friendly_Interface



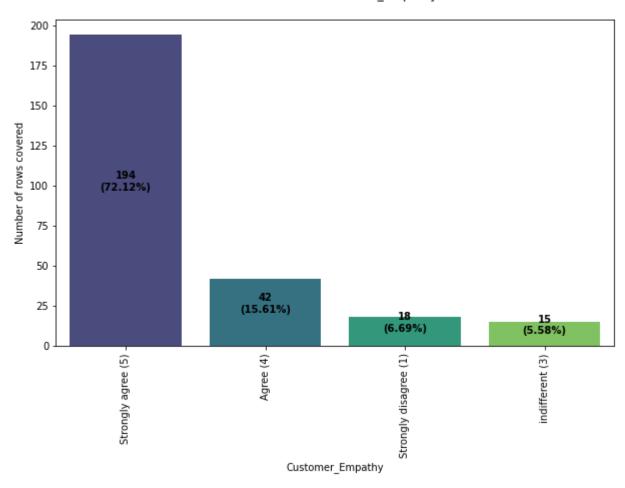
Count Plot for Conveninet_Payment_Mode



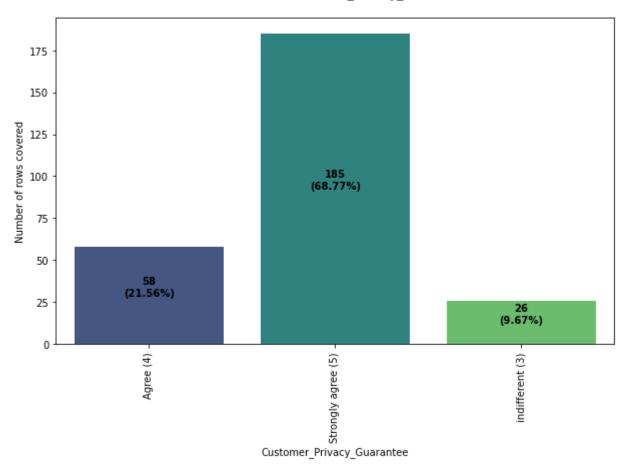
Count Plot for Timely_Fulfilment_Trust



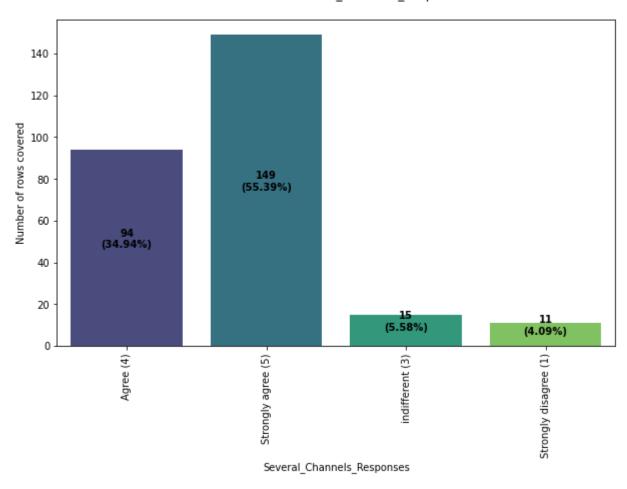
Count Plot for Customer_Empathy



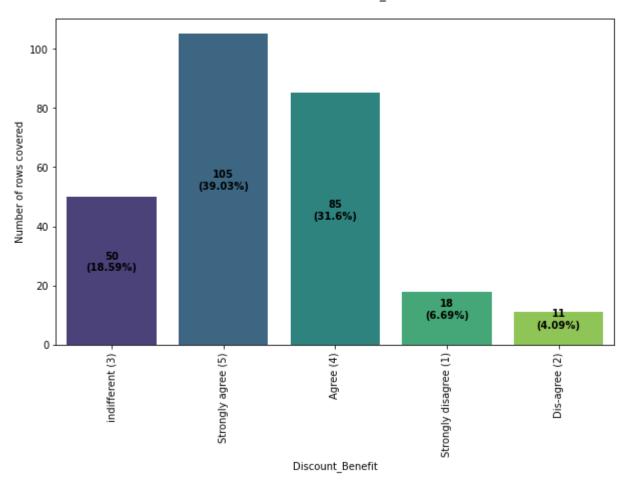
Count Plot for Customer_Privacy_Guarantee



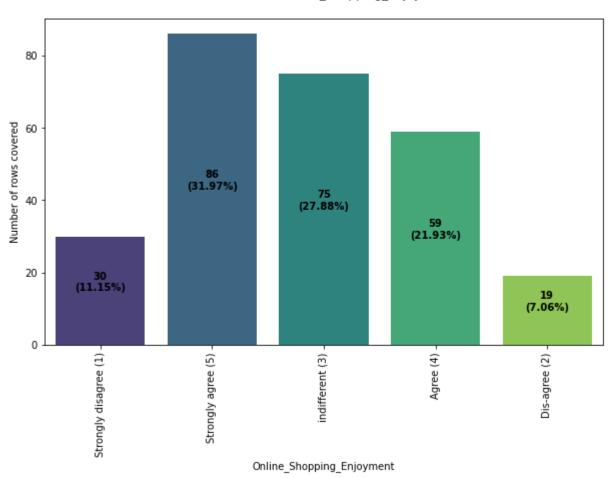
Count Plot for Several_Channels_Responses



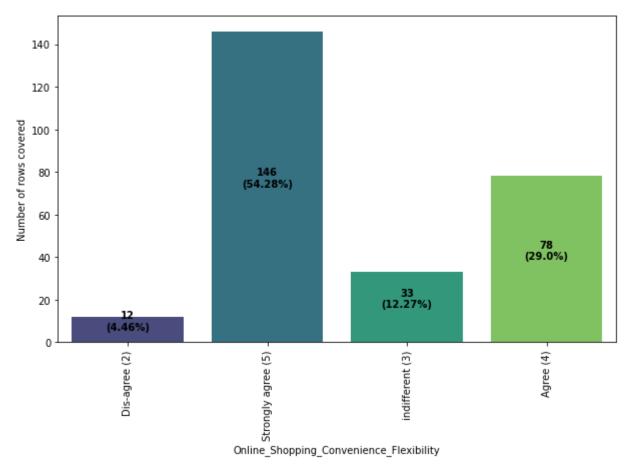
Count Plot for Discount_Benefit



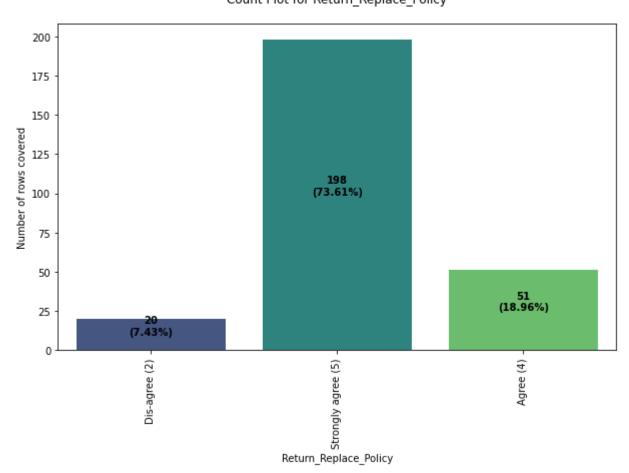
Count Plot for Online_Shopping_Enjoyment



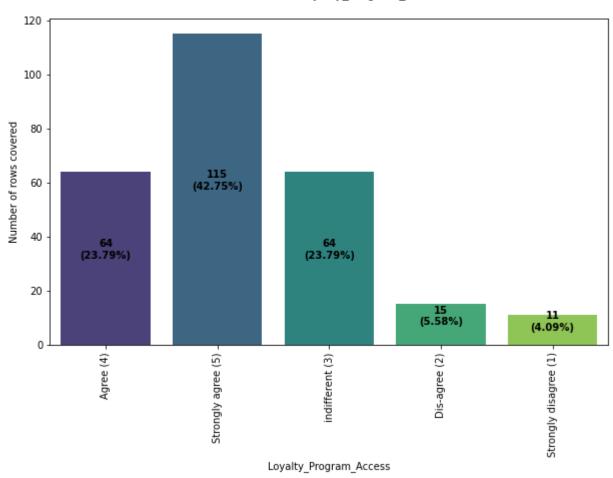
Count Plot for Online_Shopping_Convenience_Flexibility



