

SHOPPING TRENDS ANALYSIS

Project by- Simranjit kaur



Hello! Welcome to my project where I dig deeper into the sales data of a store selling clothing, footwear, outerwear and fashion accessories across 50 different locations. In this project, we harness the capabilities of powerful Python libraries, particularly Pandas for data manipulation and organization while visualizing insightful narratives using visualization libraries, prominently Matplotlib, Seaborn and Plotly.

By doing so we not only gain a comprehensive understanding of the shopping behaviour of customers but also provide a solid foundation for informed decision-making to enhance overall customer experiences and optimize operational strategies.

So let's begin our analytical journey to decipher key trends by answering relevant business questions such as:-

1. WHAT IS THE PROPORTION OF MALE AND FEMALE CUSTOMERS VISITING THE STORE?
2. WHAT IS THE AGE DISTRIBUTION OF THE CUSTOMERS VISITING THE STORE?
3. MAXIMUM NUMBER OF CUSTOMERS VISITING THE STORE BELONG TO WHICH AGE GROUP?
4. RANK THE TYPES OF PRODUCTS SOLD BASED ON THE NUMBER OF ITEMS SOLD FOR EACH TYPE. (GENDER WISE)
5. WHAT ARE THE SALES FOR EACH TYPE OF PRODUCT SOLD?
6. WHICH ARE THE MOST POPULAR SIZES AMONG EACH TYPE OF ITEM SOLD?
7. WHICH ARE THE MOST POPULAR ITEMS AMONG THE CUSTOMERS?
8. WHICH ARE THE MOST POPULAR COLOURS AMONG EACH TYPE OF CUSTOMER? (GENDER WISE)
9. PLOT THE CUSTOMER SATISFACTION TREND W.R.T EACH TYPE OF ITEM SOLD.
10. WHICH ARE THE BEST 10 PERFORMING STORES?
11. WHICH ARE THE 10 WORST-PERFORMING STORES?
12. WHAT PROPORTION OF CUSTOMERS ARE SUBSCRIBERS? (GENDER WISE)
13. WHICH PAYMENT METHOD IS PREFERRED BY THE CUSTOMERS?
14. PLOT THE SHOPPING FREQUENCY TRENDS BY BOTH GENDERS.
15. HOW DO SEASONAL DIFFERENCES AFFECT THE PREFERRED SHIPPING TYPE BY CUSTOMERS?



```
[1]: #importing libraries
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import plotly.express as px
```

```
[2]: #opening the file
df=pd.read_csv("C:/Users/lenovo/OneDrive/Desktop/simran/projects/
↳shopping_trends_updated.csv")
df.head(5)
```

[2]:	Customer ID	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	\
0	1	55	Male	Blouse	Clothing	53	
1	2	19	Male	Sweater	Clothing	64	
2	3	50	Male	Jeans	Clothing	73	
3	4	21	Male	Sandals	Footwear	90	
4	5	45	Male	Blouse	Clothing	49	

	Location	Size	Color	Season	Review Rating	Subscription Status	\
0	Kentucky	L	Gray	Winter	3.1	Yes	
1	Maine	L	Maroon	Winter	3.1	Yes	
2	Massachusetts	S	Maroon	Spring	3.1	Yes	
3	Rhode Island	M	Maroon	Spring	3.5	Yes	
4	Oregon	M	Turquoise	Spring	2.7	Yes	

	Shipping Type	Discount Applied	Promo Code Used	Previous Purchases	\
0	Express	Yes	Yes	14	
1	Express	Yes	Yes	2	
2	Free Shipping	Yes	Yes	23	
3	Next Day Air	Yes	Yes	49	
4	Free Shipping	Yes	Yes	31	

	Payment Method	Frequency of Purchases
0	Venmo	Fortnightly
1	Cash	Fortnightly
2	Credit Card	Weekly