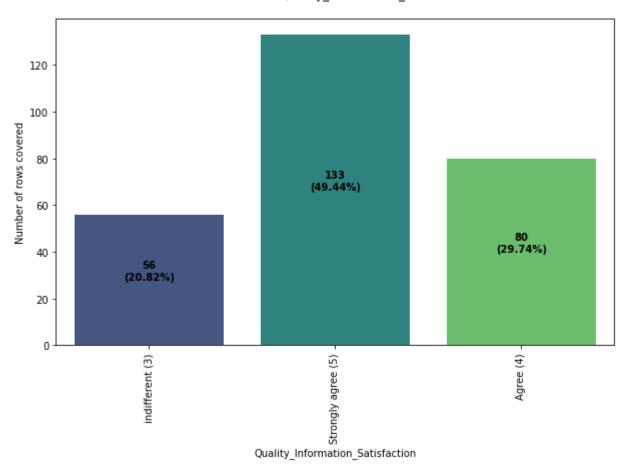
Count Plot for Return_Replace_Policy



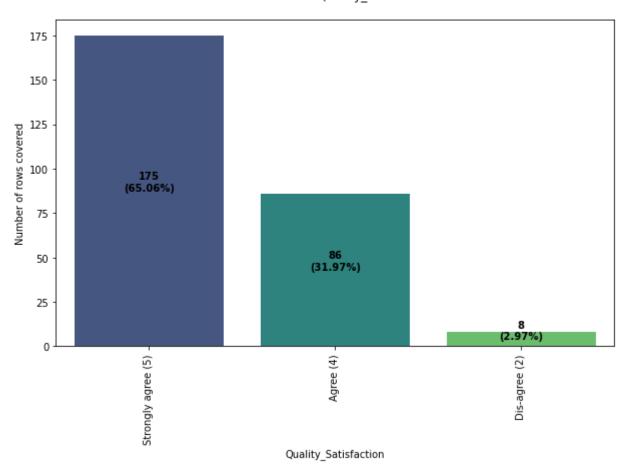
Count Plot for Loyalty_Program_Access



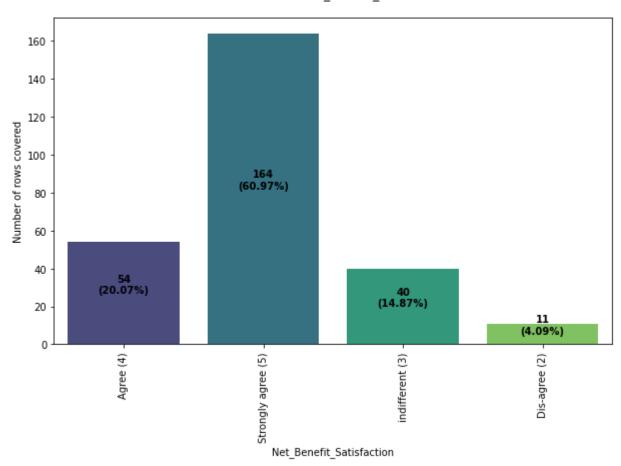
Count Plot for Quality_Information_Satisfaction



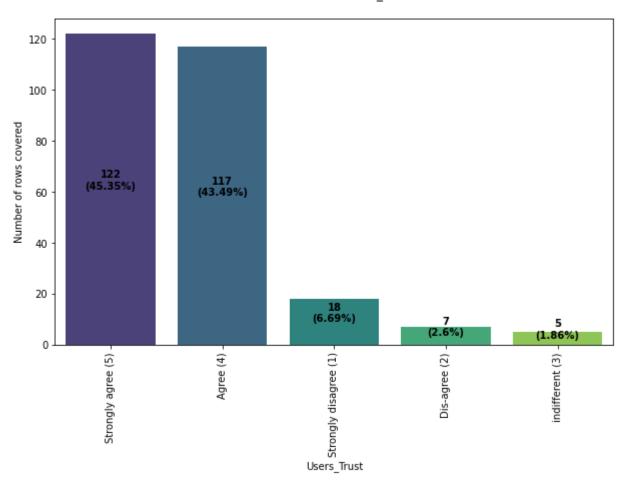
Count Plot for Quality_Satisfaction



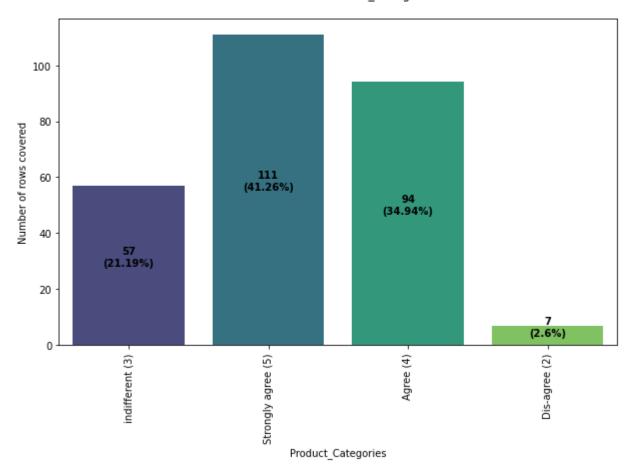
Count Plot for Net_Benefit_Satisfaction



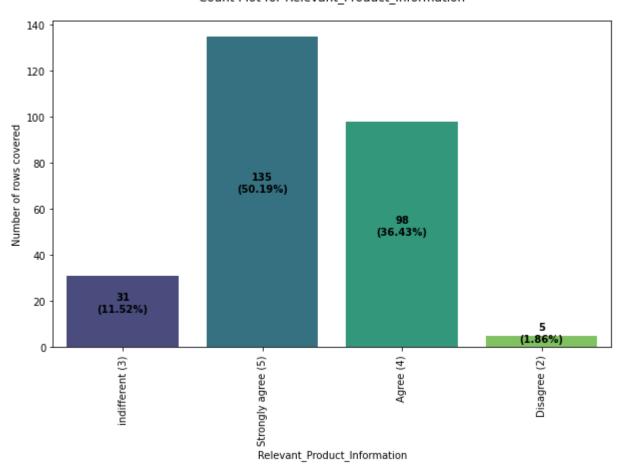
Count Plot for Users_Trust



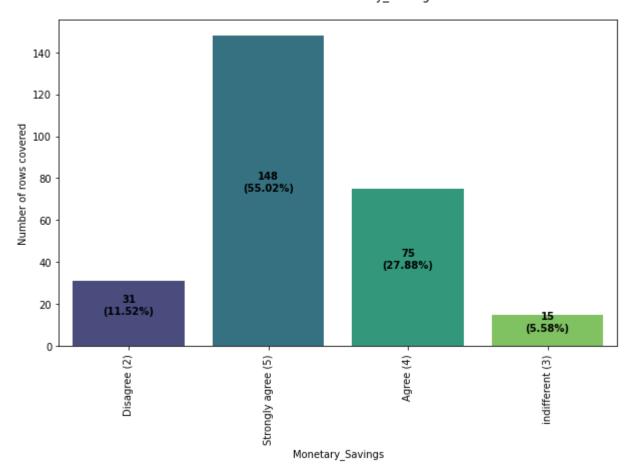
Count Plot for Product_Categories



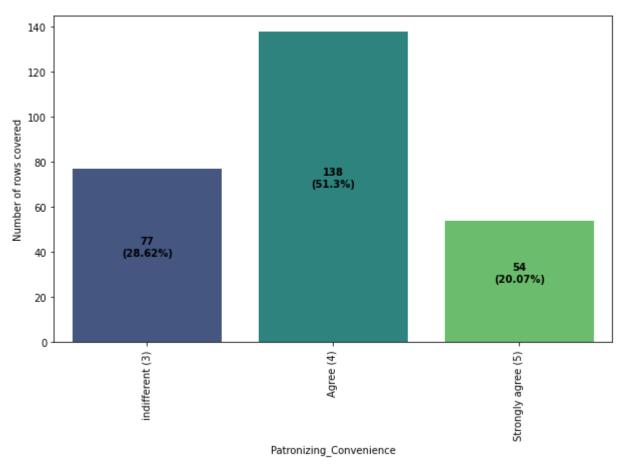
Count Plot for Relevant_Product_Information



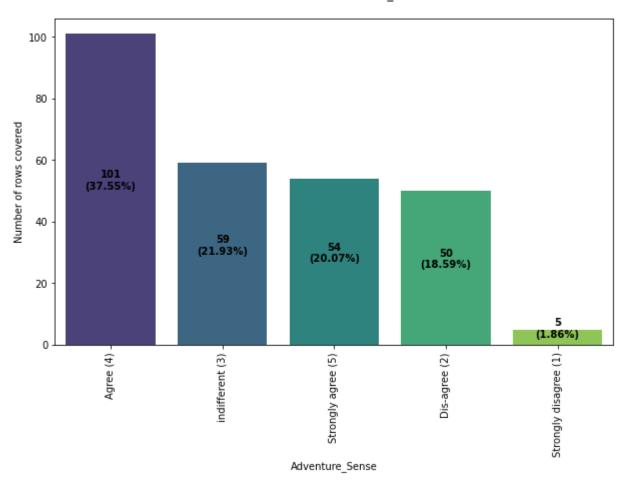
Count Plot for Monetary_Savings



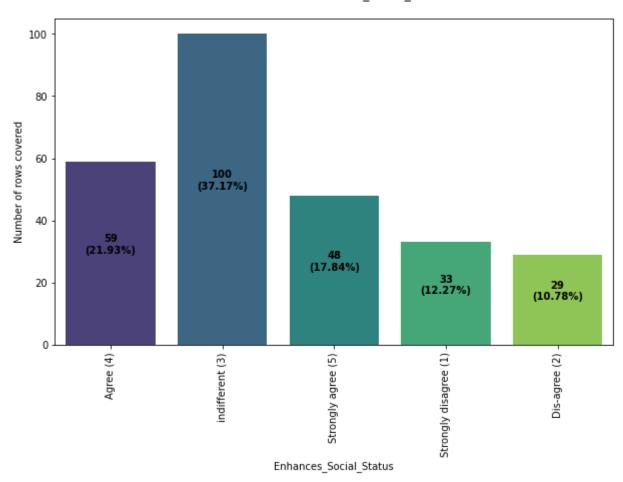
Count Plot for Patronizing_Convenience



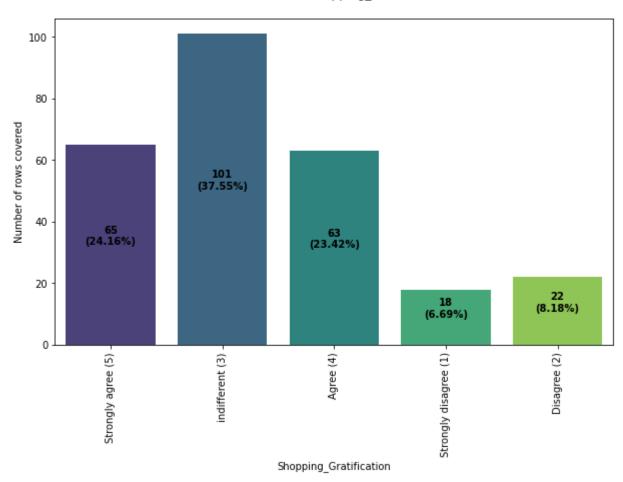
Count Plot for Adventure_Sense



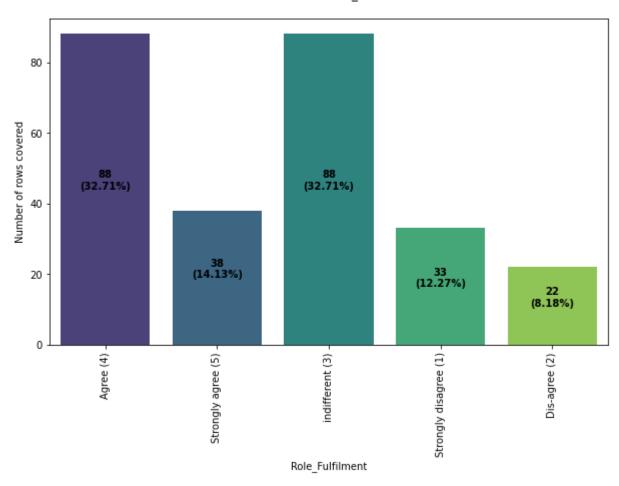
Count Plot for Enhances_Social_Status



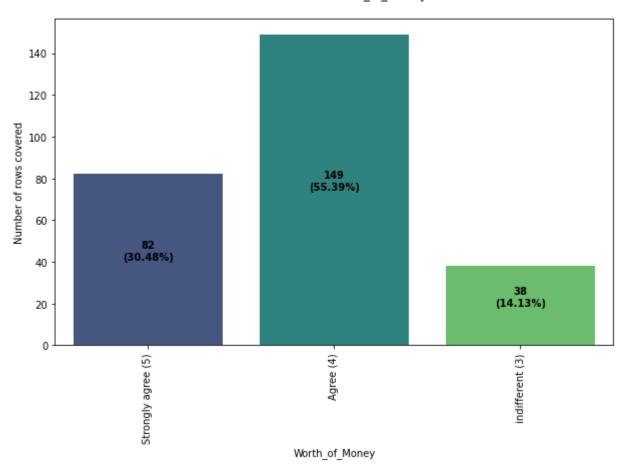
Count Plot for Shopping_Gratification



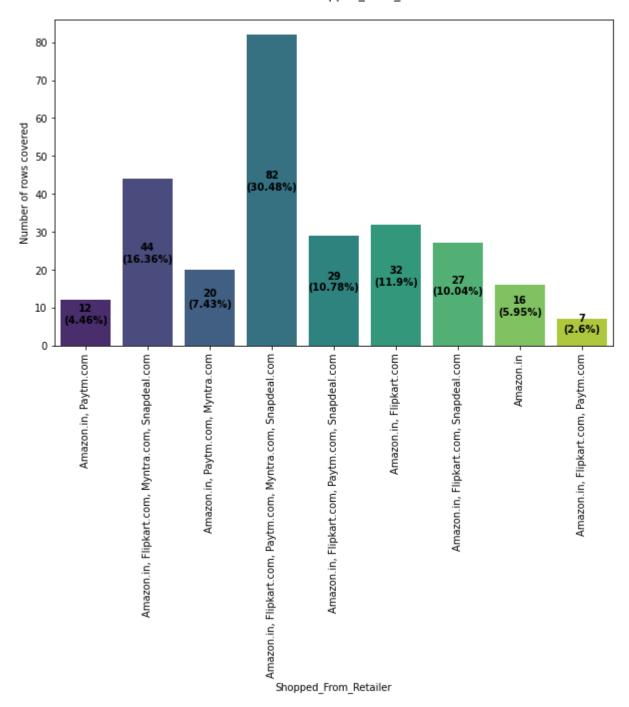
Count Plot for Role_Fulfilment



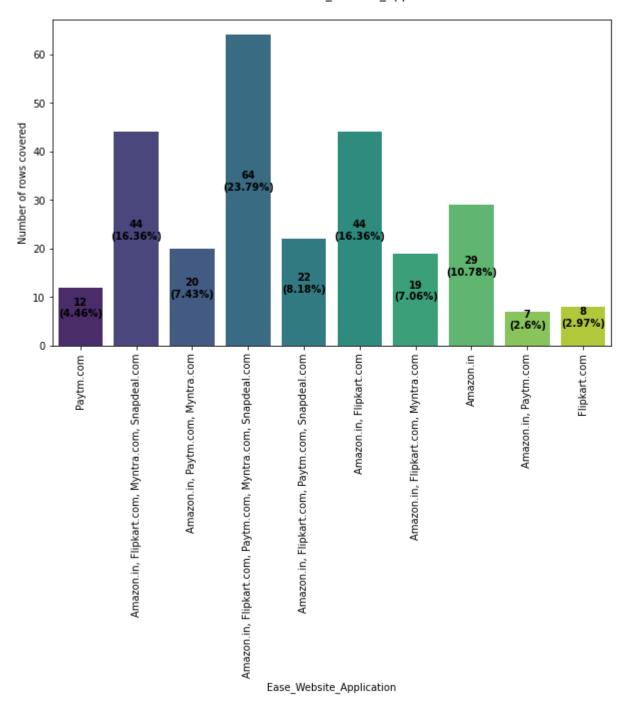