3	PayPal	Weekly
4	PayPal	Annually

```
[3]: df.shape
```

```
[3]: (3900, 18)
```

```
[4]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3900 entries, 0 to 3899
Data columns (total 18 columns):
#   Column                                Non-Null Count  Dtype
---  -
0   Customer ID                          3900 non-null   int64
1   Age                                  3900 non-null   int64
2   Gender                              3900 non-null   object
3   Item Purchased                       3900 non-null   object
4   Category                             3900 non-null   object
5   Purchase Amount (USD)                3900 non-null   int64
6   Location                             3900 non-null   object
7   Size                                 3900 non-null   object
8   Color                                3900 non-null   object
9   Season                               3900 non-null   object
10  Review Rating                        3900 non-null   float64
11  Subscription Status                  3900 non-null   object
12  Shipping Type                       3900 non-null   object
13  Discount Applied                    3900 non-null   object
14  Promo Code Used                     3900 non-null   object
15  Previous Purchases                   3900 non-null   int64
16  Payment Method                      3900 non-null   object
17  Frequency of Purchases               3900 non-null   object
dtypes: float64(1), int64(4), object(13)
memory usage: 548.6+ KB
```

```
[5]: df.columns
```

```
[5]: Index(['Customer ID', 'Age', 'Gender', 'Item Purchased', 'Category',
        'Purchase Amount (USD)', 'Location', 'Size', 'Color', 'Season',
        'Review Rating', 'Subscription Status', 'Shipping Type',
        'Discount Applied', 'Promo Code Used', 'Previous Purchases',
        'Payment Method', 'Frequency of Purchases'],
        dtype='object')
```

```
[6]: df.set_index('Customer ID',inplace=True)
```

```
[7]: for col in df.columns:
      if df[col].dtype=='object':
          print(col)
          print(df[col].unique())
          print(df[col].nunique())
          print('*****')
```

Gender

['Male' 'Female']

2

Item Purchased

['Blouse' 'Sweater' 'Jeans' 'Sandals' 'Sneakers' 'Shirt' 'Shorts' 'Coat'
 'Handbag' 'Shoes' 'Dress' 'Skirt' 'Sunglasses' 'Pants' 'Jacket' 'Hoodie'
 'Jewelry' 'T-shirt' 'Scarf' 'Hat' 'Socks' 'Backpack' 'Belt' 'Boots'
 'Gloves']

25

Category

['Clothing' 'Footwear' 'Outerwear' 'Accessories']

4

Location

['Kentucky' 'Maine' 'Massachusetts' 'Rhode Island' 'Oregon' 'Wyoming'
 'Montana' 'Louisiana' 'West Virginia' 'Missouri' 'Arkansas' 'Hawaii'
 'Delaware' 'New Hampshire' 'New York' 'Alabama' 'Mississippi'
 'North Carolina' 'California' 'Oklahoma' 'Florida' 'Texas' 'Nevada'
 'Kansas' 'Colorado' 'North Dakota' 'Illinois' 'Indiana' 'Arizona'
 'Alaska' 'Tennessee' 'Ohio' 'New Jersey' 'Maryland' 'Vermont'
 'New Mexico' 'South Carolina' 'Idaho' 'Pennsylvania' 'Connecticut' 'Utah'
 'Virginia' 'Georgia' 'Nebraska' 'Iowa' 'South Dakota' 'Minnesota'
 'Washington' 'Wisconsin' 'Michigan']

50

Size

['L' 'S' 'M' 'XL']

4

Color

['Gray' 'Maroon' 'Turquoise' 'White' 'Charcoal' 'Silver' 'Pink' 'Purple'
 'Olive' 'Gold' 'Violet' 'Teal' 'Lavender' 'Black' 'Green' 'Peach' 'Red'
 'Cyan' 'Brown' 'Beige' 'Orange' 'Indigo' 'Yellow' 'Magenta' 'Blue']

25

Season

['Winter' 'Spring' 'Summer' 'Fall']

4

```

*****
Subscription Status
['Yes' 'No']
2
*****
Shipping Type
['Express' 'Free Shipping' 'Next Day Air' 'Standard' '2-Day Shipping'
 'Store Pickup']
6
*****
Discount Applied
['Yes' 'No']
2
*****
Promo Code Used
['Yes' 'No']
2
*****
Payment Method
['Venmo' 'Cash' 'Credit Card' 'PayPal' 'Bank Transfer' 'Debit Card']
6
*****
Frequency of Purchases
['Fortnightly' 'Weekly' 'Annually' 'Quarterly' 'Bi-Weekly' 'Monthly'
 'Every 3 Months']
7
*****