Count Plot for Worth_of_Money



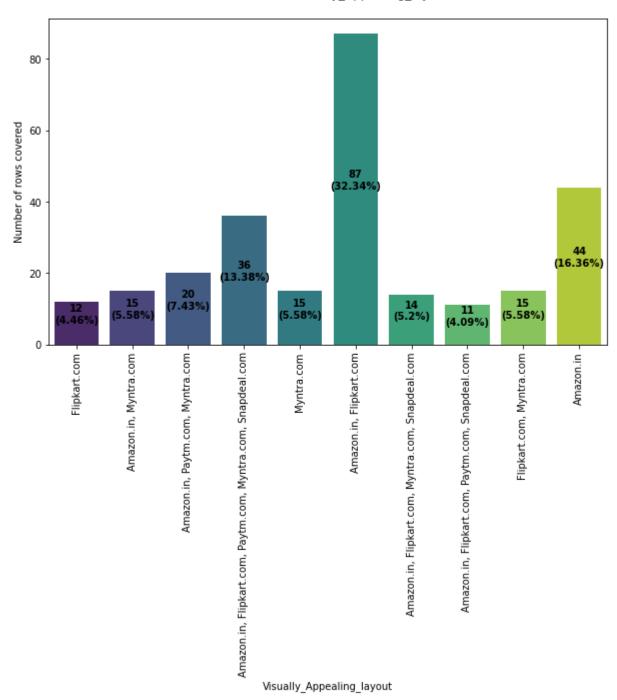
Count Plot for Shopped_From_Retailer



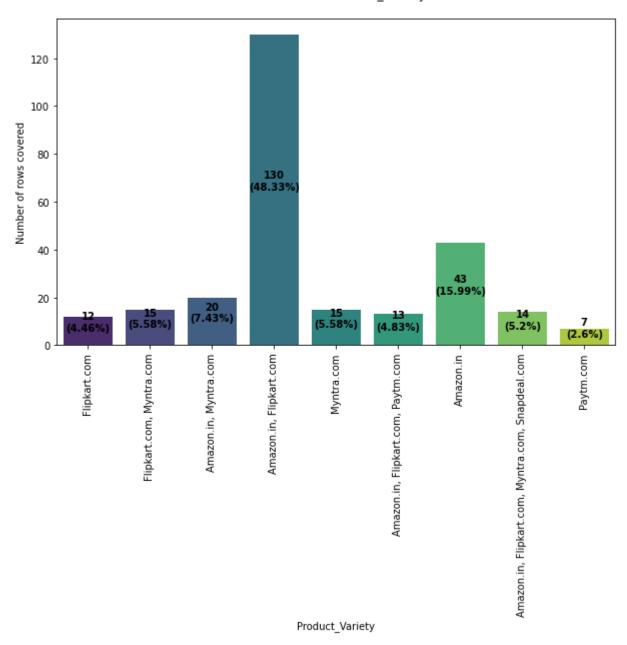
Count Plot for Ease_Website_Application



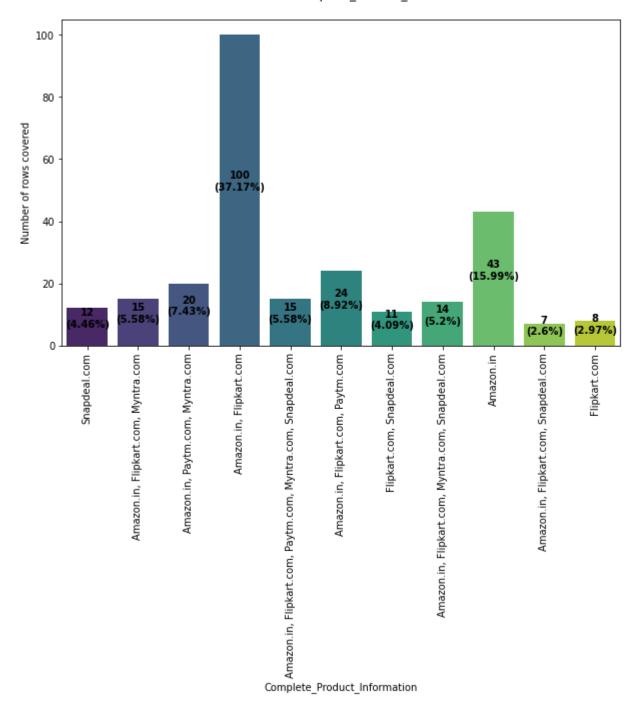
Count Plot for Visually_Appealing_layout



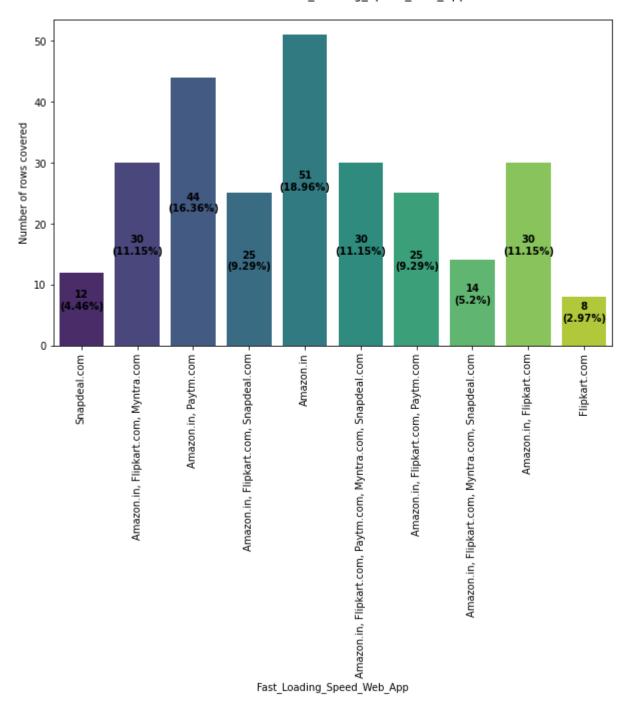
Count Plot for Product_Variety



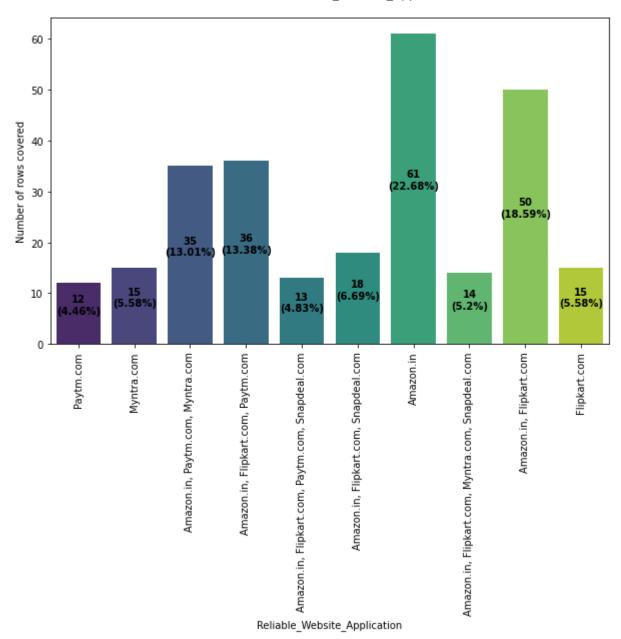
Count Plot for Complete_Product_Information



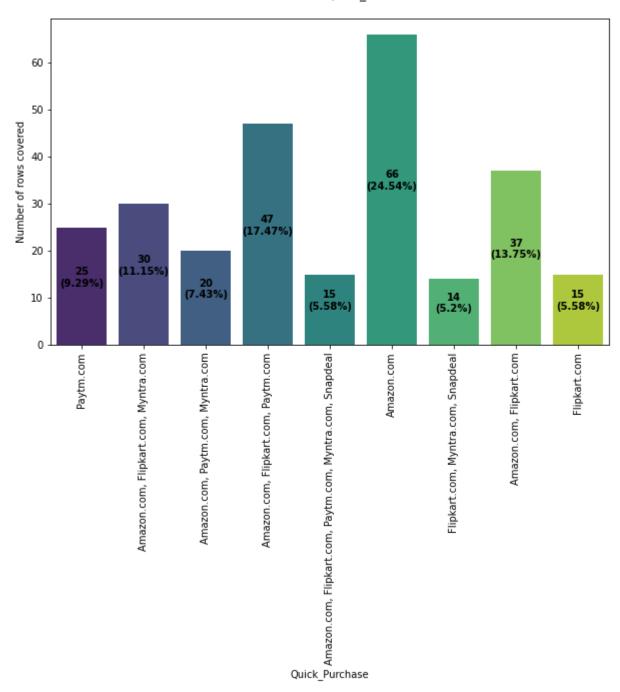
Count Plot for Fast_Loading_Speed_Web_App



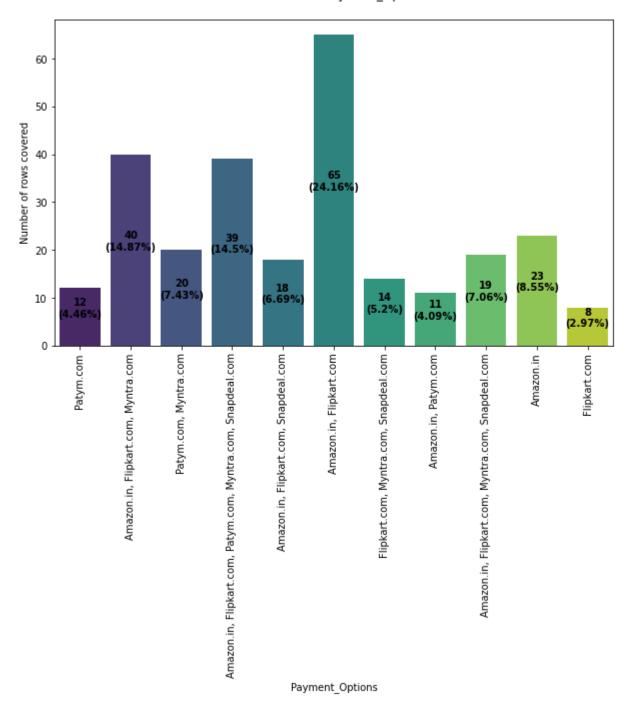
Count Plot for Reliable_Website_Application



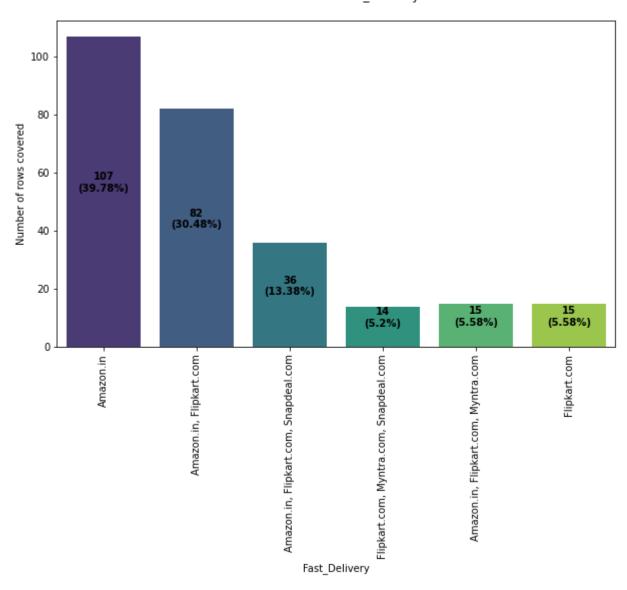
Count Plot for Quick_Purchase



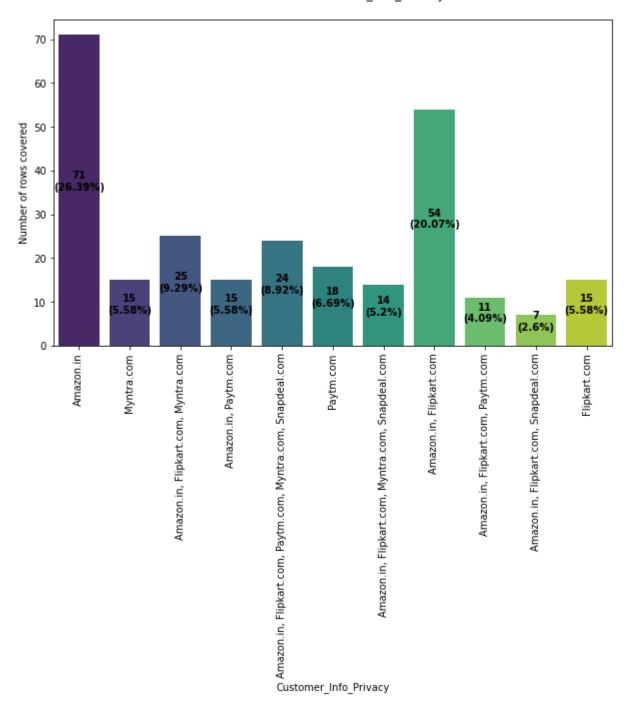
Count Plot for Payment_Options



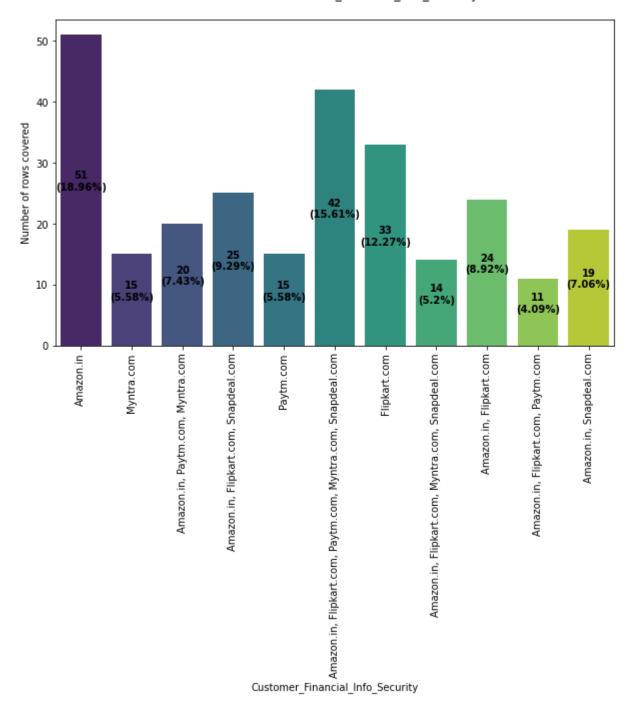
Count Plot for Fast_Delivery



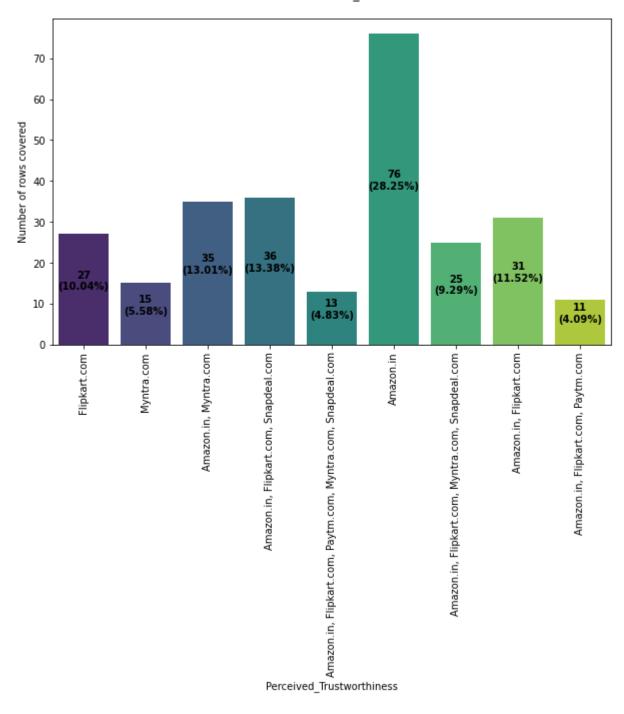
Count Plot for Customer_Info_Privacy



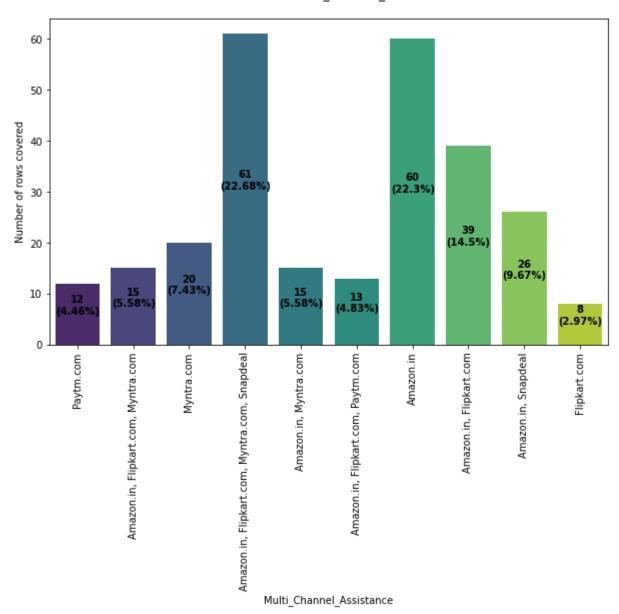
Count Plot for Customer_Financial_Info_Security