```

```
[8]: df.describe()
```

```
[8]:
```

	Age	Purchase Amount (USD)	Review Rating	Previous Purchases
count	3900.000000	3900.000000	3900.000000	3900.000000
mean	44.068462	59.764359	3.749949	25.351538
std	15.207589	23.685392	0.716223	14.447125
min	18.000000	20.000000	2.500000	1.000000
25%	31.000000	39.000000	3.100000	13.000000
50%	44.000000	60.000000	3.700000	25.000000
75%	57.000000	81.000000	4.400000	38.000000
max	70.000000	100.000000	5.000000	50.000000

```
[9]: df.isnull().sum().sum()
```

```
[9]: 0
```

```
[10]: df.duplicated().sum().sum()
```

```
[10]: 0
```

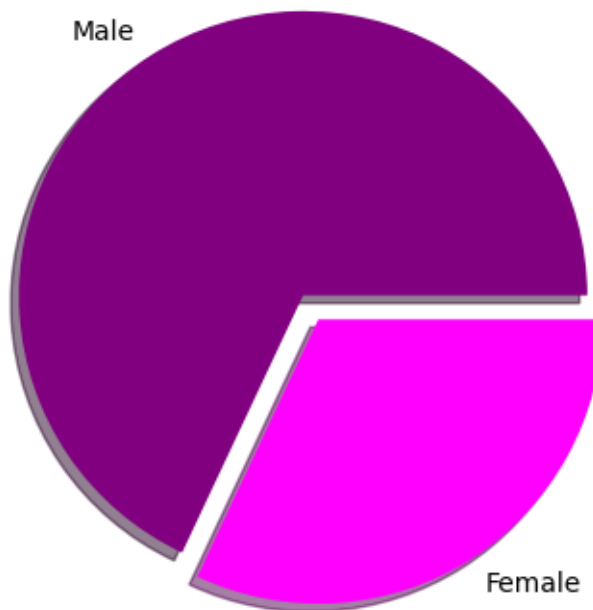
```
[11]: df['Gender'].value_counts()
```

```
[11]: Gender
Male      2652
Female    1248
Name: count, dtype: int64
```

```
[12]: f={'color':'k', 'size':20,'family':'Cambria'}
plt.pie(x=df['Gender'].value_counts(),data=df,labels=df['Gender'].
        unique(),shadow=True,explode=(0.1,0),colors=('purple','magenta'))
plt.title('Customer distribution - Gender wise',f)
```

```
[12]: Text(0.5, 1.0, 'Customer distribution - Gender wise')
```

Customer distribution - Gender wise



```
[13]: df['Age'].describe()
```

```
[13]: count      3900.000000
mean        44.068462
std         15.207589
min         18.000000
25%         31.000000
50%         44.000000
```

75% 57.000000
max 70.000000
Name: Age, dtype: float64

```
[14]: df['Age Group']= pd.cut(df['Age'],  
    bins=[0,15,18,30,50,70],labels=['Child','Teenager','Young  
    Adult','Middle-aged Adult','Old'])  
df['Age Group'].value_counts()
```

[14]: Age Group
Old 1476
Middle-aged Adult 1475
Young Adult 880
Teenager 69
Child 0
Name: count, dtype: int64

```
[15]: df.head(5)
```

[15]:

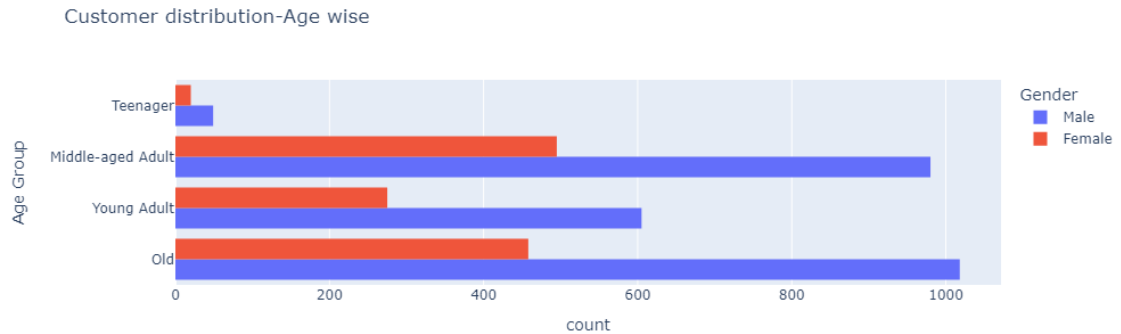
	Customer ID	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	\
0	1	55	Male	Blouse	Clothing	53	
1	2	19	Male	Sweater	Clothing	64	
2	3	50	Male	Jeans	Clothing	73	
3	4	21	Male	Sandals	Footwear	90	
4	5	45	Male	Blouse	Clothing	49	