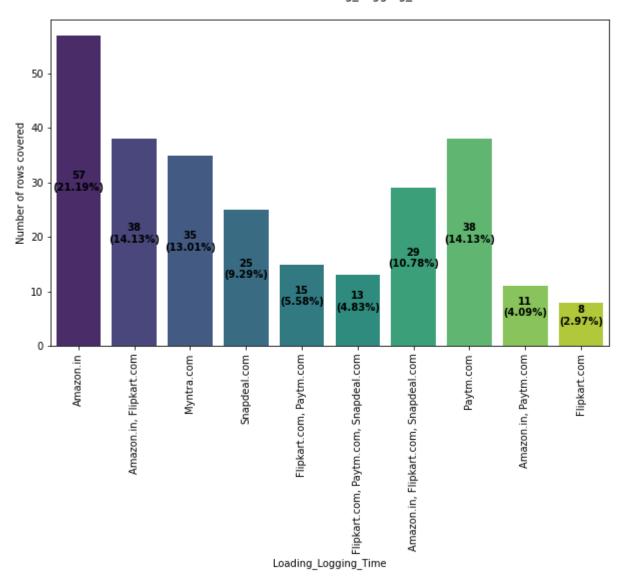
Count Plot for Perceived_Trustworthiness



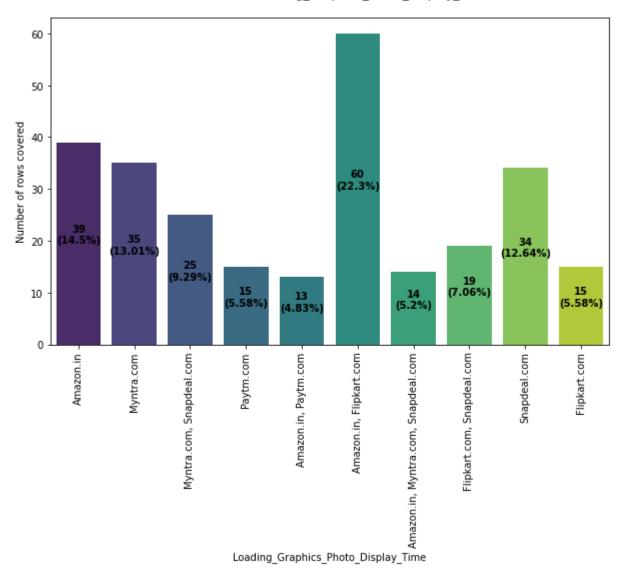
Count Plot for Multi_Channel_Assistance



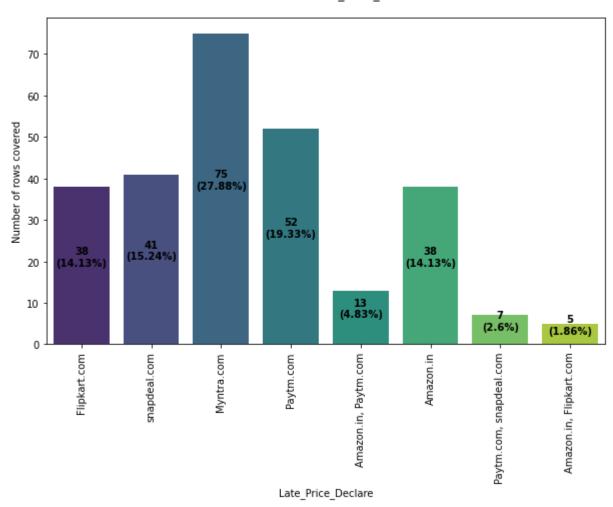
Count Plot for Loading_Logging_Time



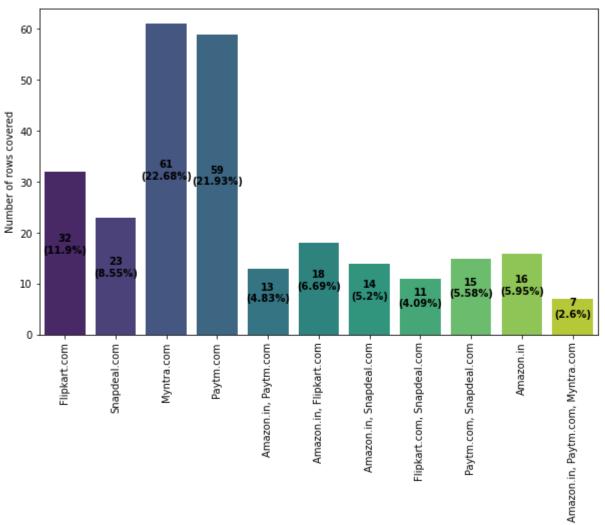
Count Plot for Loading_Graphics_Photo_Display_Time



Count Plot for Late_Price_Declare

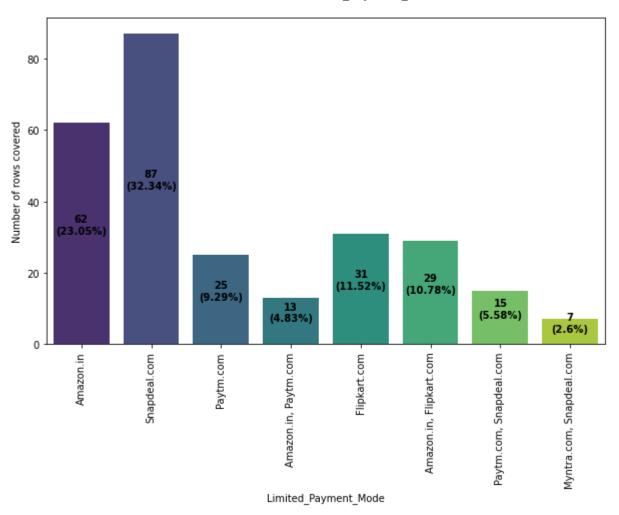


Count Plot for Page_Loading_Time

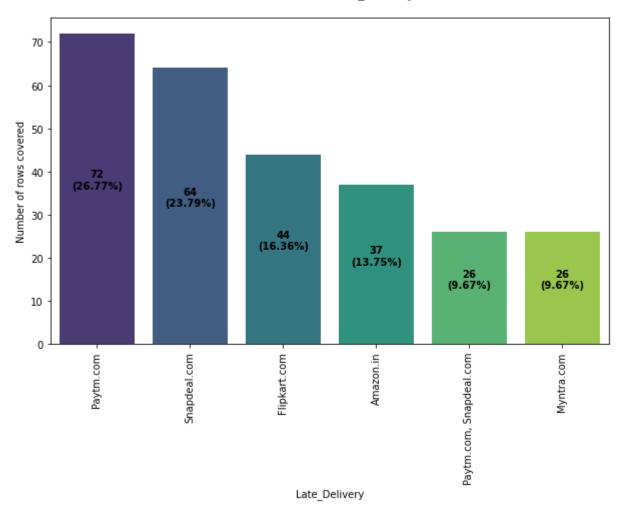


Page_Loading_Time

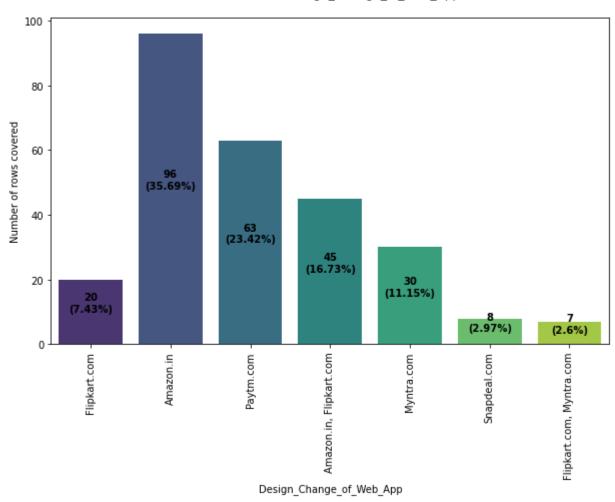
Count Plot for Limited_Payment_Mode



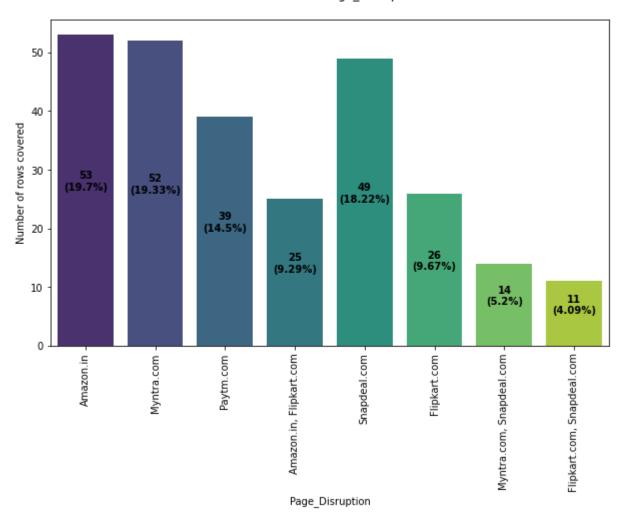
Count Plot for Late_Delivery



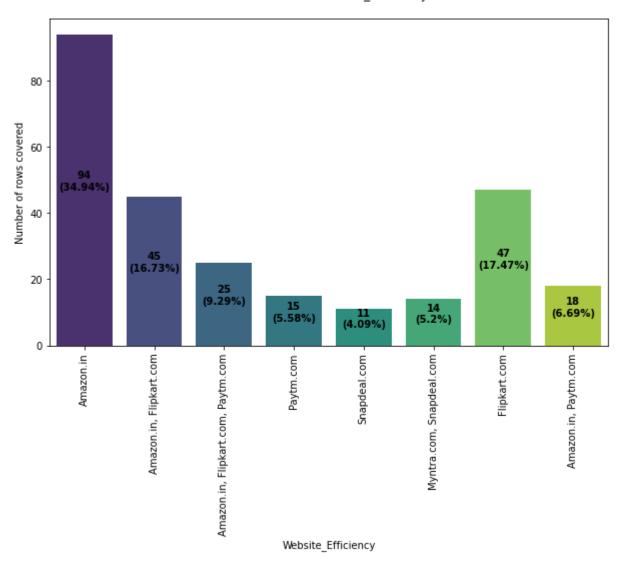
Count Plot for Design_Change_of_Web_App



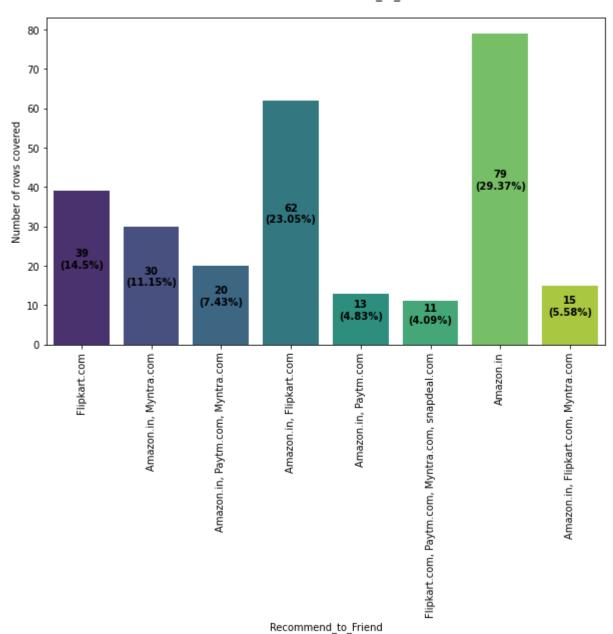
Count Plot for Page_Disruption



Count Plot for Website_Efficiency



Count Plot for Recommend to Friend



We can observe obove all graph where we can see that count and their comparision with all other values.

Observations:

- Pin code: 201308 (Uttar Pradesh) has the maximum number of counts for online shopping.
- Female buyer has more number of count than male in the Dataset.
- Buyer Age between 31 to 40 years is more followed by 21-30 years for online shopping.
- Delhi city has a maximum number of buyers followed by greater Noida & Noida. Bulandshahr city has a minimum number of buyers for online shopping.
- Tenure wise maximum buyers are preferred online shopping since 4+ years.
- Maximum number of online buyers purchased less than 10 products in past one year.
- Using mobile phone internet is more for online shopping.
- Smart Phone has been used more for online shopping followed by laptop.

- Smartphones having screen sizes other than 4.7, 5.5 & 5 inches had been used more times for online shopping.
- Devices having a windows operating system has been used often more for online shopping followed by android.
- Google Chrome browser is used maximum times to access the website as compared to other browsers.
- Search engine is more useful for the potential online buyers, also after the 1st visit to the store, the search engine has been used more to locate the website.
- Usually buyers explore the particular website more than 15 times before making a purchase decision.
- Credit/Debit has been used more than other options for online purchases.
- Maximum buyer chooses to add the product to the cart & leave without making payment because of a better alternative offer.
- Content & all relevant information on the website is easy to read & understand, also easy to navigate for a maximum number of the online buyer.
- Maximum number of people strongly agree that information on a similar product to the one highlighted is important for product comparison.
- Maximum number of people strongly agree that complete information on the listed sellers and the product being offered is important for purchase decisions.
- Most buyers strongly agree that the loading & processing speed of the website should be fast which makes the website user- friendly.
- For online purchases, the payment method is a key factor to retain the customer, also buyers trust that online retail stores would fulfill their part of the transaction at the stipulated time.
- More number of buyer strongly agree that customer service & customer privacy is very much important to retain the customer.
- Online shopping provides monetary benefits and discounts on the product that customers would buy for & visit the website again to shop more as it is value for money spent.
- Maximum number of people enjoys online shopping, which is more convenient & easy to use.
- Most buyers strongly agree that the return & replacement policy is important for purchase decisions.
- People strongly agreed that gaining access to loyalty programs is a benefit of online shopping.
- Maximum number of buyers strongly agree that provided quality information on the website improves satisfaction & trust of the customer.
- Offering a wide variety of products in several categories with correct information helps to retain the customer.
- Frequent online shopping gives a sense of adventure.
- Shopping on your preferred e-tailer enhances your social status is indifferent to the maximum number of buyers.
- Maximum buyer feels that it is ok to shop from a favorite e-tailer.
- Most people prefer to shop online from Amazon.in, Flipkart.com, Paytm.com, Myntra.com & Snapdeal.com as these are more user friendly.
- According to the survey, the best visually appealing web page layout is Amazon.in & flipkart.com.

- Wide variety of products & its offer are mostly available on Amazon.in & flipkart.com.
- Complete, relevant description information of products are available in Amazon.in & flipkart.com.
- Amazon is best in terms of Trustworthiness/reliability, quickness to complete purchase & fast loading speed on website & application.
- Amazon & Flipkart.com has several payment options whereas Snapdeal has a limited mode of payment method.
- Amazon comes in number 1 position in terms of delivery of products & security of customer information followed by flipkart.com whereas Paytm took longer time to deliver the products.
- Amazon.in provides the best customer support followed by Flipkart.com, Myntra.com, & Snapdeal.
- Flipkart.com takes less time to get logged in(promotion, sales period), however, Amazon.in takes a long time to logged in.
- When it comes to displaying graphics & photos(promotion, sales period), Amazon.in & flipkart.com take a longer time to load.
- Myntra delays to declare its sale price & offers, also took a long time to load the page followed by paytm.com.
- With time Amazon update/changes its website/Application design as Amazon disrupts frequently when moving one page to another & still works efficiently as before.
- Most recommended Indian online retailer by a friend is Amazon followed by Flipkart.