	Location	Size	Color	Season	Review Rating	Subscription Status	\
0	Kentucky	L	Gray	Winter	3.1	Yes	
1	Maine	L	Maroon	Winter	3.1	Yes	
2	Massachusetts	S	Maroon	Spring	3.1	Yes	
3	Rhode Island	M	Maroon	Spring	3.5	Yes	
4	Oregon	M	Turquoise	Spring	2.7	Yes	

	Shipping Type	Discount Applied	Promo Code Used	Previous Purchases	\
0	Express	Yes	Yes	14	
1	Express	Yes	Yes	2	
2	Free Shipping	Yes	Yes	23	
3	Next Day Air	Yes	Yes	49	
4	Free Shipping	Yes	Yes	31	

	Payment Method	Frequency of Purchases	Age Group
0	Venmo	Fortnightly	Old
1	Cash	Fortnightly	Young Adult
2	Credit Card	Weekly	Middle-aged Adult
3	PayPal	Weekly	Young Adult
4	PayPal	Annually	Middle-aged Adult

```
[16]: fig=px.histogram(df, y='Age Group',title='Customer distribution-Age wise',color='Gender',barmode='group')
fig.show()
```



```
[12]: df['Category'].unique()
```

```
[12]: array(['Clothing', 'Footwear', 'Outerwear', 'Accessories'], dtype=object)
```

```
[32]: n=df['Category'].value_counts().sort_values(ascending=False)
n
```

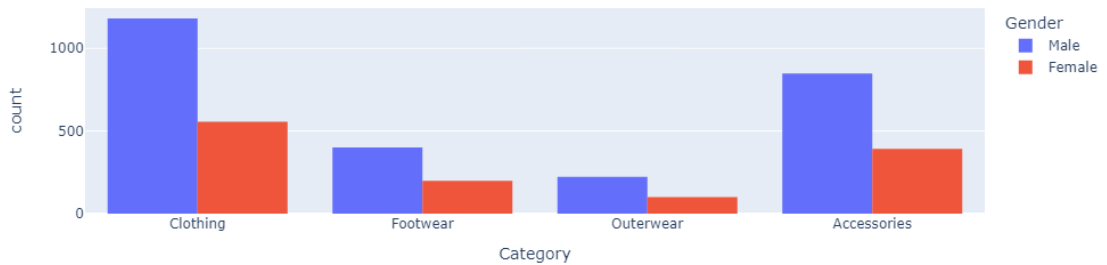
```
[32]: Category
Clothing      1737
Accessories   1240
Footwear      599
Outerwear     324
Name: count, dtype: int64
```

```
[34]: df.groupby('Category')['Purchase Amount (USD)'].sum().
sort_values(ascending=False)
```

```
[34]: Category
Clothing      104264
Accessories    74200
Footwear      36093
Outerwear     18524
Name: Purchase Amount (USD), dtype: int64
```

```
[17]: fig=px.histogram(df, x='Category',color='Gender',barmode='group',title='Items preferred by both genders')
fig.show()
```

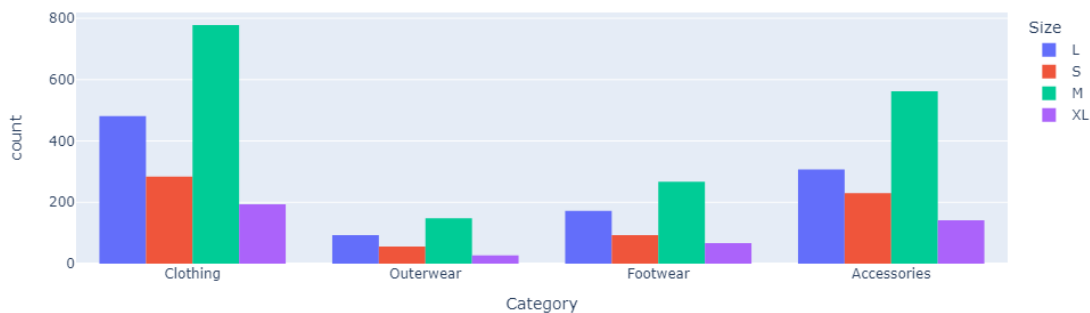

Items preferred by both genders



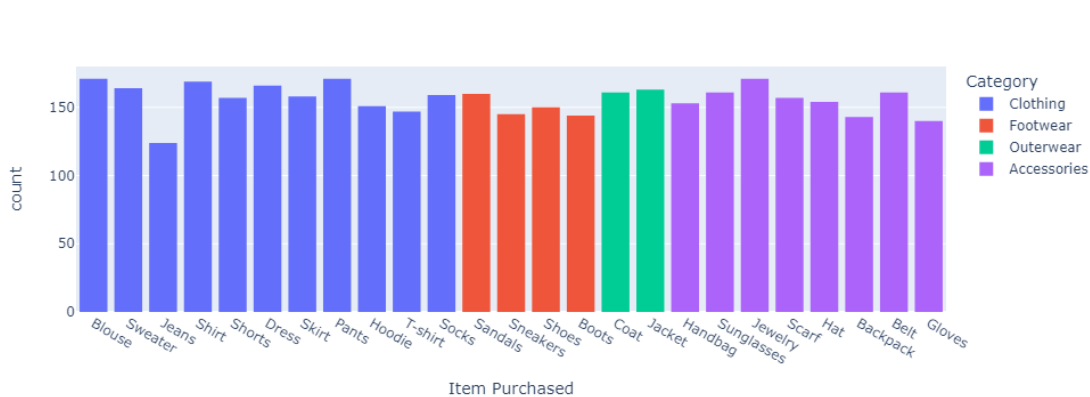
```
[6]: df.groupby('Size')['Category'].value_counts().sort_values(ascending=False)
```

```
[6]: Size  Category
M      Clothing      778
      Accessories    562
L      Clothing      481
      Accessories    307
S      Clothing      284
M      Footwear      267
S      Accessories    230
XL     Clothing      194
L      Footwear      172
M      Outerwear     148
XL     Accessories    141
L      Outerwear      93
S      Footwear      93
XL     Footwear       67
S      Outerwear      56
XL     Outerwear      27
Name: count, dtype: int64
```

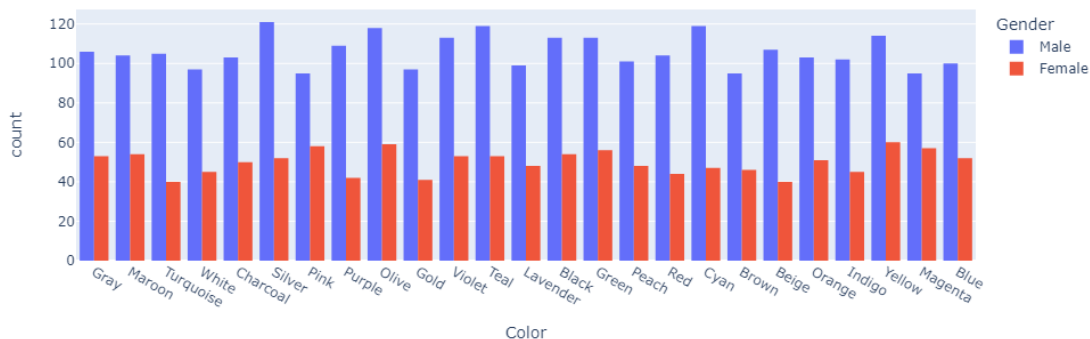
```
[69]: fig=px.histogram(df, x='Category', color='Size',barmode='group')
fig.show()
```



```
[61]: fig = px.histogram(df , x = 'Item Purchased' , color = 'Category')
fig.show()
```



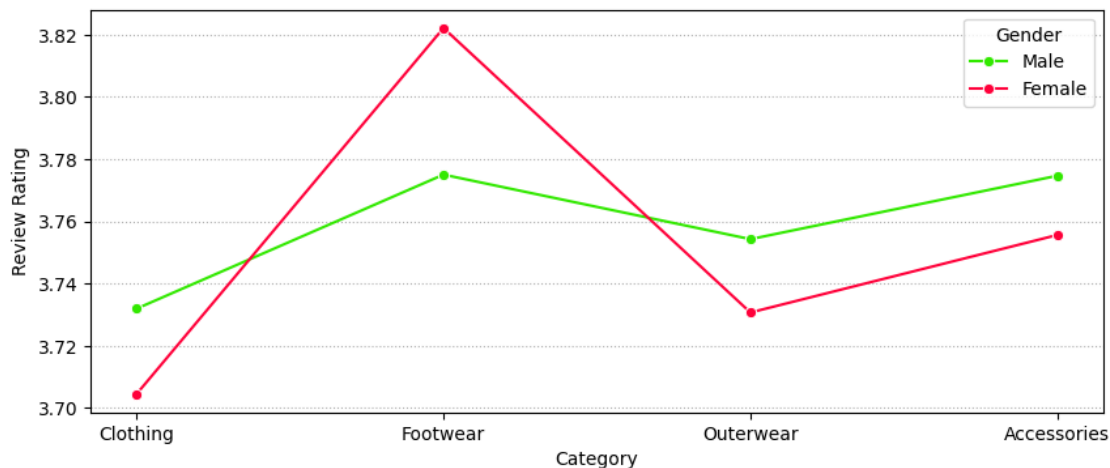
```
[60]: px.histogram(df , x='Color',color='Gender',barmode='group')
```



```
[40]: Ratings_given=df.groupby('Category')['Review Rating'].mean().  
      sort_values(ascending=False)  
Ratings_given
```

```
[40]: Category  
Footwear      3.790651  
Accessories   3.768629  
Outerwear     3.746914  
Clothing      3.723143  
Name: Review Rating, dtype: float64
```

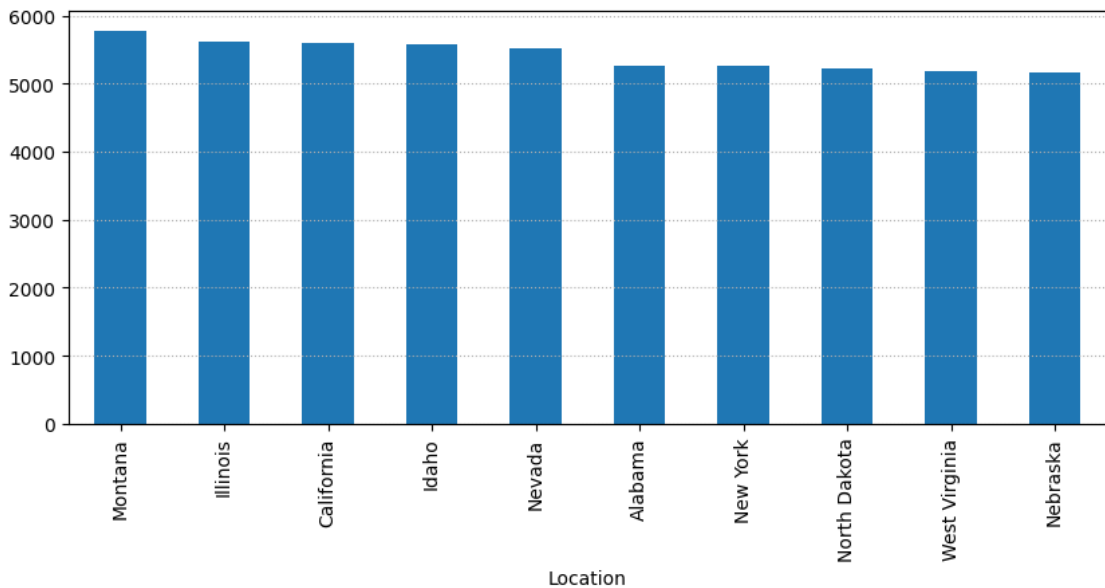
```
[9]: plt.figure(figsize=(10,4))  
sns.lineplot(x='Category',y='Review Rating',data=df, hue='Gender',  
            palette='prism',marker='o',errorbar=None)  
plt.grid(axis='y',ls='dotted')
```



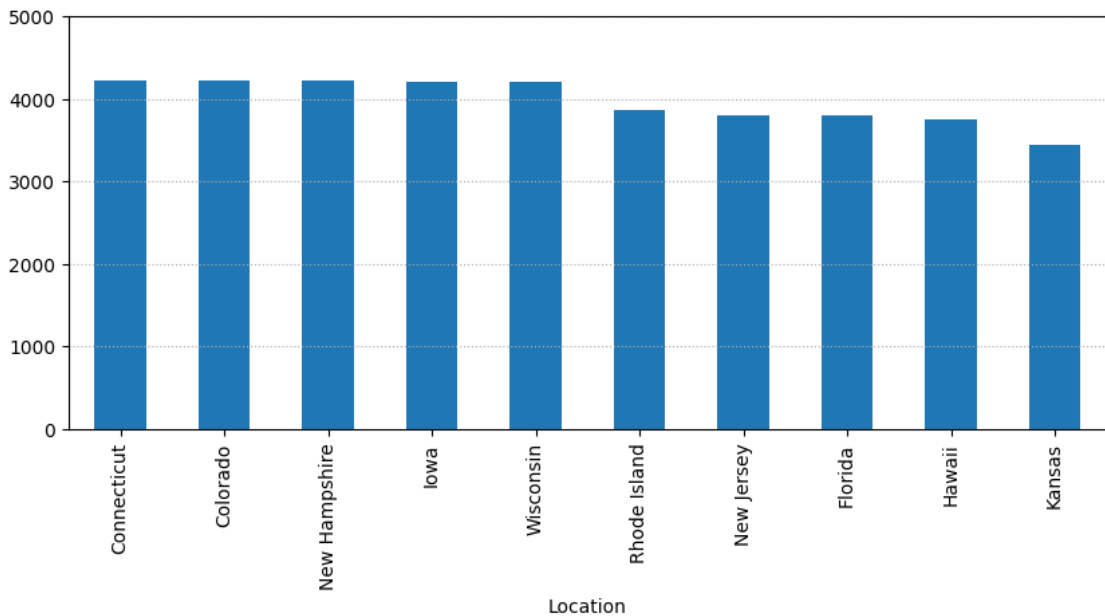
```
[103]: df['Location'].nunique()
```

```
[103]: 50
```

```
[51]: plt.figure(figsize=(10,4))  
df.groupby('Location')['Purchase Amount (USD)'].sum().nlargest(10).  
    plot(kind='bar')  
plt.grid(axis='y', ls='dotted')
```



```
[7]: plt.figure(figsize=(10,4))
df.groupby('Location')['Purchase Amount (USD)'].sum().nsmallest(10).
    sort_values(ascending=False).plot(kind='bar')
plt.yticks(np.arange(0,6000,1000))
plt.grid(axis='y', ls='dotted')
```



```
[113]: df['Promo Code Used'].value_counts()
```

```
[113]: Promo Code Used
      No      2223
      Yes     1677
      Name: count, dtype: int64
```

```
[114]: df['Discount Applied'].value_counts()
```

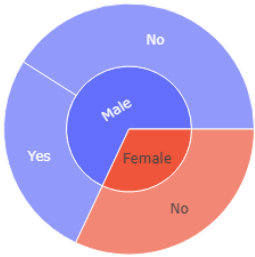
```
[114]: Discount Applied
      No      2223
      Yes     1677
      Name: count, dtype: int64
```

```
[38]: df.drop('Promo Code Used', axis=1, inplace=True)
```

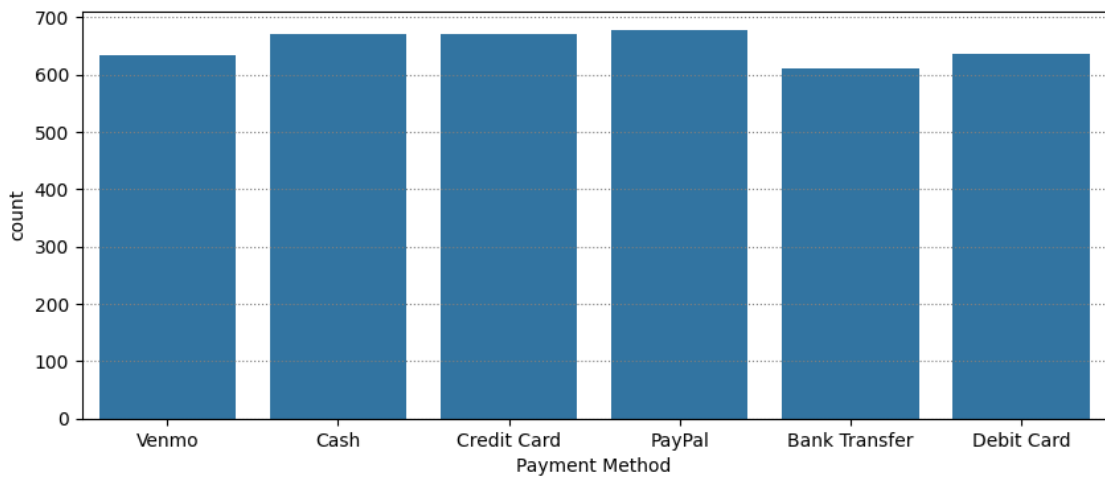
```
[43]: df['Subscription Status'].value_counts()
```

```
[43]: Subscription Status
      No      2847
      Yes     1053
      Name: count, dtype: int64
```

```
[49]: px.sunburst(df, path=['Gender','Subscription Status'])
```



```
[43]: plt.figure(figsize=(10,4))
      sns.countplot(x='Payment Method',data=df)
      plt.grid(axis='y', ls='dotted', color='grey')
```

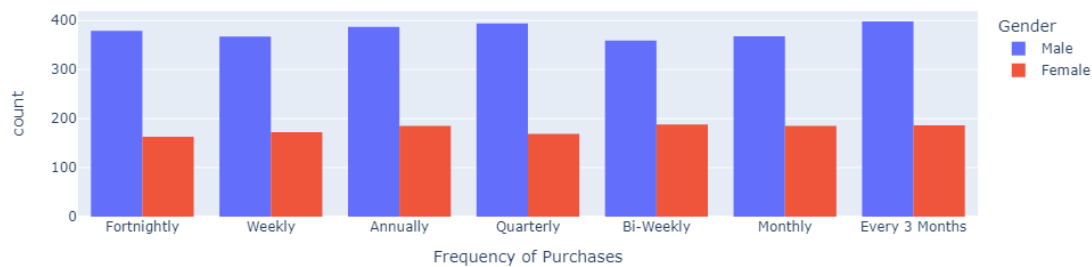


```
[57]: df.groupby('Gender')['Frequency of Purchases'].value_counts()
```

```
[57]: Gender  Frequency of Purchases
Female  Bi-Weekly                188
        Every 3 Months           186
        Annually                 185
        Monthly                 185
        Weekly                   172
        Quarterly               169
        Fortnightly             163
Male    Every 3 Months           398
        Quarterly               394
        Annually                 387
        Fortnightly             379
        Monthly                 368
        Weekly                   367
        Bi-Weekly               359
Name: count, dtype: int64
```

```
[44]: fig = px.histogram(df , x = 'Frequency of Purchases',color =
        'Gender',barmode='group',title='Frequency of Purchases based on Gender')
fig.show()
```

Frequency of Purchases based on Gender



```
[13]: df['Shipping Type'].value_counts()
```

```
[13]: Shipping Type
Free Shipping      675
Standard           654
Store Pickup       650
Next Day Air       648
Express            646
2-Day Shipping     627
Name: count, dtype: int64
```

```
[81]: df.head(2)
```

```
[81]:
```

	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	\
Customer ID						
1	55	Male	Blouse	Clothing	53	
2	19	Male	Sweater	Clothing	64	

	Location	Size	Color	Season	Review Rating	Subscription Status	\
Customer ID							
1	Kentucky	L	Gray	Winter	3.1	Yes	
2	Maine	L	Maroon	Winter	3.1	Yes	

	Shipping Type	Discount Applied	Promo Code Used	\
Customer ID				
1	Express	Yes	Yes	
2	Express	Yes	Yes	

	Previous Purchases	Payment Method	Frequency of Purchases
Customer ID			
1	14	Venmo	Fortnightly
2	2	Cash	Fortnightly

```
[53]: fig=px.histogram(df, x='Shipping Type',color='Season',barmode='group')  
fig.show()
```



```
[ ]:
```

THANK YOU