In [55]: p

```
pip install pandas-profiling
```

```
Collecting pandas-profiling
 Downloading pandas profiling-3.4.0-py2.py3-none-any.whl (315 kB)
Collecting statsmodels<0.14,>=0.13.2
  Downloading statsmodels-0.13.5-cp38-cp38-win amd64.whl (9.2 MB)
Requirement already satisfied: numpy<1.24,>=1.16.0 in c:\users\hp\anaconda3\lib\site-pac
kages (from pandas-profiling) (1.19.2)
Requirement already satisfied: PyYAML<6.1,>=5.0.0 in c:\users\hp\anaconda3\lib\site-pack
ages (from pandas-profiling) (5.3.1)
Collecting pydantic<1.11,>=1.8.1
  Downloading pydantic-1.10.2-cp38-cp38-win amd64.whl (2.2 MB)
Collecting htmlmin==0.1.12
 Downloading htmlmin-0.1.12.tar.gz (19 kB)
Requirement already satisfied: jinja2<3.2,>=2.11.1 in c:\users\hp\anaconda3\lib\site-pac
kages (from pandas-profiling) (2.11.2)
Requirement already satisfied: requests<2.29,>=2.24.0 in c:\users\hp\anaconda3\lib\site-
packages (from pandas-profiling) (2.24.0)
Collecting phik<0.13,>=0.11.1
  Downloading phik-0.12.2-cp38-cp38-win amd64.whl (677 kB)
Requirement already satisfied: matplotlib<3.6,>=3.2 in c:\users\hp\anaconda3\lib\site-pa
ckages (from pandas-profiling) (3.3.2)
Collecting missingno<0.6,>=0.4.2
 Downloading missingno-0.5.1-py3-none-any.whl (8.7 kB)
Requirement already satisfied: pandas!=1.4.0,<1.6,>1.1 in c:\users\hp\anaconda3\lib\site
-packages (from pandas-profiling) (1.1.3)
Collecting visions[type image path] == 0.7.5
  Downloading visions-0.7.5-py3-none-any.whl (102 kB)
Collecting multimethod<1.10,>=1.4
 Downloading multimethod-1.9-py3-none-any.whl (10 kB)
Requirement already satisfied: scipy<1.10,>=1.4.1 in c:\users\hp\anaconda3\lib\site-pack
ages (from pandas-profiling) (1.5.2)
Requirement already satisfied: seaborn<0.13,>=0.10.1 in c:\users\hp\anaconda3\lib\site-p
ackages (from pandas-profiling) (0.11.0)
```

```
Requirement already satisfied: tqdm<4.65,>=4.48.2 in c:\users\hp\anaconda3\lib\site-pack
ages (from pandas-profiling) (4.50.2)
Collecting patsy>=0.5.2
  Downloading patsy-0.5.3-py2.py3-none-any.whl (233 kB)
Collecting packaging>=21.3
  Downloading packaging-21.3-py3-none-any.whl (40 kB)
Collecting typing-extensions>=4.1.0
  Downloading typing extensions-4.4.0-py3-none-any.whl (26 kB)
Requirement already satisfied: MarkupSafe>=0.23 in c:\users\hp\anaconda3\lib\site-packag
es (from jinja2<3.2,>=2.11.1->pandas-profiling) (1.1.1)
Collecting urllib3!=1.25.0,!=1.25.1,<1.26,>=1.21.1
  Downloading urllib3-1.25.11-py2.py3-none-any.whl (127 kB)
Requirement already satisfied: certifi>=2017.4.17 in c:\users\hp\anaconda3\lib\site-pack
ages (from requests<2.29,>=2.24.0->pandas-profiling) (2022.9.24)
Requirement already satisfied: idna<3,>=2.5 in c:\users\hp\anaconda3\lib\site-packages
(from requests<2.29,>=2.24.0->pandas-profiling) (2.10)
Requirement already satisfied: chardet<4,>=3.0.2 in c:\users\hp\anaconda3\lib\site-packa
ges (from requests<2.29,>=2.24.0->pandas-profiling) (3.0.4)
Requirement already satisfied: joblib>=0.14.1 in c:\users\hp\anaconda3\lib\site-packages
(from phik<0.13,>=0.11.1->pandas-profiling) (1.2.0)
Requirement already satisfied: pyparsing!=2.0.4,!=2.1.2,!=2.1.6,>=2.0.3 in c:\users\hp\a
naconda3\lib\site-packages (from matplotlib<3.6,>=3.2->pandas-profiling) (2.4.7)
Requirement already satisfied: cycler>=0.10 in c:\users\hp\anaconda3\lib\site-packages
(from matplotlib<3.6,>=3.2->pandas-profiling) (0.10.0)
Requirement already satisfied: kiwisolver>=1.0.1 in c:\users\hp\anaconda3\lib\site-packa
ges (from matplotlib<3.6,>=3.2->pandas-profiling) (1.3.0)
Requirement already satisfied: pillow>=6.2.0 in c:\users\hp\anaconda3\lib\site-packages
(from matplotlib<3.6,>=3.2->pandas-profiling) (8.0.1)
Requirement already satisfied: python-dateutil>=2.1 in c:\users\hp\anaconda3\lib\site-pa
ckages (from matplotlib<3.6,>=3.2->pandas-profiling) (2.8.1)
Requirement already satisfied: pytz>=2017.2 in c:\users\hp\anaconda3\lib\site-packages
(from pandas!=1.4.0,<1.6,>1.1->pandas-profiling) (2020.1)
Requirement already satisfied: networkx>=2.4 in c:\users\hp\anaconda3\lib\site-packages
(from visions[type image path]==0.7.5->pandas-profiling) (2.5)
Requirement already satisfied: attrs>=19.3.0 in c:\users\hp\anaconda3\lib\site-packages
(from visions[type_image_path] == 0.7.5->pandas-profiling) (20.3.0)
Collecting tangled-up-in-unicode>=0.0.4
  Downloading tangled up in unicode-0.2.0-py3-none-any.whl (4.7 MB)
Collecting imagehash; extra == "type image path"
  Downloading ImageHash-4.3.1-py2.py3-none-any.whl (296 kB)
Requirement already satisfied: six in c:\users\hp\anaconda3\lib\site-packages (from pats
y>=0.5.2->statsmodels<0.14,>=0.13.2->pandas-profiling) (1.15.0)
Requirement already satisfied: decorator>=4.3.0 in c:\users\hp\anaconda3\lib\site-packag
es (from networkx>=2.4->visions[type image path]==0.7.5->pandas-profiling) (4.4.2)
Requirement already satisfied: PyWavelets in c:\users\hp\anaconda3\lib\site-packages (fr
om imagehash; extra == "type image path"->visions[type image path]==0.7.5->pandas-profil
ing) (1.1.1)
Building wheels for collected packages: htmlmin
  Building wheel for htmlmin (setup.py): started
 Building wheel for htmlmin (setup.py): finished with status 'done'
  Created wheel for htmlmin: filename=htmlmin-0.1.12-py3-none-any.whl size=27091 sha256=
82dcafd0c4f92baba0aedac4bd1f132f9e18e41fcbd0cba1f5e187cfc8cb9a37
  Stored in directory: c:\users\hp\appdata\local\pip\cache\wheels\23\14\6e\4be5bfeeb027f
4939a01764b48edd5996acf574b0913fe5243
Successfully built htmlmin
Installing collected packages: patsy, packaging, statsmodels, typing-extensions, pydanti
c, htmlmin, phik, missingno, multimethod, tangled-up-in-unicode, imagehash, visions, pan
das-profiling, urllib3
 Attempting uninstall: patsy
    Found existing installation: patsy 0.5.1
    Uninstalling patsy-0.5.1:
      Successfully uninstalled patsy-0.5.1
  Attempting uninstall: packaging
    Found existing installation: packaging 20.4
    Uninstalling packaging-20.4:
```

Successfully uninstalled packaging-20.4
Attempting uninstall: statsmodels
Found existing installation: statsmodels 0.12.0
Uninstalling statsmodels-0.12.0:
Successfully uninstalled statsmodels-0.12.0
Attempting uninstall: typing-extensions
Found existing installation: typing-extensions 3.7.4.3
Uninstalling typing-extensions-3.7.4.3:
Successfully uninstalled typing-extensions-3.7.4.3
Attempting uninstall: urllib3
Found existing installation: urllib3 1.26.12
Uninstalling urllib3-1.26.12:

Successfully uninstalled urllib3-1.26.12
Successfully installed htmlmin-0.1.12 imagehash-4.3.1 missingno-0.5.1 multimethod-1.9 pa ckaging-21.3 pandas-profiling-3.4.0 patsy-0.5.3 phik-0.12.2 pydantic-1.10.2 statsmodels-0.13.5 tangled-up-in-unicode-0.2.0 typing-extensions-4.4.0 urllib3-1.25.11 visions-0.7.5 Note: you may need to restart the kernel to use updated packages.

ERROR: After October 2020 you may experience errors when installing or updating package s. This is because pip will change the way that it resolves dependency conflicts.

We recommend you use --use-feature=2020-resolver to test your packages with the new reso lver before it becomes the default.

selenium 4.5.0 requires urllib3[socks]~=1.26, but you'll have urllib3 1.25.11 which is i ncompatible.

In [59]: import pandas as pd import pandas_profiling

In [60]: pandas_profiling.ProfileReport(df1)

Overview

Dataset statistics

Number of variables	71
Number of observations	269
Missing cells	0
Missing cells (%)	0.0%
Duplicate rows	60
Duplicate rows (%)	22.3%
Total size in memory	149.3 KiB
Average record size in memory	568.5 B

Variable types

Categorical	70
Numeric	1

Alerts

Dataset has 60 (22.3%) duplicate rows	Duplicates
Pin_Code is highly correlated with Age and 29 other fields (Age,	High correlation
City Of Shopping, Online Shopping Since, Purchase Frequency,	
Login Mode, Exploring Time Spent, Bag Abandon Reason,	
Loading Processing Speed Discount Repofit	

Out[60]:

