

```
from google.colab import drive
drive.mount('/content/drive')
```

Mounted at /content/drive

### Importing Libraries

```
import numpy as np
import random
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sn
import re
%matplotlib inline
```

### Loading Data

```
df = pd.read_csv('/content/drive/MyDrive/Research/Datathon/DATATHON-UPDATED.txt', sep = '|')
```

### Data Columns

```
df.columns
```

```
Index(['acct_id', 'VINTAGE_YEAR', 'STATE', 'GENERATION', 'AGE', 'FICO',
      'MONTHLY_INCOME', 'PRODUCT_SEGMENT', 'PARTNERBUSINESSKEY',
      'PARTNER_NAME', 'CREDIT_LIMIT', 'TRANSACTIONPOSTDT', 'TRANSACTIONAMT',
      'MERCHANTDESC', 'MCC', 'MCC_DESCRIPTION', 'SPENDCATEGORYNM', 'ENTRYNBR',
      'ME_BALANCE'],
      dtype='object')
```

### Total Transactions

```
len(df)
```

3555741

### Total Unique Customers

```
len(pd.unique(df['acct_id']))
```

50000

### Missing values

```
df.isna().sum().sum()
```

7968

### Missing value for each column

```
for i in df.columns:
    print(i,end=' : ')
    print(df[i].isna().sum())
```

```
acct_id : 0
VINTAGE_YEAR : 0
STATE : 1968
GENERATION : 0
AGE : 0
FICO : 0
MONTHLY_INCOME : 0
PRODUCT_SEGMENT : 0
PARTNERBUSINESSKEY : 0
PARTNER_NAME : 0
```

```

CREDIT_LIMIT : 0
TRANSACTIONPOSTDT : 0
TRANSACTIONAMT : 0
MERCHANTDESC : 1092
MCC : 0
MCC_DESCRIPTION : 4908
SPENDCATEGORYNM : 0
ENTRYNBR : 0
ME_BALANCE : 0

```

```

for x in range(1,50):
    print(x, end=' ')
    print(x-2-(2*(int((x-2)/7))),end=','),(')

```

```

1 -1),(2 0),(3 1),(4 2),(5 3),(6 4),(7 5),(8 6),(9 5),(10 6),(11 7),(12 8),(13 9),(14 10),(15 11),(16 10),(17 11),(18 12),(19 13),(20 14

```

## Feature Engineering

### New Columns Date, Month, Days

```

df['date'] = pd.to_datetime(df['TRANSACTIONPOSTDT'])
month_day_count={1:0,2:31,3:59,4:90,5:120,6:151,7:181}
df['buy_month'] = df['date'].apply(lambda date:date.month)
df['time_series'] = df['date'].apply(lambda date:(date.day+month_day_count[date.month]))
df['buy_weekday'] = df['date'].apply(lambda date:date.day_name())

```

```

df['time_series'] = df['time_series'].apply(lambda x: x-2-(2*(int((x-2)/7))))

```

### Merchant Name Extraction

```

df['Merchant_Name'] = df['MERCHANTDESC'].apply(lambda x: re.sub(r'[*|&|^|%|.|\?|$\#|1|2|4|5|8|0|]', " ",str(x)))
df['Merchant_Name'] = df['Merchant_Name'].apply(lambda x: str(x).strip().upper())
df['Merchant_Name'] = df['Merchant_Name'].apply(lambda x: x if (x[:3]=='THE' or x[:2]=='IN') else re.split(' ',str(x))[0] )
df['Merchant_Name'] = df['Merchant_Name'].apply(lambda x: 'AMAZON' if (x=='AMZN' ) else x)
df['Merchant_Name'] = df['Merchant_Name'].apply(lambda x: 'WALMART' if (x=='WAL-MART' or x=='WM') else x)
df['Merchant_Name'] = df['Merchant_Name'].apply(lambda x: 'SAMSClub' if (x=='SAMS') else x)

```

```

mil=df[df['GENERATION']=='4. Millennials']
Gen_Z=df[df['GENERATION']=='5. Gen Z']
Boomers=df[df['GENERATION']=='2. Boomers']

```

```

both=df[(df['GENERATION']=='5. Gen Z')|(df['GENERATION']=='4. Millennials')]

```

### Spend Category Name

```

pd.unique(Gen_Z['AGE'])

array([26, 24, 25, 23, 22, 21, 20])

```

### Length

```

len(pd.unique(df['SPENDCATEGORYNM']))

```

```

23

```

```

pd.unique(df['MCC_DESCRIPTION'])

```

```

UMINI HOTEL , MIRAGE HOTEL AND CASINO , EMIKRAIES AIRLINES ,
'HYATT PLACE', 'SHANGRI-LA INTERNATIONAL', 'AVIANCA', 'ANA HOTELS',
'ELEC RAZOR STORES/SALE/SERV', 'MOTOR HOME DEALERS',
'SILVER LEGACY HOTEL AND CASINO', 'CONTRACTORS - CONCRETE',
'LOEWS HOTEL', 'EXCALIBUR HOTEL AND CASINO', 'AUTO PAINT SHOPS',
'TENT AND AWNING SHOPS', 'HARRAH'S HOTELS AND CASINOS",
"CAESAR'S HOTEL AND CASINO", 'AUSTRIAN AIR',
'VIRGIN RIVER HOTEL AND CASINO',
'AIRPORTS, AIRPORT TERMINALS/FLYING FIELDS',
'MONTE CARLO HOTEL AND CASINO', 'MILLENNIUM HOTELS',
'CHINA AIRLINES', 'EUROP CAR', 'SNOWMOBILE DEALERS',
'MICROTREL INNS & SUITES', 'COSMOPOLITAN OF LAS VEGAS',
'RIO SUITES', 'MAINSTAY SUITES', 'SN BRUSSELS AIRLINES',
'WILDERNESS HOTEL & RESORT', 'INTRA-GOVERNMENT PURCHASES',
'IBERIA', 'ARIA', 'AIR MAROC', 'MOBILE HOME DEALERS',
'STENOGRAPHIC SERVICES', 'PREMIER TRAVEL INNS',
'SECURITY BROKERS/DEALERS', 'SMUGGLERS NOTCH RESORT',
'RADISSON BLU', 'RAILROADS-FREIGHT', 'AIR-INDIA',
'ROYAL KONA RESORT', 'PAYLESS CAR RENTAL', 'PARIS LAS VEGAS HOTEL',
'INTER-CONTINENTAL', 'GOLDEN NUGGET', 'CARIBBEAN AIRLINES',
'CLUB MED', 'ROSEN HOTELS AND RESORTS', 'LUXOR HOTEL AND CASINO',
'EMBASSY HOTELS', 'TREASURE ISLAND HOTEL & CASINO',
'RADISSON HOTEL', 'FONTAINEBLEAU RESORTS',
'ECONOMY INNS OF AMERICA', 'THUNDERBIRD/RED LION',
'SCANDIC HOTELS', 'AIR FRANCE', "BALLY'S HOTEL AND CASINO",
'AEROFLOT', 'BAHAMASAIR', 'VENETIAN RESORT HOTEL CASINO',
'ANTIQUE REPRODUCTION STORES', 'WALDORF', 'LA QUINTA RESORT',
'FURRIERS AND FUR SHOPS', 'EASYJET', 'WIZZ AIRLINES',
'TROPICANA RESORT & CASINO', 'NEW YORK-NEW YORK HOTEL+CASINO',
'GAYLORD PALMS', 'CROSSLAND', 'SWISSOTEL', 'PAKISTAN',
'VIRGIN ATLANTIC', 'BEAU RIVAGE HOTEL AND CASINO',
'OUTBOUND TELEMARKETING MERCHNT', 'DIRECT MKTG-TRAVEL RELATED ARR',
'MERIDIEN', 'SOFITEL HOTELS', 'FAIRFIELD HOTEL',
'STRATOSPHERE HOTEL AND CASINO', 'FOUR SEASONS', 'MIDEASTAIR',
'QATAR AIRWAYS', 'EGYPTAIR', 'OSTEOPATHS', 'HOTELES EL PRESIDENTE',
'PAL AIR', 'NOVOTEL', 'GULF AIR (BAHRAIN)', 'LAN AIR',
'HILTON CONRAD', 'KOREAN AIR', 'HARVEY/BRISTOL HOTELS',
'TACA INTERNATIONAL', 'TAP AIR', 'HILTON INTERNATIONAL',
'SAUDIA AIR', 'SHILO INN', 'AFFILIATED AUTO RENTAL',
'BUDGET HOST INNS', 'DIRECT SELL/DOOR-TO-DOOR', 'WYNN LAS VEGAS',
'CANOPY HOTELS', 'ALITALIA', 'SANDMAN HOTELS', 'LXR',
'PEPPERMILL HOTEL CASINO', 'PARK INNS INTERNATIONAL',
'THE PALACE HOTEL', "SAM'S TOWN HOTEL AND CASINO",
'BILTMORE HOTEL & SUITES', "SHONEY'S INN", 'ROYAL HOTELS', 'SAS',
'HOTELES MELIA', 'GRAND SIERRA RESORT', 'ETIHADAIR',
'WINDWARD ISLAND', 'AUTOMOBILE SUPPLY STORES', 'ST. REGIS HOTEL',
'ALA MOANA HOTEL', 'CATHAYPACAIR', 'SWISS INTERNATIONAL AIRLINES',
'OXFORD SUITES', "WHISKEY PETE'S HOTEL & CASINO", 'SANDMAN INN',
'AZUL AIR', 'CARLTON HOTELS', 'CITY LODGE HOTELS', 'STEIGENBERGER',
'CHATEAU ELAN WINERY AND RESORT', 'PULLMAN INTERNATIONAL HOTELS',
'FREMONT HOTEL AND CASINO'], dtype=object)

```

```
len(pd.unique(df['MCC_DESCRIPTION']))
```

```
506
```

## State

```
pd.unique(df['STATE'])
```

```

array(['AZ', 'NY', 'FL', 'TX', 'KY', 'MA', 'MI', 'CA', 'NE', 'SC', 'DC',
      'NC', 'NJ', 'VA', 'OK', 'NV', 'IA', 'MN', 'IL', 'SD', 'LA', 'NM',
      'MO', 'WA', 'MS', 'WV', 'MD', 'OH', 'TN', 'WI', 'IN', 'CO', 'GA',
      'AL', 'ID', 'HI', 'UT', 'KS', 'ND', 'PA', 'AR', 'MT', 'CT', 'NH',
      'OR', 'VT', 'ME', 'RI', 'DE', 'WY', nan, 'GU', 'PR', 'AK', 'AE',
      'TEX', 'VI', 'AP'], dtype=object)

```

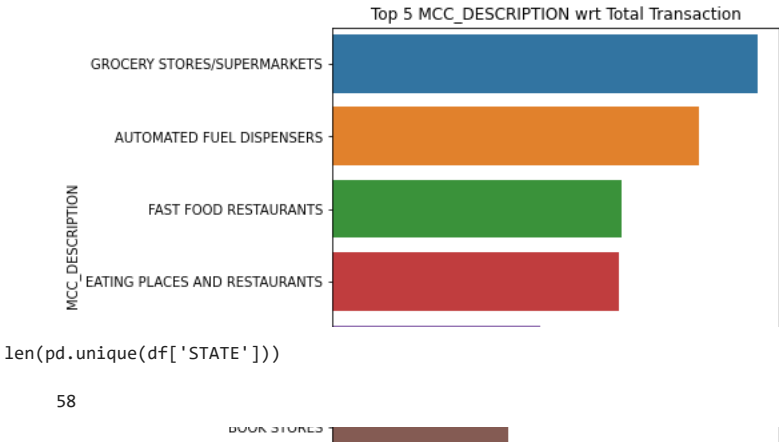
```
x=df['MCC_DESCRIPTION'].value_counts()[ :6].rename_axis('MCC_DESCRIPTION').reset_index(name='Total')
```

```
plt.figure(figsize = (6,6))
```

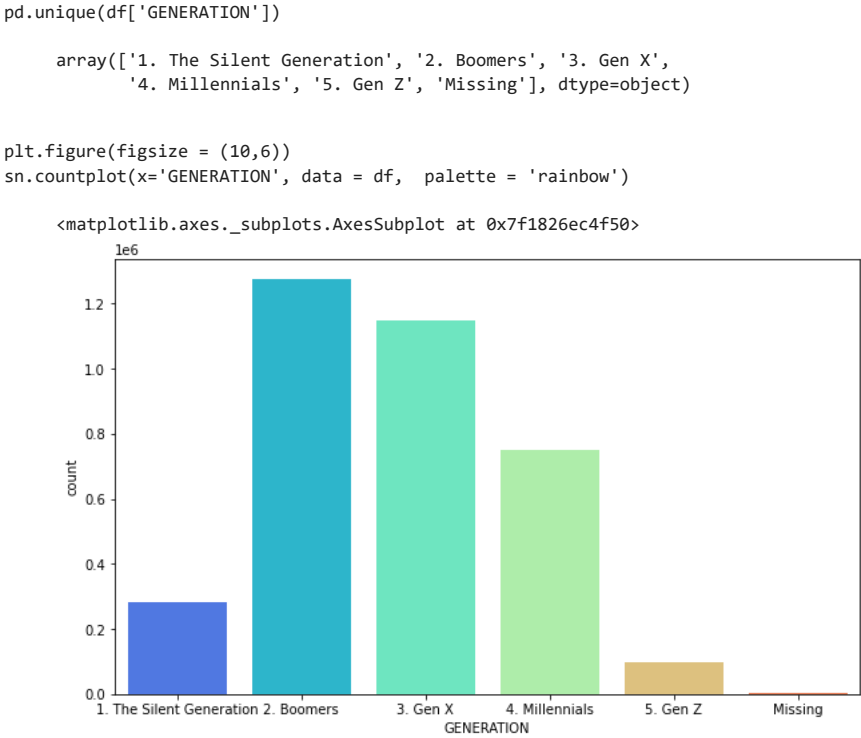
```

sn.barplot(x="Total", y="MCC_DESCRIPTION", data=x,label="MCC_DESCRIPTION").set(title='Top 5 MCC_DESCRIPTION wrt Total Transaction',xlabel="Am
plt.savefig("/content/drive/MyDrive/Research/Dataathon/Figure/Top 5 MCC_DESCRIPTION wrt Total Transaction.png")

```



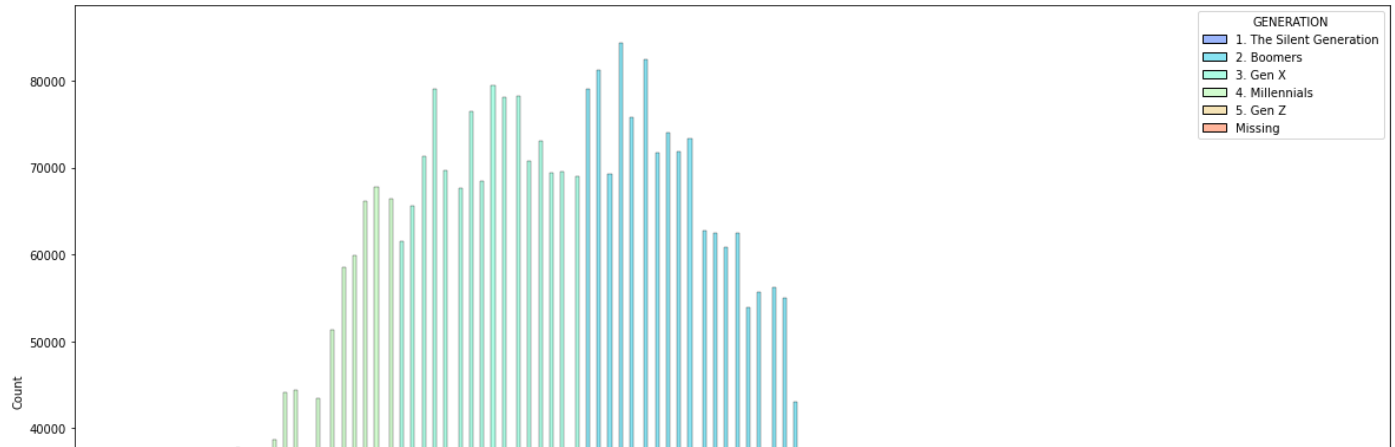
Generation



AGE

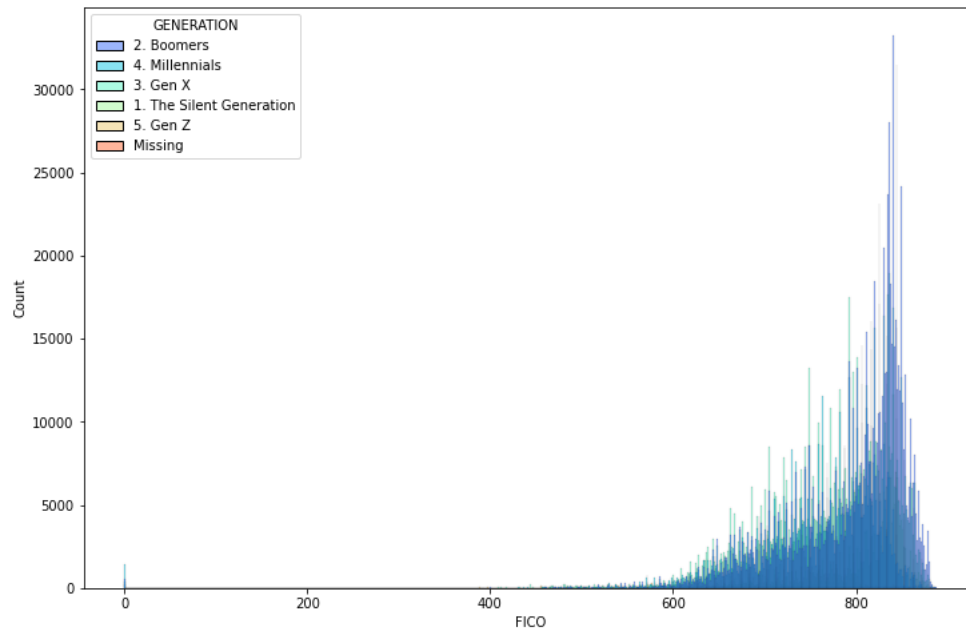
```
plt.figure(figsize = (20,12))  
sn.histplot(x='AGE', data = df, hue='GENERATION', palette = 'rainbow')
```

&lt;matplotlib.axes.\_subplots.AxesSubplot at 0x7fbb3f8c1350&gt;

**FICO**

```
plt.figure(figsize = (12,8))
sn.histplot(x='FICO', data = df, hue='GENERATION', palette = 'rainbow')
```

&lt;matplotlib.axes.\_subplots.AxesSubplot at 0x7fbfedf11490&gt;

**GEN\_Z FICO**

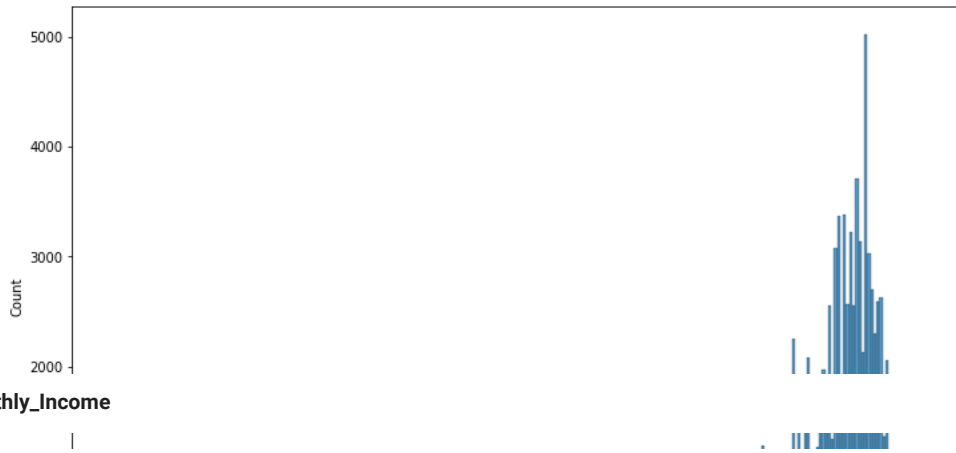
```
Gen_Z=df[df['GENERATION']=='5. Gen Z']
```

```
len(Gen_Z)
```

99588

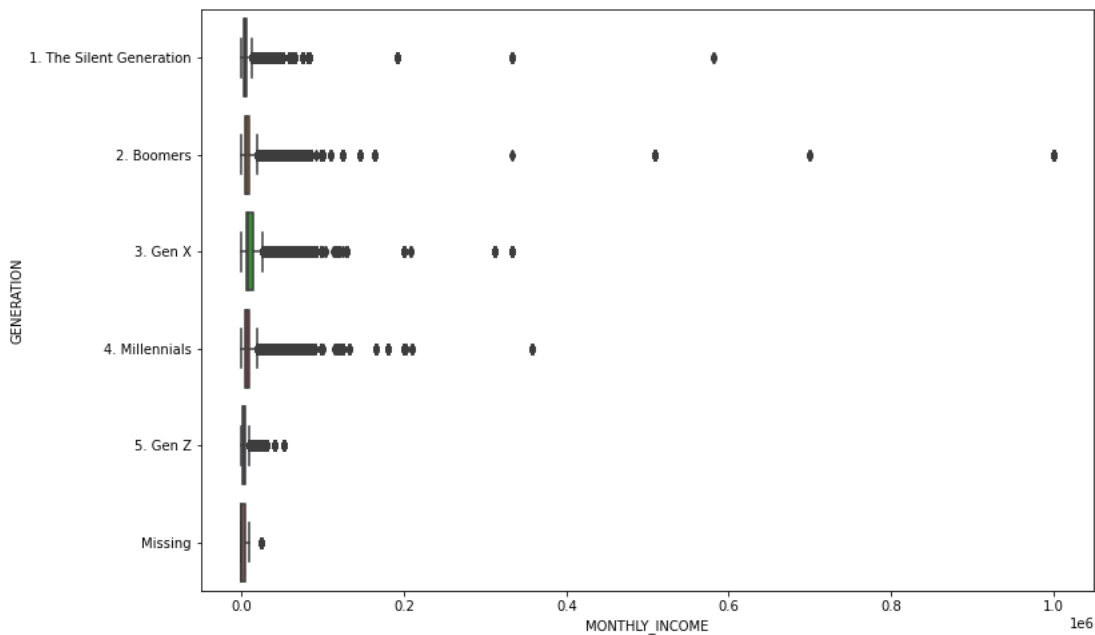
```
plt.figure(figsize = (12,8))
sn.histplot(x='FICO', data = Gen_Z, palette = 'rainbow')
```

<matplotlib.axes.\_subplots.AxesSubplot at 0x7fbb3d953d10>



```
plt.figure(figsize = (12,8))
sn.boxplot(x='MONTHLY_INCOME', data = df, y='GENERATION')
```

<matplotlib.axes.\_subplots.AxesSubplot at 0x7fbb3cfe8290>

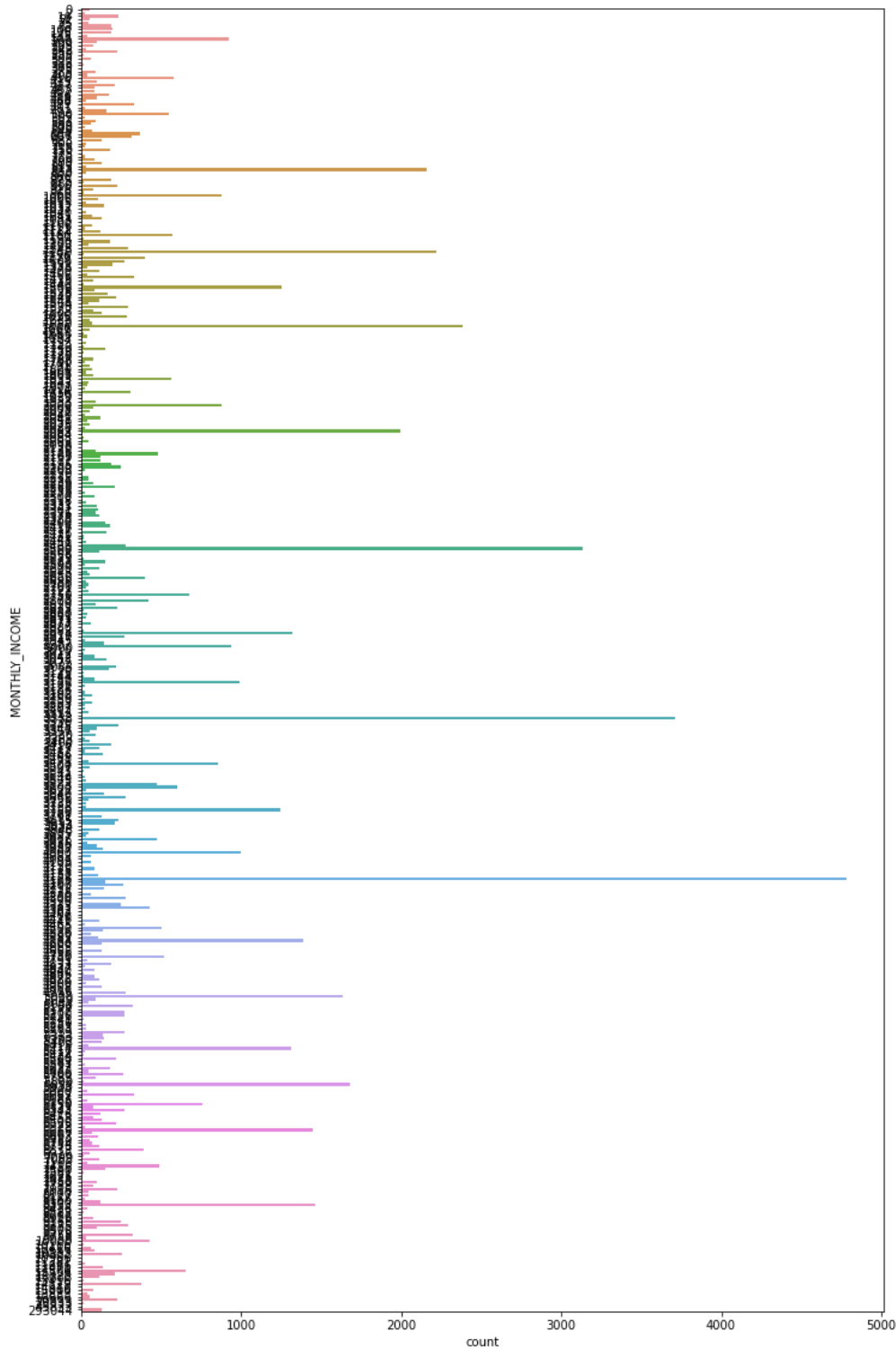


```
plt.figure(figsize = (12,8))
sn.boxplot(x='MONTHLY_INCOME', data = Gen_Z)
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x7fbb3d071890>
```

```
plt.figure(figsize = (12,20))
sn.countplot(y='MONTHLY_INCOME', data = Gen_Z)
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x7fbfa01eb0d0>
```



#### SPEND CATEGORY Name

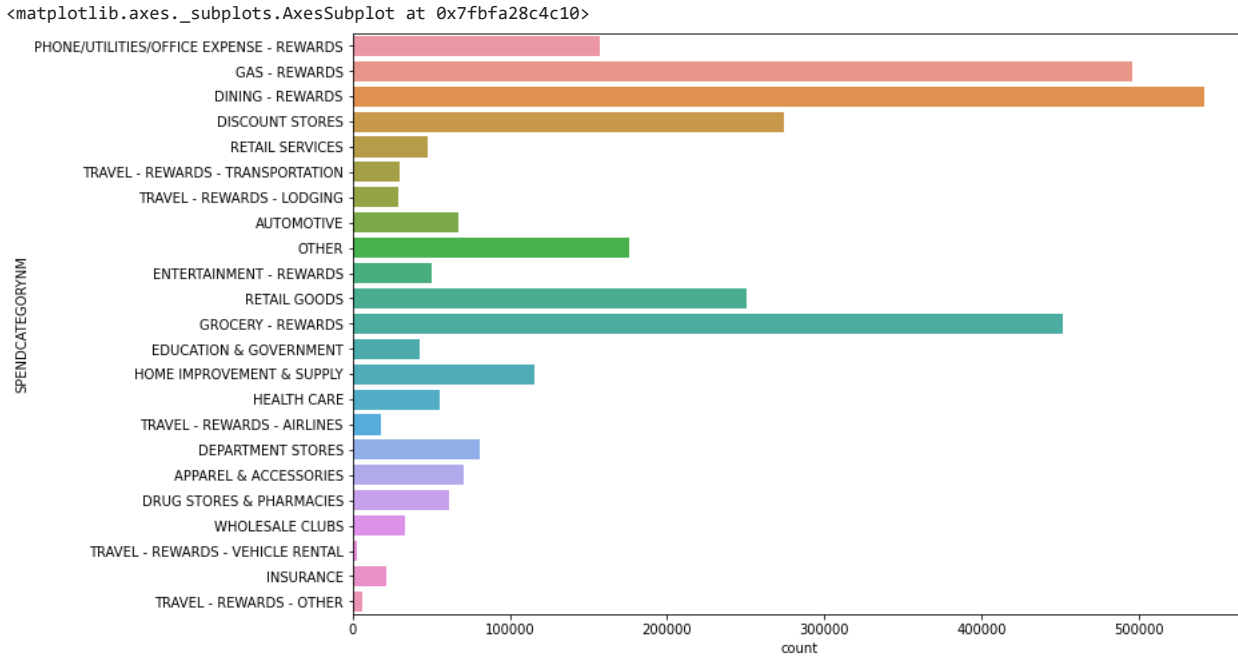
```
pd.unique(df['SPENDCATEGORYNM'])

array(['PHONE/UTILITIES/OFFICE EXPENSE - REWARDS', 'GAS - REWARDS',
      'DINING - REWARDS', 'DISCOUNT STORES', 'RETAIL SERVICES',
      'TRAVEL - REWARDS - TRANSPORTATION', 'TRAVEL - REWARDS - LODGING',
```

```
'AUTOMOTIVE', 'OTHER', 'ENTERTAINMENT - REWARDS', 'RETAIL GOODS',
'GROCERY - REWARDS', 'EDUCATION & GOVERNMENT',
'HOME IMPROVEMENT & SUPPLY', 'HEALTH CARE',
'TRAVEL - REWARDS - AIRLINES', 'DEPARTMENT STORES',
'APPAREL & ACCESSORIES', 'DRUG STORES & PHARMACIES',
'WHOLESALE CLUBS', 'TRAVEL - REWARDS - VEHICLE RENTAL',
'INSURANCE', 'TRAVEL - REWARDS - OTHER'], dtype=object)
```

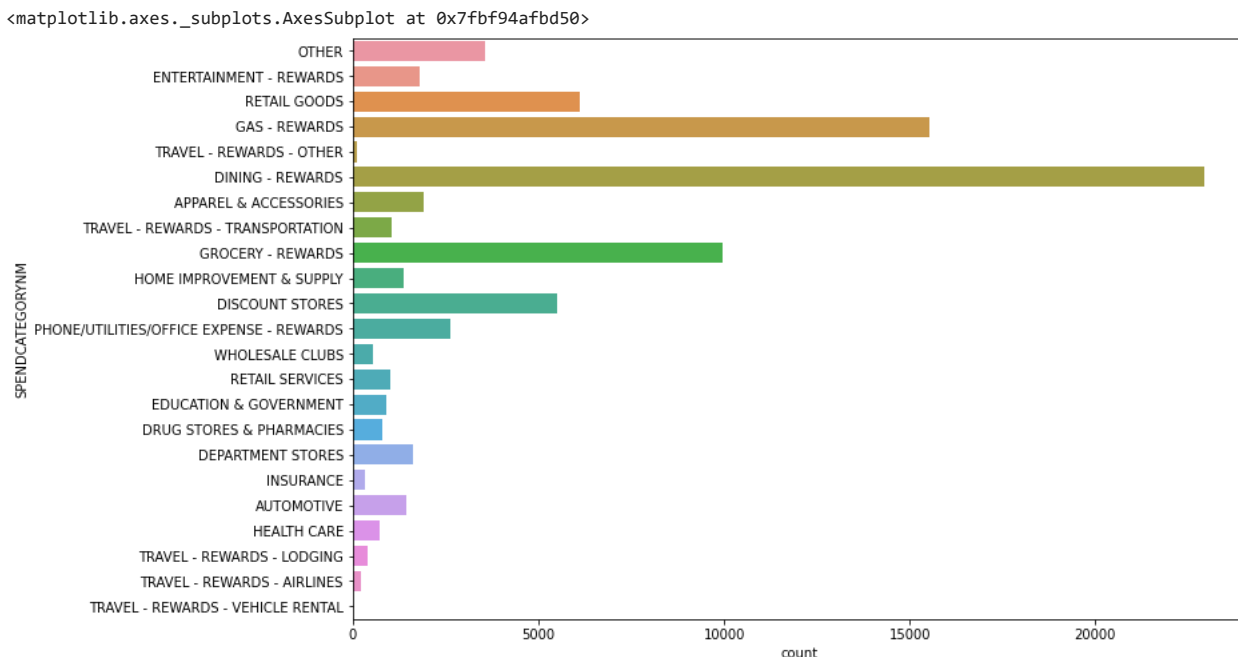
For ALL

```
plt.figure(figsize = (12,8))
sn.countplot(y='SPENDCATEGORYNM', data = df)
```



Gen\_z

```
plt.figure(figsize = (12,8))
sn.countplot(y='SPENDCATEGORYNM', data = Gen_Z)
```



Spend Amount

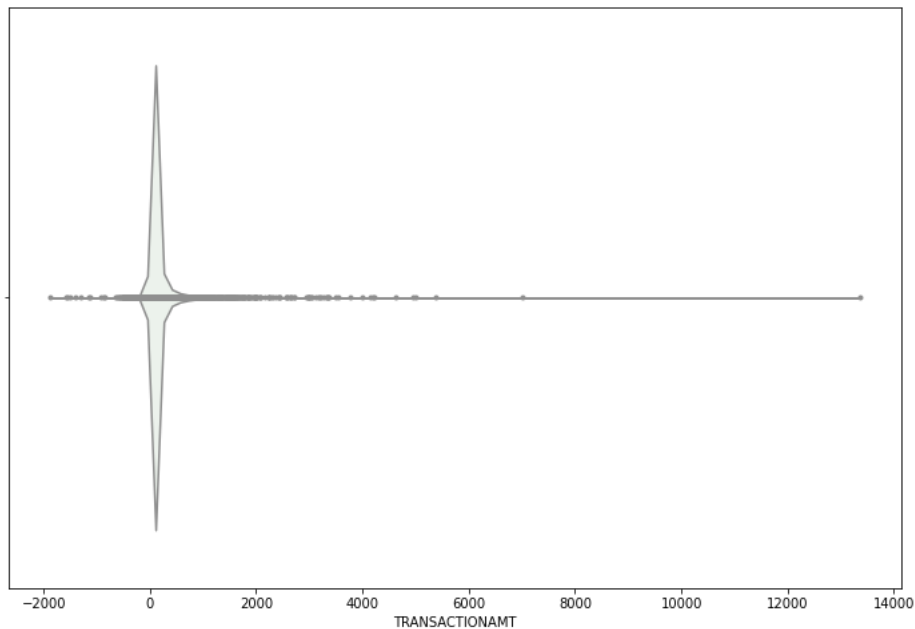


```
Gen_Z['TRANSACTIONAMT'].describe()
```

```
count      80461.000000
mean         46.087254
std        138.685144
min       -1871.720000
25%          8.960000
50%         19.980000
75%         45.540000
max       13355.910000
Name: TRANSACTIONAMT, dtype: float64
```

```
plt.figure(figsize = (12,8))
sn.violinplot(data=Gen_Z,x='TRANSACTIONAMT', palette="light:g", inner="points", orient="h")
```

<matplotlib.axes.\_subplots.AxesSubplot at 0x7fab2282ccd0>



## ME\_BALANCE

```
Gen_Z['ME_BALANCE'].describe()
```

```
count      80461.000000
mean       1099.261547
std       1488.314599
min      -1375.940000
25%        219.430000
50%        604.500000
75%       1385.280000
max      13891.910000
Name: ME_BALANCE, dtype: float64
```

```
plt.figure(figsize = (12,8))
sn.violinplot(data=Gen_Z,x='ME_BALANCE', palette="light:g", inner="points", orient="h")
```

<matplotlib.axes.\_subplots.AxesSubplot at 0x7fab1c954710>



Gen\_Z

```
Gen_Z=df[df['GENERATION']=='5. Gen Z']
```

'2. Boomers'

```
Boomers=df[df['GENERATION']=='2. Boomers']
```

```
x=Gen_Z['MCC_DESCRIPTION'].value_counts()[:20].rename_axis('MCC_DESCRIPTION').reset_index(name='Total')
```

```
plt.figure(figsize = (12,12))
```

```
sn.barplot(x="Total", y="MCC_DESCRIPTION", data=x,label="MCC_DESCRIPTION").set(title='Gen_Z: Top 20 MCC_DESCRIPTION wrt Total Transaction')
```

```
plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Top 20 MCC_DESCRIPTION wrt Total Transaction.png")
```

### Top 20 Merchant wrt to Total transaction by Gen\_Z

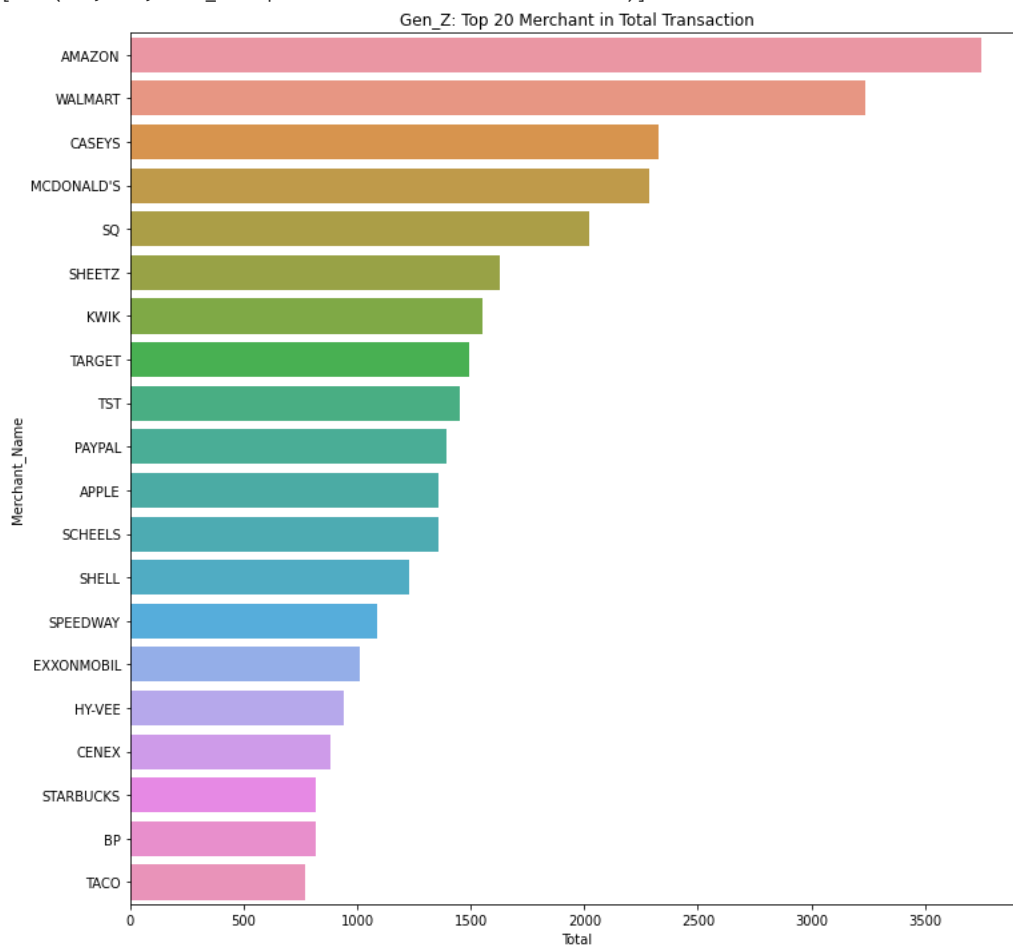
```
x=Gen_Z['Merchant_Name'].value_counts()[:20].rename_axis('Merchant_Name').reset_index(name='Total')
```

```
plt.figure(figsize = (12,12))
```

```
sn.barplot(x="Total", y="Merchant_Name", data=x,label="Merchant_Name").set(title='Gen_Z: Top 20 Merchant in Total Transaction')
```

```
#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Merchant in Total Spent.png")
```

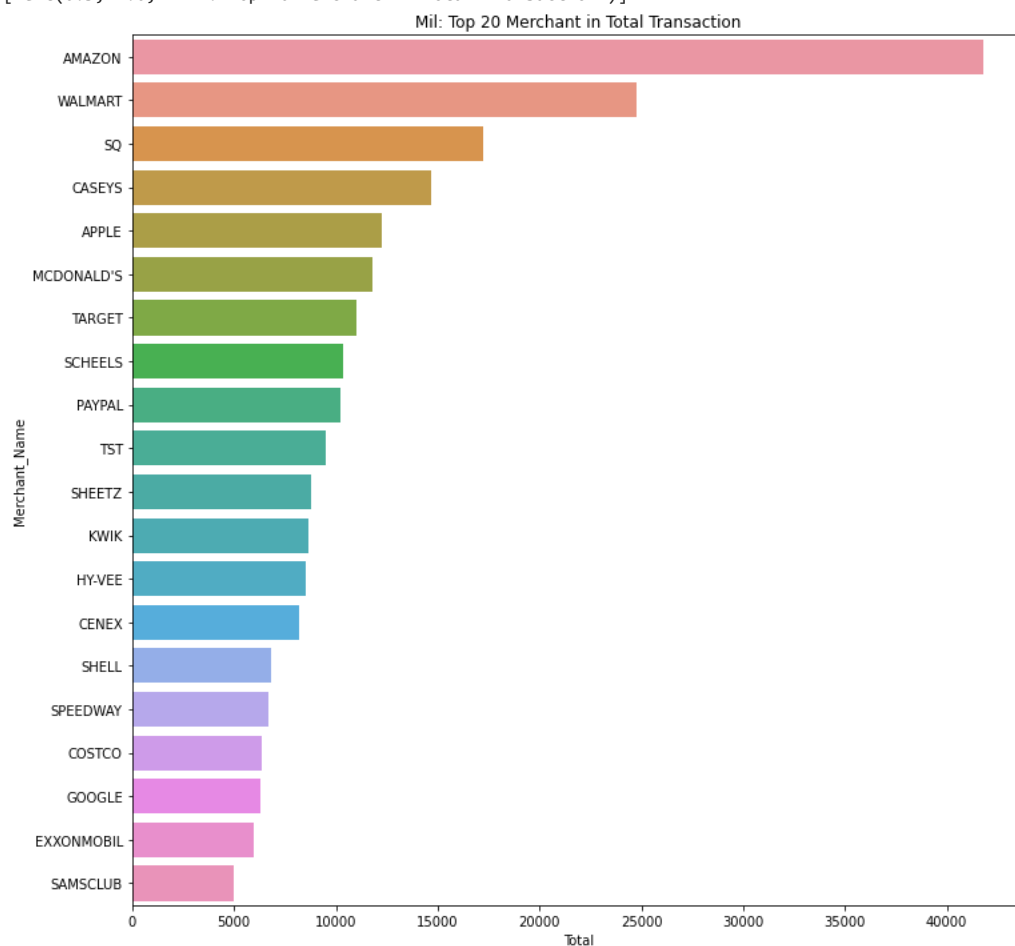
[Text(0.5, 1.0, 'Gen\_Z: Top 20 Merchant in Total Transaction')]



**MIL**

```
x=mil['Merchant_Name'].value_counts()[:20].rename_axis('Merchant_Name').reset_index(name='Total')
plt.figure(figsize = (12,12))
sn.barplot(x="Total", y="Merchant_Name", data=x,label="Merchant_Name").set(title='Mil: Top 20 Merchant in Total Transaction')
#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Merchant in Total Spent.png")
```

```
[Text(0.5, 1.0, 'Mil: Top 20 Merchant in Total Transaction')]
```



```
'SCHOOLS - DEFAULT' 'COMPUTERS/PERIPHERALS/SOFTWARE' 'RECREATION SERVICES' 'TOURIST ATTRACTIONS AND XHBT' 'STATIONERY STORES',
```

```
df['MCC_DESCRIPTION'].unique()
```

```

INTER-CONTINENTAL', 'GOLDEN NUGGET', 'CARIBBEAN AIRLINES',
'CLUB MED', 'ROSEN HOTELS AND RESORTS', 'LUXOR HOTEL AND CASINO',
'EMBASSY HOTELS', 'TREASURE ISLAND HOTEL & CASINO',
'RADISSON HOTEL', 'FONTAINEBLEAU RESORTS',
'ECONOMY INNS OF AMERICA', 'THUNDERBIRD/RED LION',
'SCANDIC HOTELS', 'AIR FRANCE', 'BALLY'S HOTEL AND CASINO',
'AEROFLOT', 'BAHAMASAIR', 'VENETIAN RESORT HOTEL CASINO',
'ANTIQUE REPRODUCTION STORES', 'WALDORF', 'LA QUINTA RESORT',
'FURRIERS AND FUR SHOPS', 'EASYJET', 'WIZZ AIRLINES',
'TROPICANA RESORT & CASINO', 'NEW YORK-NEW YORK HOTEL+CASINO',
'GAYLORD PALMS', 'CROSSLAND', 'SWISSOTEL', 'PAKISTAN',
'VIRGIN ATLANTIC', 'BEAU RIVAGE HOTEL AND CASINO',
'OUTBOUND TELEMARKETING MERCHNT', 'DIRECT MKTG-TRAVEL RELATED ARR',
'MERIDIEN', 'SOFITEL HOTELS', 'FAIRFIELD HOTEL',
'STRATOSPHERE HOTEL AND CASINO', 'FOUR SEASONS', 'MIDEASTAIR',
'QATAR AIRWAYS', 'EGYPTAIR', 'OSTEOPATHS', 'HOTELES EL PRESIDENTE',
'PAL AIR', 'NOVOTEL', 'GULF AIR (BAHRAIN)', 'LAN AIR',
'HILTON CONRAD', 'KOREAN AIR', 'HARVEY/BRISTOL HOTELS',
'TACA INTERNATIONAL', 'TAP AIR', 'HILTON INTERNATIONAL',
'SAUDIA AIR', 'SHILO INN', 'AFFILIATED AUTO RENTAL',
'BUDGET HOST INNS', 'DIRECT SELL/DOOR-TO-DOOR', 'WYNN LAS VEGAS',
'CANOPY HOTELS', 'ALITALIA', 'SANDMAN HOTELS', 'LXR',
'PEPPERMILL HOTEL CASINO', 'PARK INNS INTERNATIONAL',
'THE PALACE HOTEL', 'SAM'S TOWN HOTEL AND CASINO',
'BILTMORE HOTEL & SUITES', 'SHONEY'S INN', 'ROYAL HOTELS', 'SAS',
'HOTELES MELIA', 'GRAND SIERRA RESORT', 'ETIHADAIR',
'WINDWARD ISLAND', 'AUTOMOBILE SUPPLY STORES', 'ST. REGIS HOTEL',
'ALA MOANA HOTEL', 'CATHAYPACAIR', 'SWISS INTERNATIONAL AIRLINES',
'OXFORD SUITES', 'WHISKEY PETE'S HOTEL & CASINO', 'SANDMAN INN',
'AZUL AIR', 'CARLTON HOTELS', 'CITY LODGE HOTELS', 'STEIGENBERGER',
'CHATEAU ELAN WINERY AND RESORT', 'PULLMAN INTERNATIONAL HOTELS',
'FREMONT HOTEL AND CASINO'], dtype=object)

```

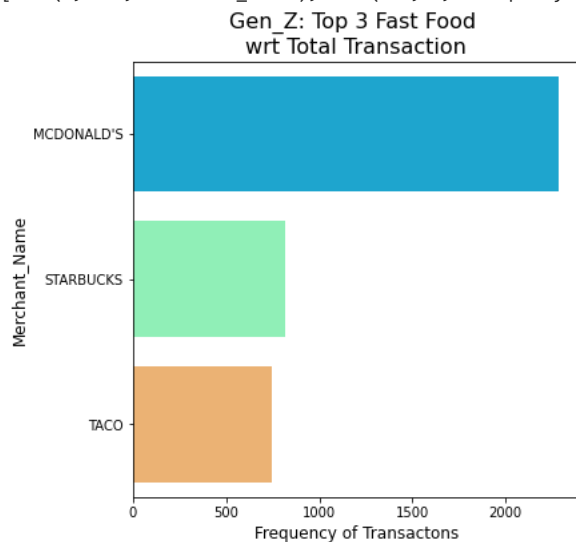
### MCC\_Description

```

x=data['Merchant_Name'].value_counts()[3:].rename_axis('Merchant_Name').reset_index(name='Total')
fig=plt.figure(figsize = (6,6))
plt.title('Gen_Z: Top 3 Fast Food \nwrt Total Transaction', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="Total", y="Merchant_Name", data=x,label="Merchant_Name", palette='rainbow').set(ylabel="Merchant_Name",xlabel="Frequency of Trai
#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Top 20 MCC_DESCRIPTION wrt Total Transaction.png")

```

```
[Text(0, 0.5, 'Merchant_Name'), Text(0.5, 0, 'Frequency of Transactons')]
```

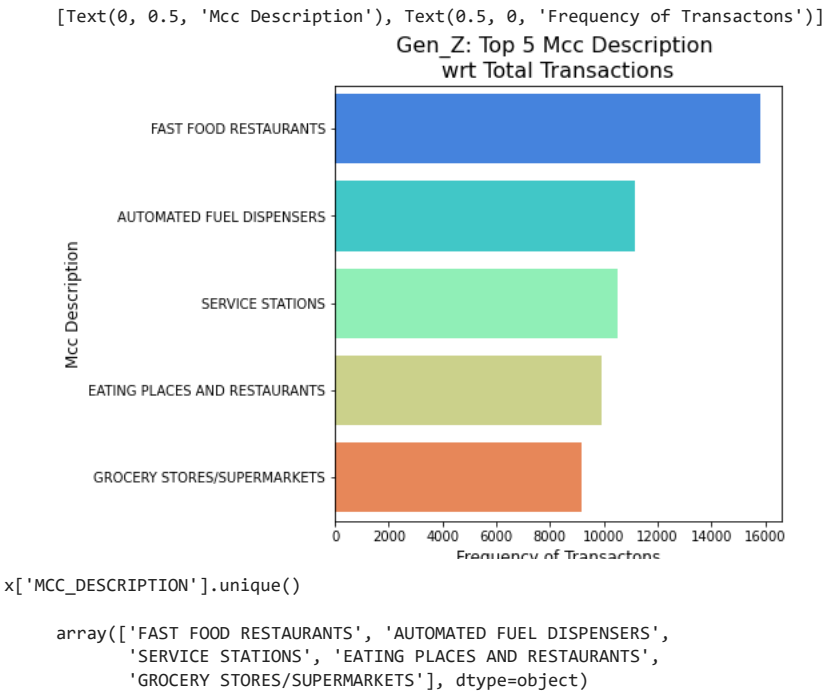


### MIL

```

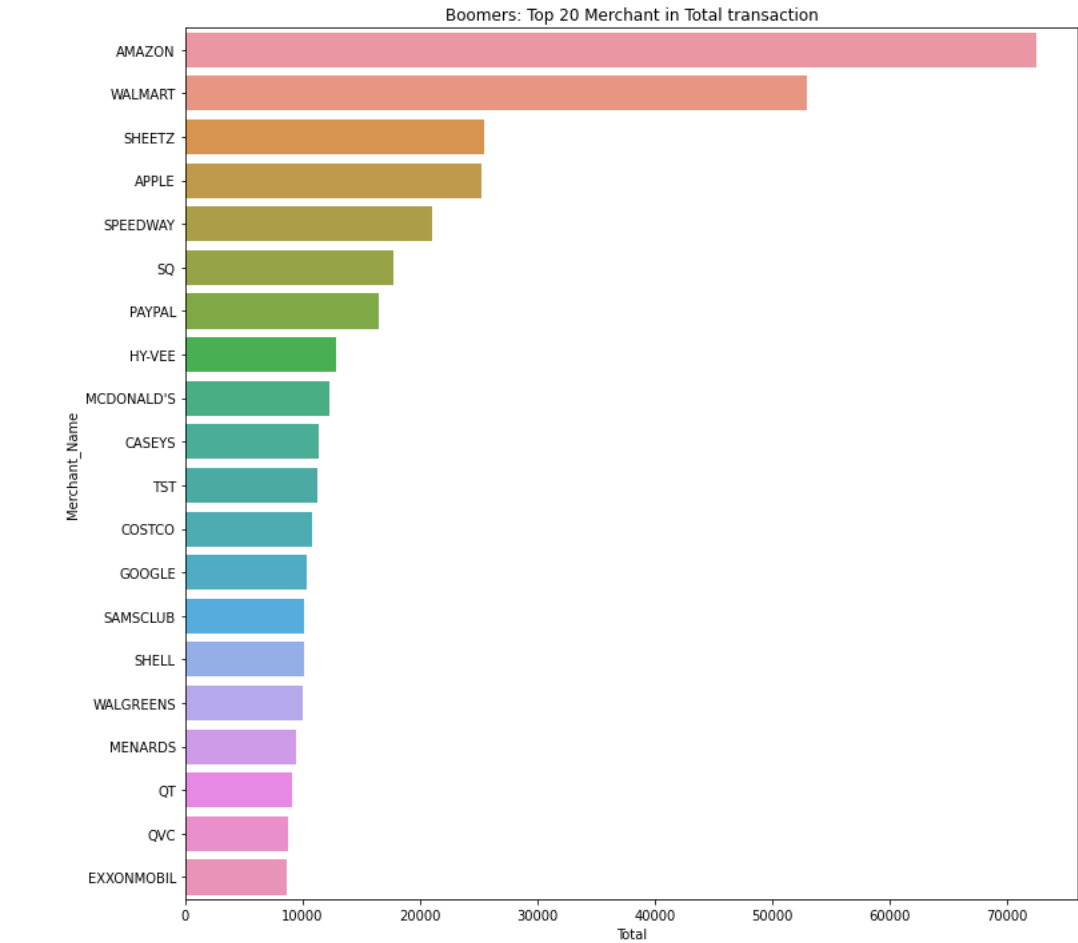
x=Gen_Z['MCC_DESCRIPTION'].value_counts()[5:].rename_axis('MCC_DESCRIPTION').reset_index(name='Total')
fig=plt.figure(figsize = (6,6))
plt.title('Gen_Z: Top 5 Mcc Description \nwrt Total Transactions', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="Total", y="MCC_DESCRIPTION", data=x,label="Mcc Description", palette='rainbow').set(ylabel="Mcc Description",xlabel="Frequency of Transactions")
#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Top 20 MCC_DESCRIPTION wrt Total Transaction.png")

```



TOP 20 Merchant wrt total transaction for Boomers

```
x=Boomers['Merchant_Name'].value_counts()[:20].rename_axis('Merchant_Name').reset_index(name='Total')
plt.figure(figsize = (12,12))
sn.barplot(x="Total", y="Merchant_Name", data=x,label="Merchant_Name").set(title='Boomers: Top 20 Merchant in Total transaction')
plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Boomers Top 20 Merchant in Total transaction.png")
```



**Top 20 Merchant wrt total spending Gen\_Z**

```

x=Gen_Z['Merchant_Name'].value_counts().rename_axis('Merchant_Name').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(Gen_Z.groupby('Merchant_Name')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(Gen_Z.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(Gen_Z.groupby('Merchant_Name')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'Merchant_Name')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'Merchant_Name')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'Merchant_Name')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})

```

```
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])
```

```

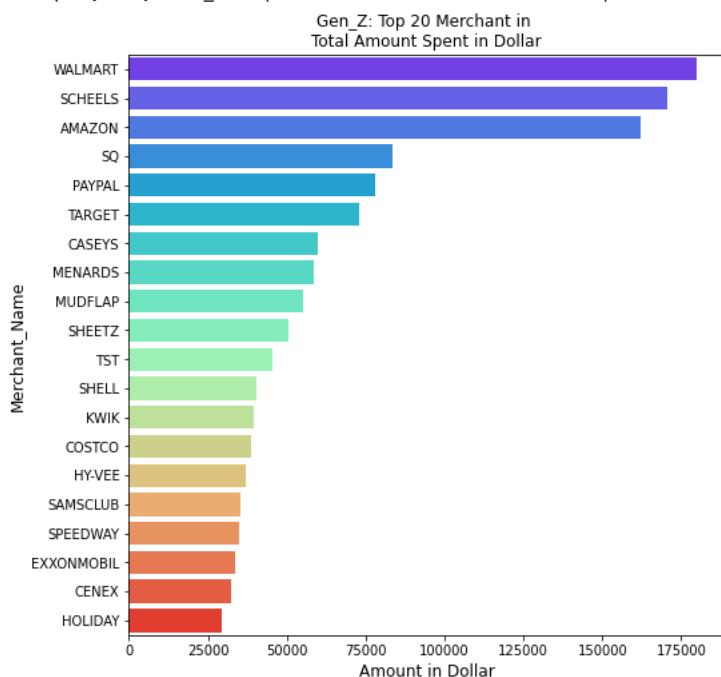
fig=plt.figure(figsize = (8,8))
plt.title('Gen_Z: Top 5 Mcc Description wrt Total Transaction', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="SUM", y="Merchant_Name", data=Gen_Z_Top_merchant,label="Merchant_Name", palette='rainbow').set(title='Gen_Z: Top 20 Merchant in
#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Merchant in Total Spent.png")

```

```

[Text(0.5, 0, 'Amount in Dollar'),
Text(0.5, 1.0, 'Gen_Z: Top 20 Merchant in \nTotal Amount Spent in Dollar')]

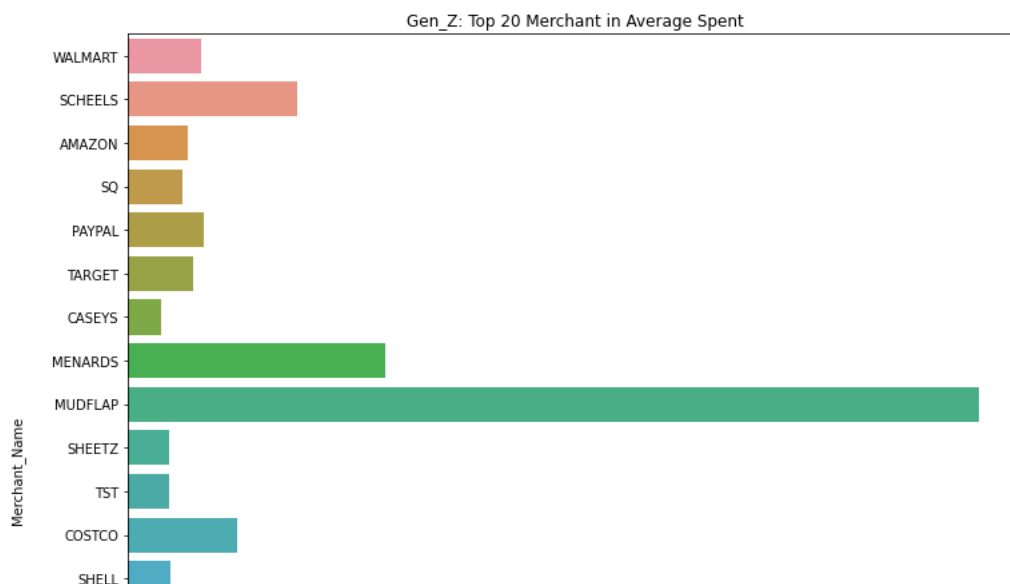
```



```

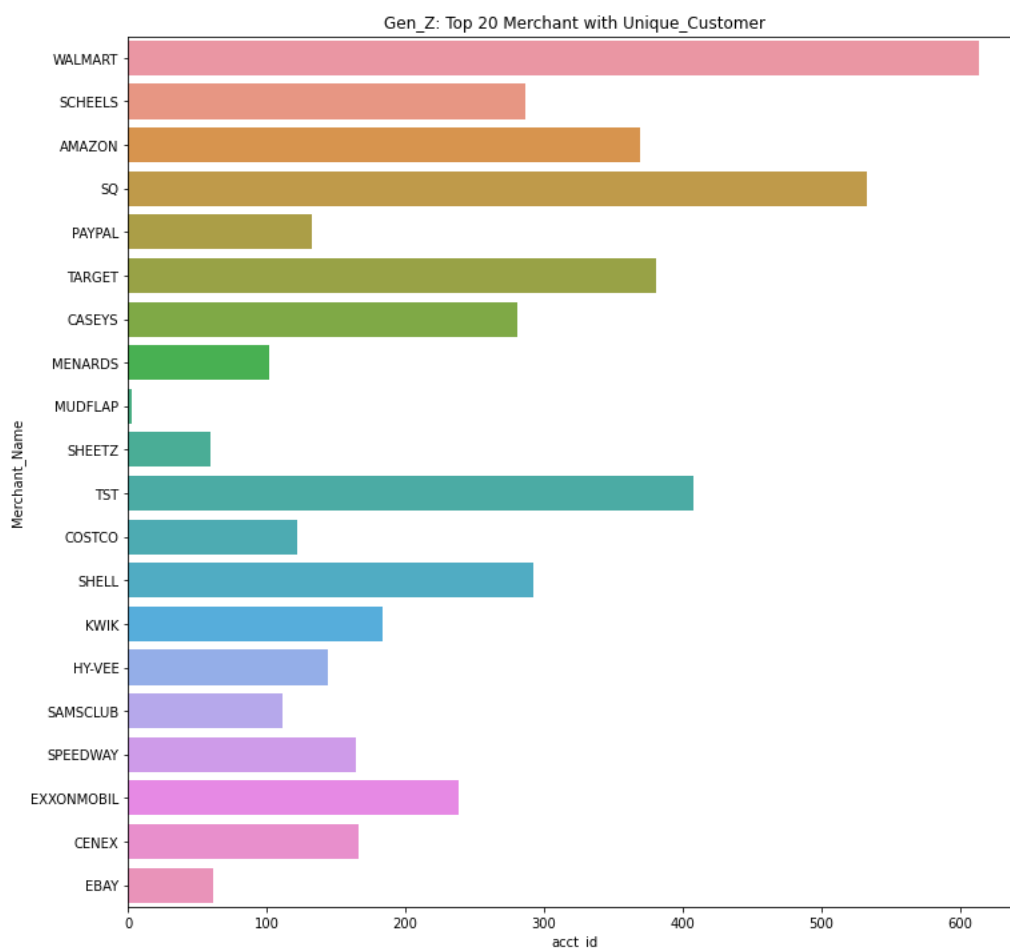
plt.figure(figsize = (12,12))
sn.barplot(x="AVG", y="Merchant_Name", data=Gen_Z_Top_merchant,label="Merchant_Name").set(title='Gen_Z: Top 20 Merchant in Average Spent')
plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Merchant in Average Spent.png")

```



```
plt.figure(figsize = (12,12))
sn.barplot(x="acct_id", y="Merchant_Name", data=Gen_Z_Top_merchant,label="Merchant_Name").set(title='Gen_Z: Top 20 Merchant with Unique_Custor')

plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z Top 20 Merchant with Unique_Customer.png")
```



## MIL

```
x=Boomers['Merchant_Name'].value_counts().rename_axis('Merchant_Name').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(Boomers.groupby('Merchant_Name')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(Boomers.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(Boomers.groupby('Merchant_Name')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'Merchant_Name')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'Merchant_Name')
```

```

merchant_all=pd.merge(merchant_all, unique_customer, on = 'Merchant_Name')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
merchant_all_min_trans_30.head(4)

```

Double-click (or enter) to edit

Gen\_Z.columns

```

Index(['acct_id', 'VINTAGE_YEAR', 'STATE', 'GENERATION', 'AGE', 'FICO',
      'MONTHLY_INCOME', 'PRODUCT_SEGMENT', 'PARTNERBUSINESSKEY',
      'PARTNER_NAME', 'CREDIT_LIMIT', 'TRANSACTIONPOSTDT', 'TRANSACTIONAMT',
      'MERCHANTDESC', 'MCC', 'MCC_DESCRIPTION', 'SPENDCATEGORYNM', 'ENTRYNBR',
      'ME_BALANCE', 'date', 'buy_month', 'time_series', 'buy_weekday',
      'Merchant_Name'],
      dtype='object')

```

```

Gen_Z[Gen_Z['Merchant_Name']=='APPLE']['SPENDCATEGORYNM'].unique()

```

```

array(['RETAIL GOODS', 'OTHER', 'AUTOMOTIVE', 'GROCERY - REWARDS',
      'TRAVEL - REWARDS - OTHER'], dtype=object)

```

```

Gen_Z[Gen_Z['Merchant_Name']=='APPLE']['MCC_DESCRIPTION'].unique()

```

```

array(['LARGE DIGITAL GOODS MERCHANT', 'RECORD STORES',
      'DIGITAL GOODS BOOKSMOVIEMUSIC', 'ELECTRONIC SALES',
      'CIGAR STORES/STANDS', 'CAR & TRUCK DEALERS/NEW/USED',
      'GROCERY STORES/SUPERMARKETS', 'MISC FOOD STORES - DEFAULT',
      'TRAVEL AGENCIES'], dtype=object)

```

## Top 20 Merchant by Boomers

```

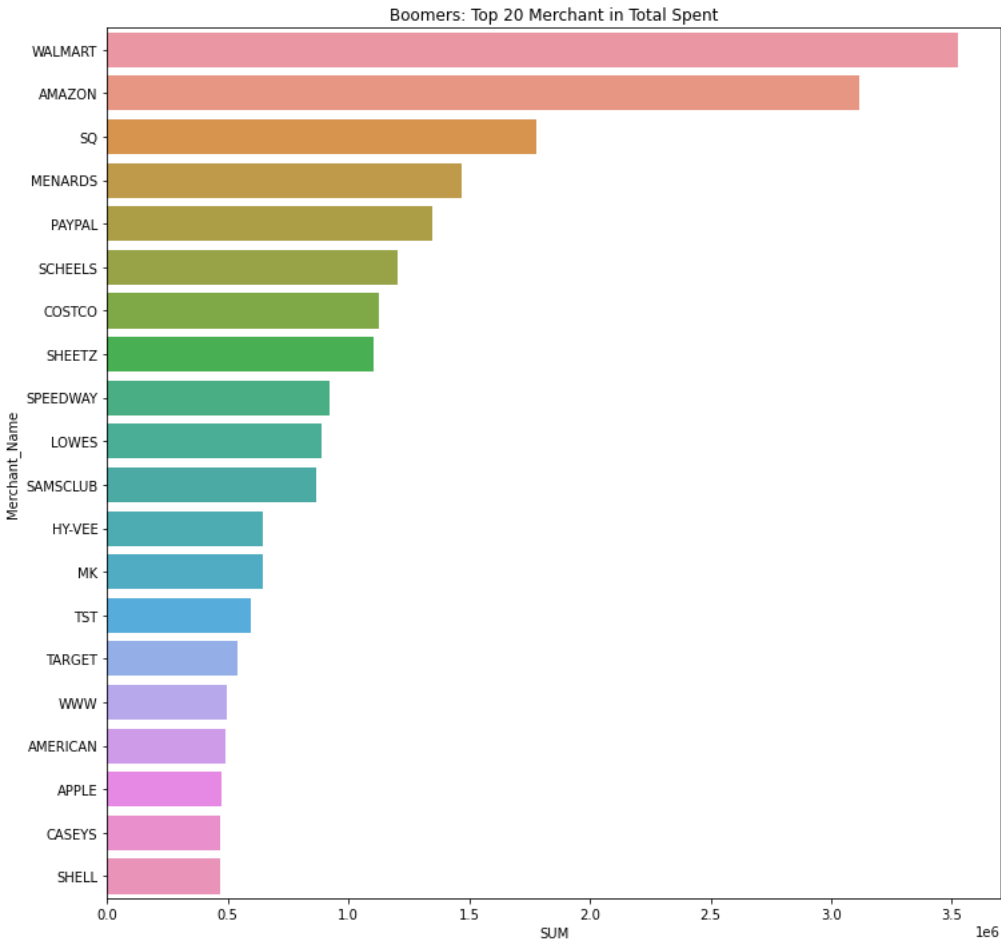
x=mil['Merchant_Name'].value_counts().rename_axis('Merchant_Name').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(mil.groupby('Merchant_Name')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(mil.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(mil.groupby('Merchant_Name')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'Merchant_Name')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'Merchant_Name')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'Merchant_Name')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
merchant_all_min_trans_30.head(4)
Boomers_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])
plt.figure(figsize = (12,12))
sn.barplot(x="SUM", y="Merchant_Name", data=Boomers_Top_merchant,label="Merchant_Name").set(title='MIL: Top 20 Merchant in Total Spent')

#plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Boomers Top 20 Merchant in Total Spent.png")

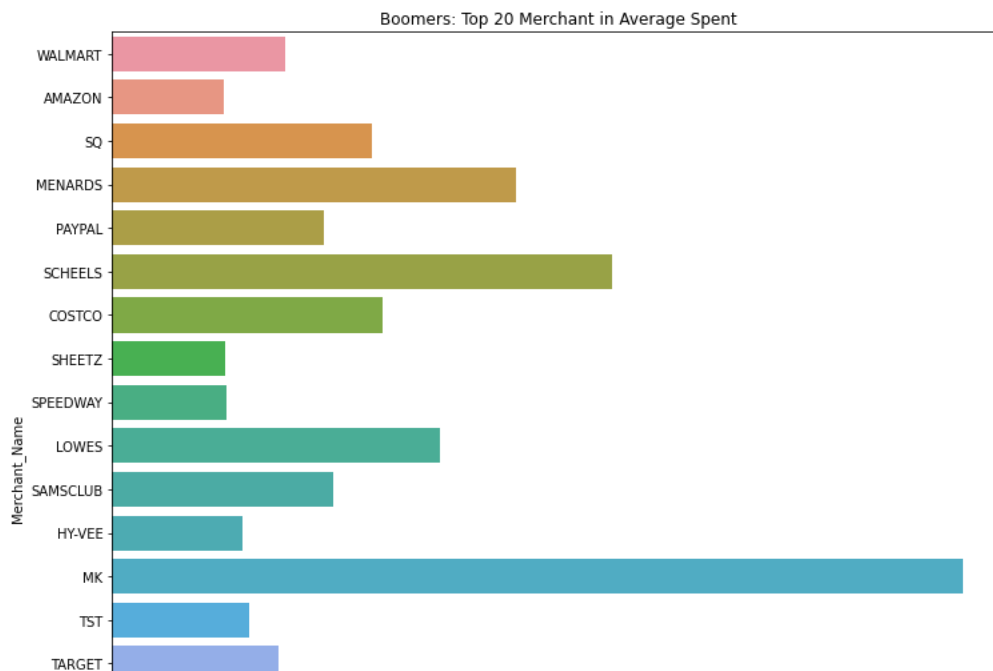
```



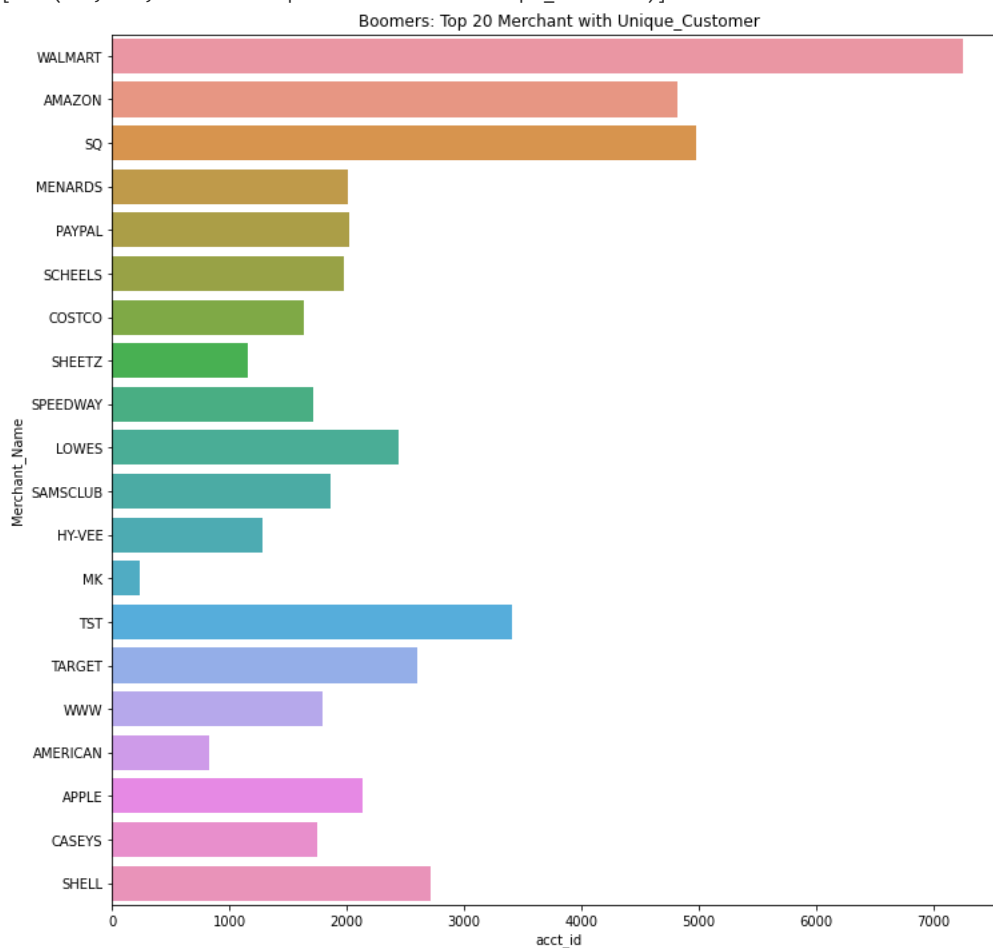
```
[Text(0.5, 1.0, 'MIL: Top 20 Merchant in Total Spent')]  
  
MIL: Top 20 Merchant in Total Spent  
  
AMAZON  
WALMART  
SCHEELS  
SQ  
PAYPAL  
MENARDS  
TARGET  
  
Boomers_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])  
  
plt.figure(figsize = (12,12))  
sn.barplot(x="SUM", y="Merchant_Name", data=Boomers_Top_merchant,label="Merchant_Name").set(title='Boomers: Top 20 Merchant in Total Spent')  
  
plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Boomers Top 20 Merchant in Total Spent.png")
```



```
plt.figure(figsize = (12,12))  
sn.barplot(x="AVG", y="Merchant_Name", data=Boomers_Top_merchant,label="Merchant_Name").set(title='Boomers: Top 20 Merchant in Average Spent')  
  
plt.savefig("/content/drive/MyDrive/Research/Datathon/Figure/Boomers Top 20 Merchant in Total Spent.png")
```



```
plt.figure(figsize = (12,12))
sn.barplot(x="acct_id", y="Merchant_Name", data=Boomers_Top_merchant,label="Merchant_Name").set(title='Boomers: Top 20 Merchant with Unique_Ci
[Text(0.5, 1.0, 'Boomers: Top 20 Merchant with Unique_Customer')]
```



### Top 5 merchant of each category on Total Spending

```
category=pd.unique(Gen_Z['SPENDCATEGORYNM'])
for item in category:
    data=Gen_Z[Gen_Z['SPENDCATEGORYNM']==item]
```

```

total_transaction = pd.DataFrame(data.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
x=total_transaction.nlargest(n=3, columns=['TRANSACTIONAMT']).reset_index('Merchant_Name')
plt.figure(figsize = (6,6))
titl='Gen_Z: Top 3 Merchant for \nCategory: '+item
des="/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z "+item[:4]+" Top 3 Merchant for Category "+item[:4]+".png"
sn.barplot(x="TRANSACTIONAMT", y="Merchant_Name", data=x,label="Merchant", palette='rainbow').set(title=titl,xlabel='Total amount in Dollar')
plt.savefig(des)

# data=Boomers[Boomers['SPENDCATEGORYNM']==item]
# total_transaction = pd.DataFrame(data.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
# x=total_transaction.nlargest(n=4, columns=['TRANSACTIONAMT']).reset_index('Merchant_Name')
# plt.figure(figsize = (6,6))
# titl='Boomers: Top 4 Merchant for Category: '+item
# des="/content/drive/MyDrive/Research/Datathon/Figure/Boomers "+item[:4]+" Top 4 Merchant for Category.png"
# sn.barplot(x="TRANSACTIONAMT", y="Merchant_Name", data=x,label="Merchant").set(title=titl)
# plt.savefig(des)

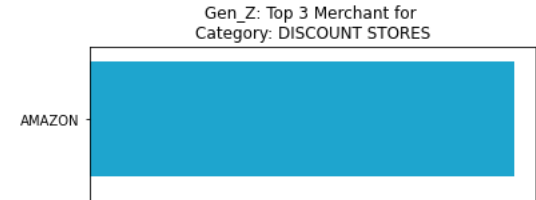
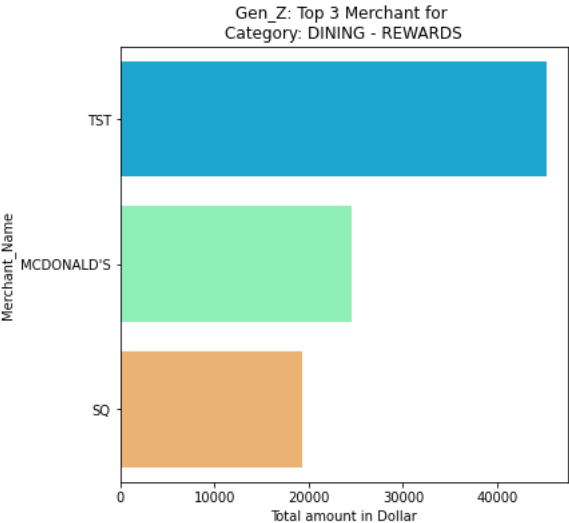
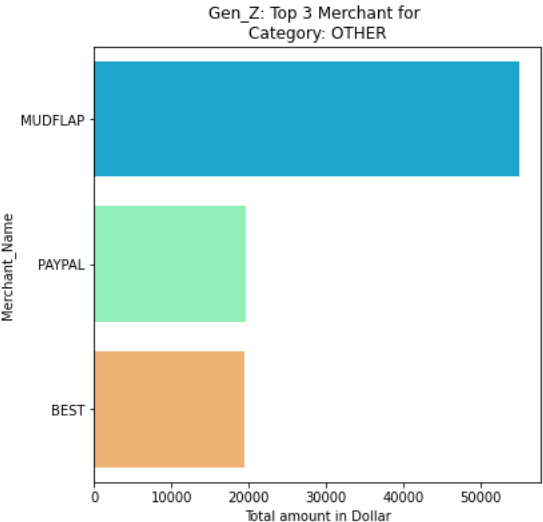
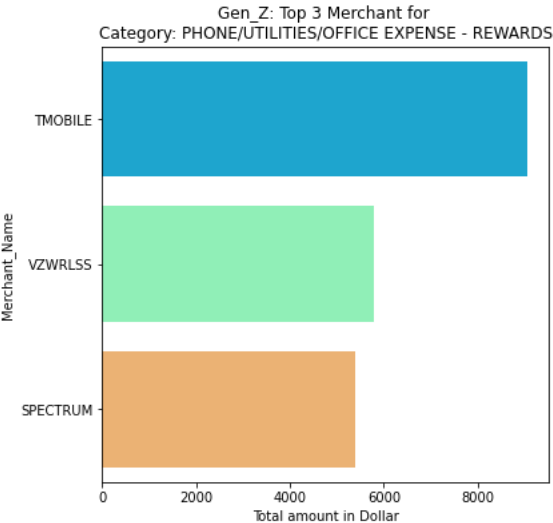
# data=mil[mil['SPENDCATEGORYNM']==item]
# total_transaction = pd.DataFrame(data.groupby('Merchant_Name')['TRANSACTIONAMT'].sum())
# x=total_transaction.nlargest(n=4, columns=['TRANSACTIONAMT']).reset_index('Merchant_Name')
# plt.figure(figsize = (6,6))
# titl='MIL: Top 4 Merchant for Category: '+item
# des="/content/drive/MyDrive/Research/Datathon/Figure/Boomers "+item[:4]+" Top 4 Merchant for Category.png"
# sn.barplot(x="TRANSACTIONAMT", y="Merchant_Name", data=x,label="Merchant").set(title=titl)
# #plt.savefig(des)

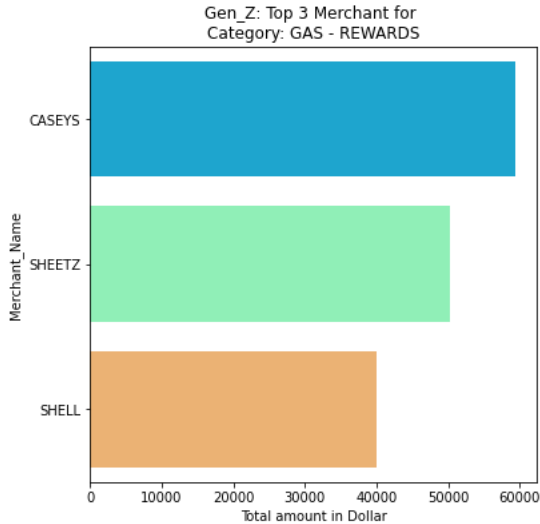
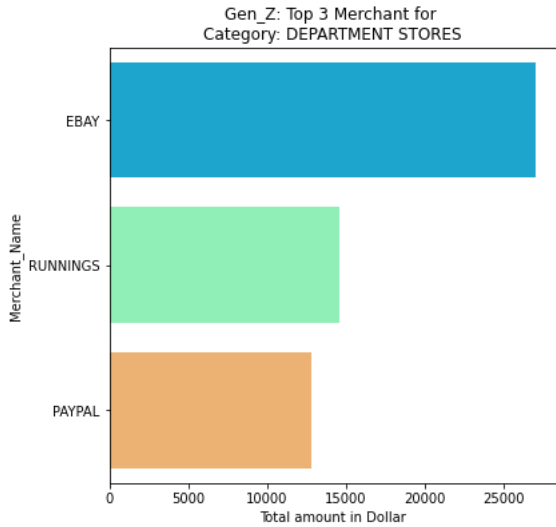
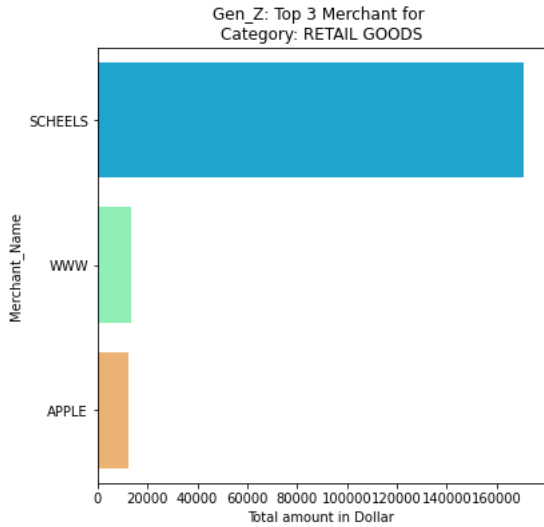
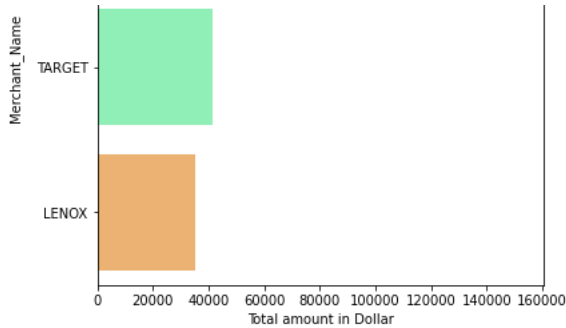
```

/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

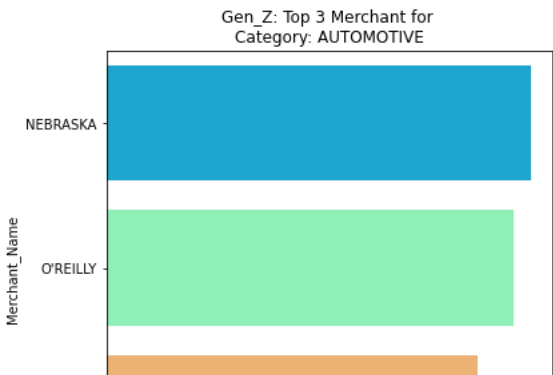
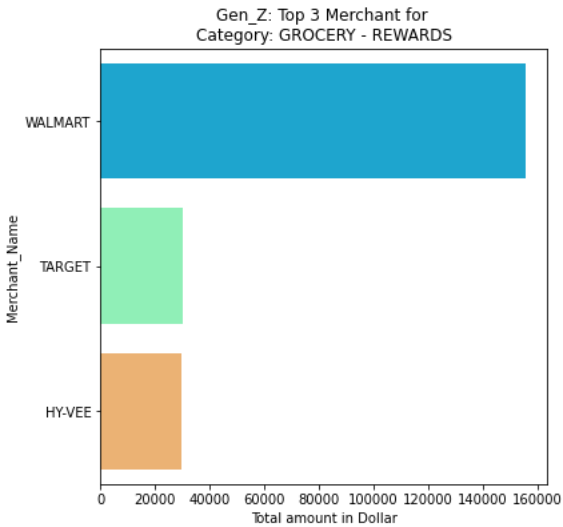
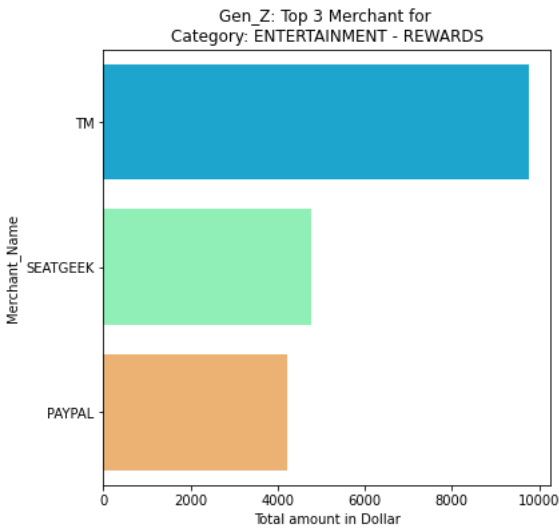
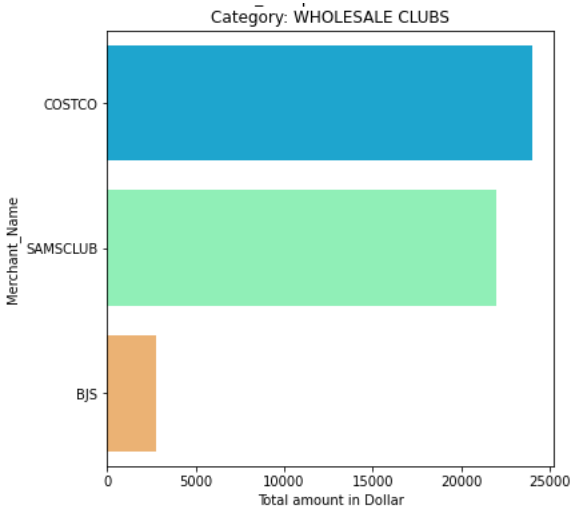
/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

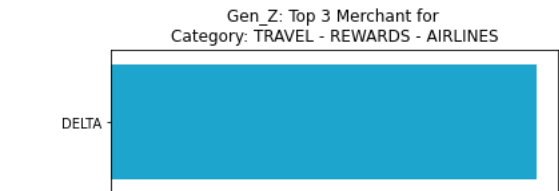
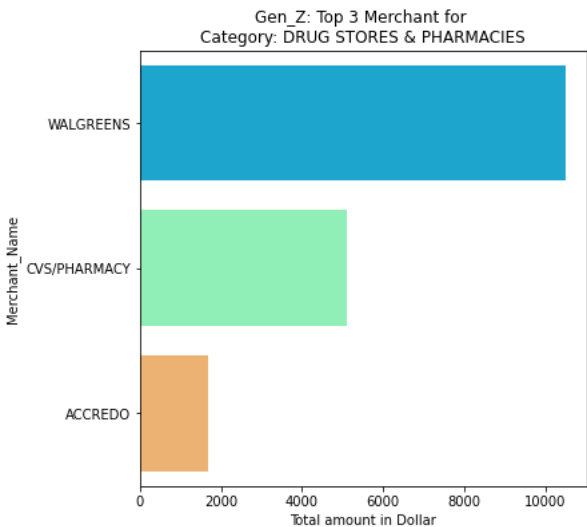
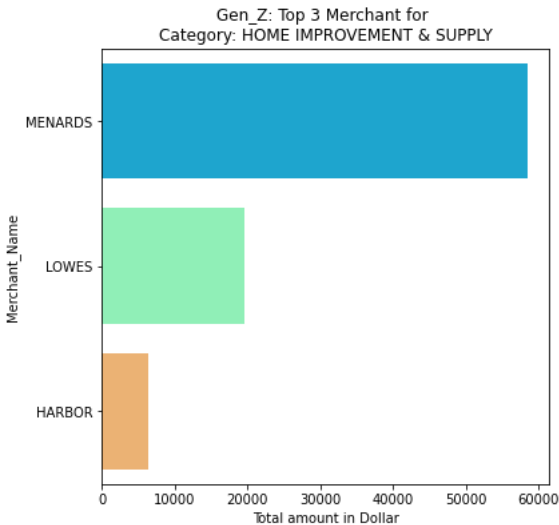
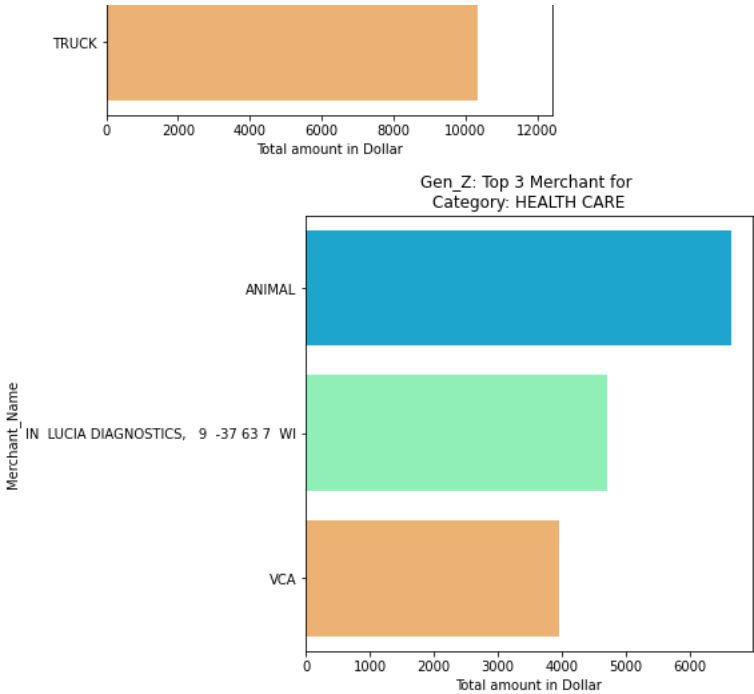
/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

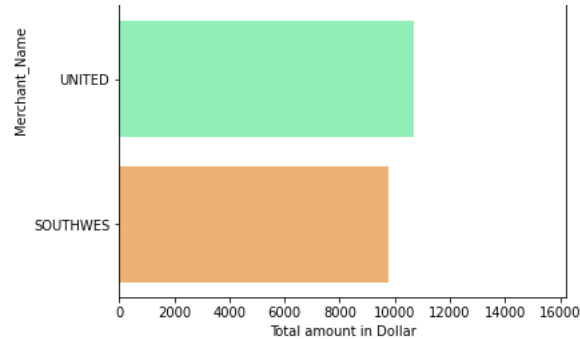




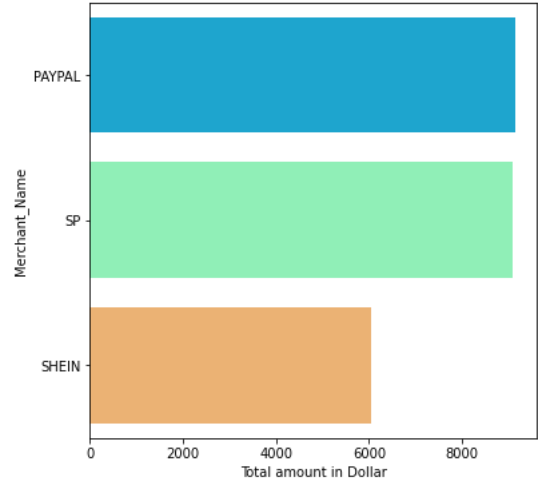
Gen\_Z: Top 3 Merchant for



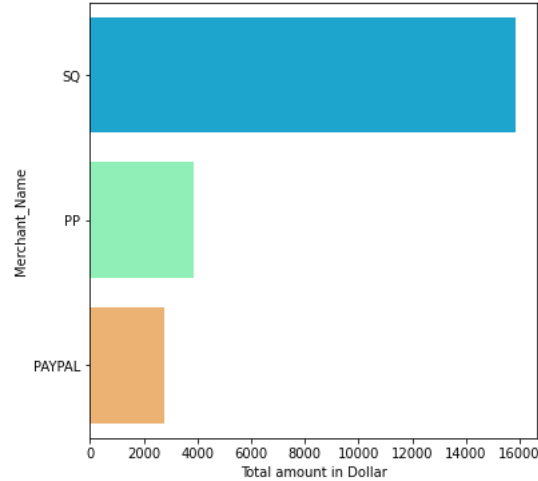




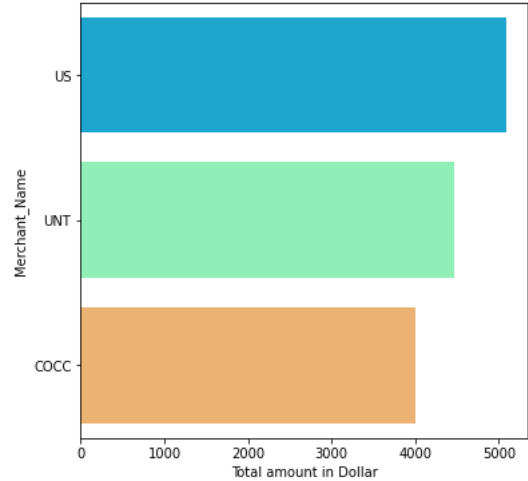
Gen\_Z: Top 3 Merchant for Category: APPAREL & ACCESSORIES



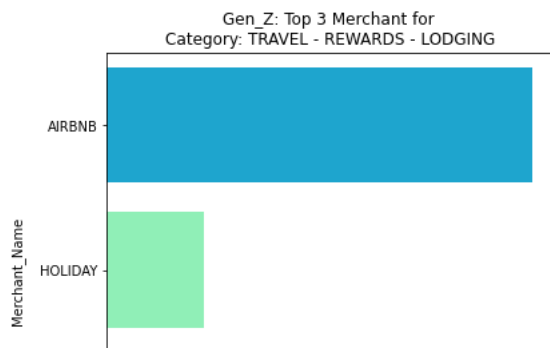
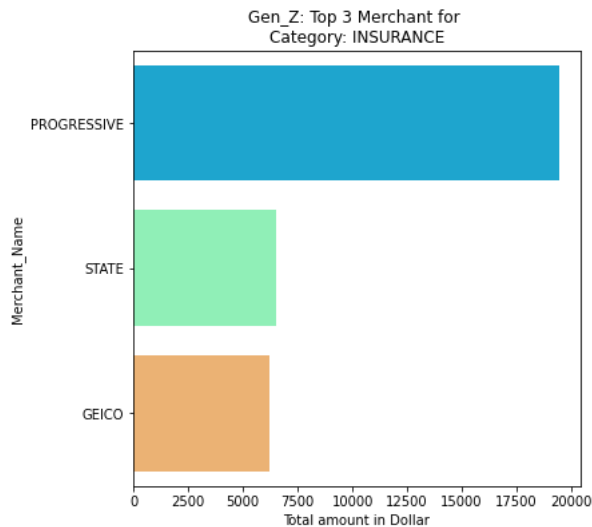
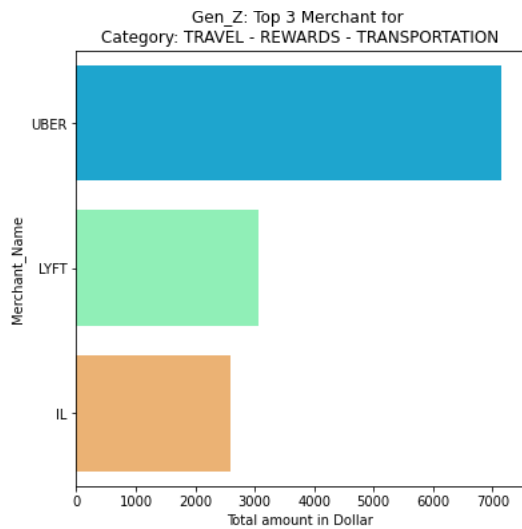
Gen\_Z: Top 3 Merchant for Category: RETAIL SERVICES



Gen\_Z: Top 3 Merchant for Category: EDUCATION & GOVERNMENT







#### Top 4 Merchant on each category on Unique Customers:

```

category=pd.unique(Gen_Z['SPENDCATEGORYNM'])
for item in category:
    data=Gen_Z[Gen_Z['SPENDCATEGORYNM']==item]
    unique_customer = pd.DataFrame(data.groupby('Merchant_Name')['acct_id'].nunique())
    x=unique_customer.nlargest(n=4, columns=['acct_id']).reset_index('Merchant_Name')
    plt.figure(figsize = (6,6))
    titl='Gen_Z: Top 3 Merchant for \nCategory: '+item
    des="/content/drive/MyDrive/Research/Datathon/Figure/Gen_Z "+item[:4]+" Top 3 Merchant on Unique Customers for Category "+item[:4]+".png"
    sn.barplot(x="acct_id", y="Merchant_Name", data=x,label="Merchant",palette='rainbow').set(title=titl,xlabel="Unique customers")
    plt.savefig(des)

# data=Boomers[Boomers['SPENDCATEGORYNM']==item]
# unique_customer = pd.DataFrame(data.groupby('Merchant_Name')['acct_id'].nunique())
# x=unique_customer.nlargest(n=4, columns=['acct_id']).reset_index('Merchant_Name')
# plt.figure(figsize = (6,6))
# titl='Boomers: Top 4 Merchant for Category: '+item
# des="/content/drive/MyDrive/Research/Datathon/Figure/Boomers "+item[:4]+" Top 4 on Unique Customers Merchant for Category.png"
# sn.barplot(x="acct_id", y="Merchant_Name", data=x,label="Merchant").set(title=titl)

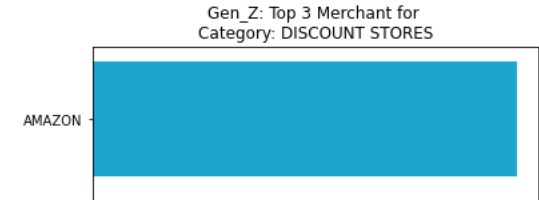
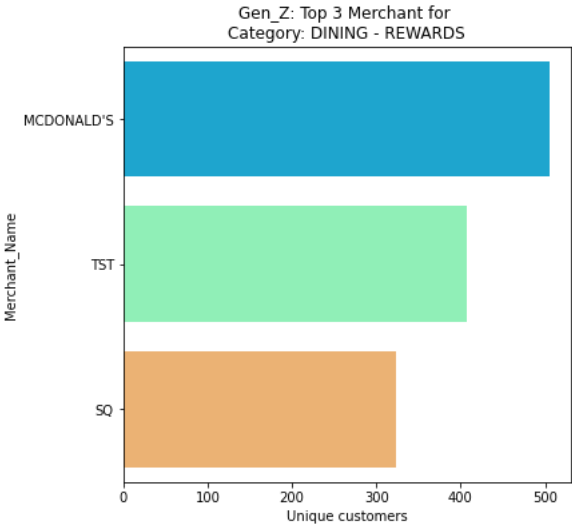
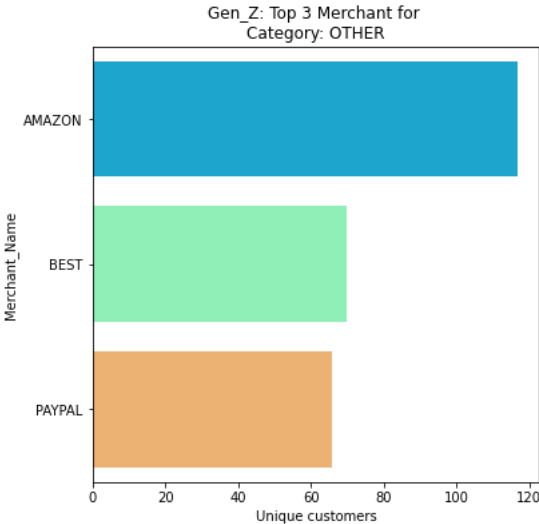
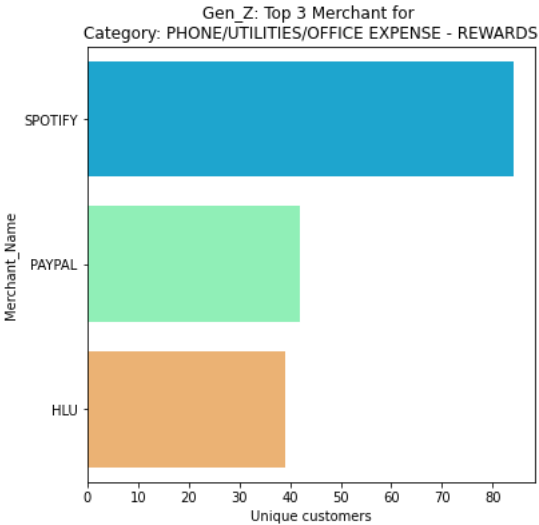
```

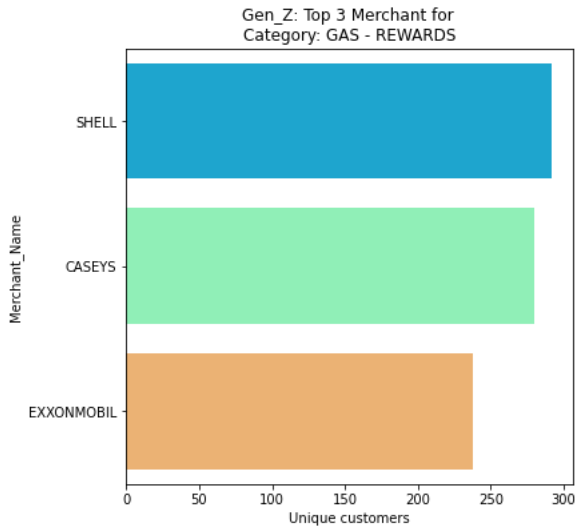
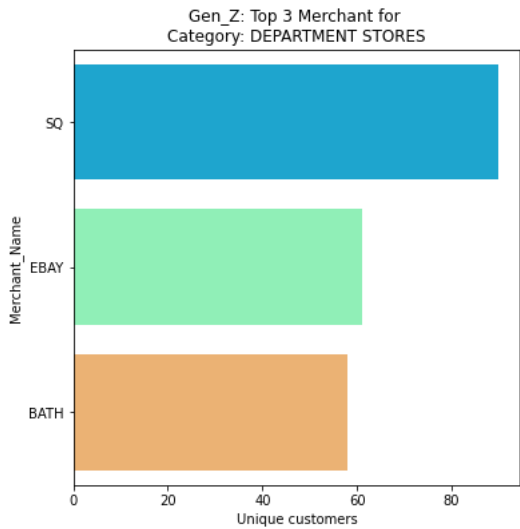
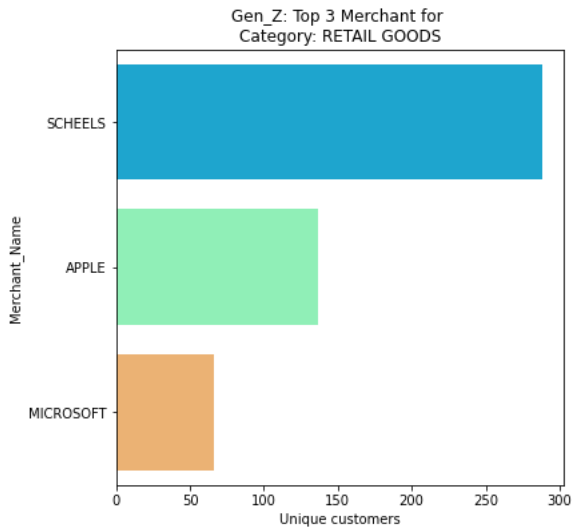
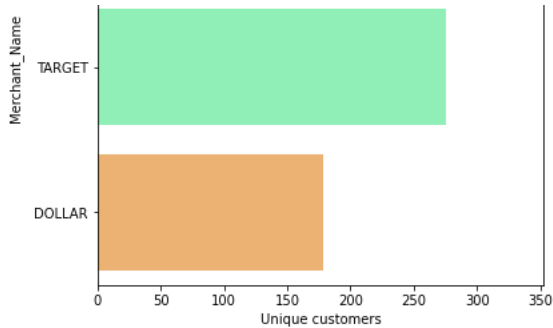
```
# plt.savefig(des)
# data=mil[mil['SPENDCATEGORYNM']==item]
# unique_customer = pd.DataFrame(data.groupby('Merchant_Name')['acct_id'].nunique())
# x=unique_customer.nlargest(n=4, columns=['acct_id']).reset_index('Merchant_Name')
# plt.figure(figsize = (6,6))
# titl='MIL: Top 4 Merchant for Category: '+item
# des="/content/drive/MyDrive/Research/Datathon/Figure/Boomers "+item[:4]+" Top 4 on Unique Customers Merchant for Category.png"
# sn.barplot(x="acct_id", y="Merchant_Name", data=x,label="Merchant").set(title=titl)
# plt.savefig(des)
```

/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

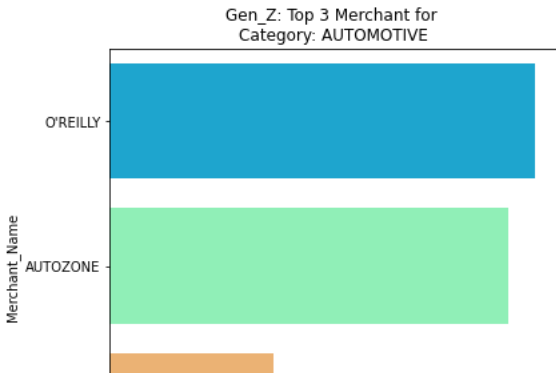
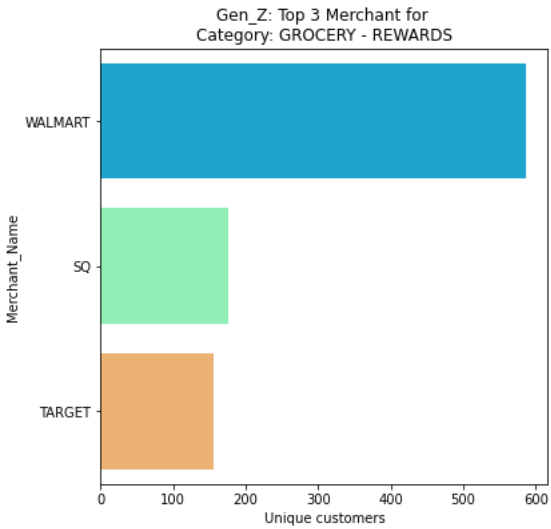
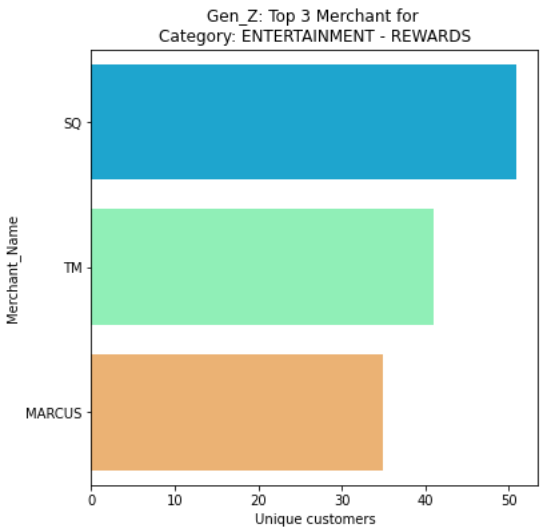
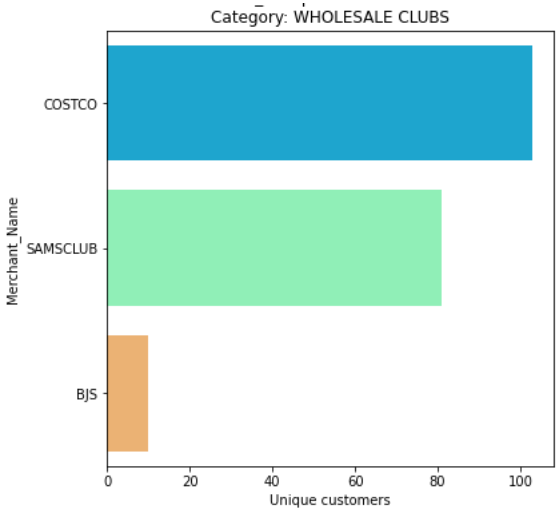
/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

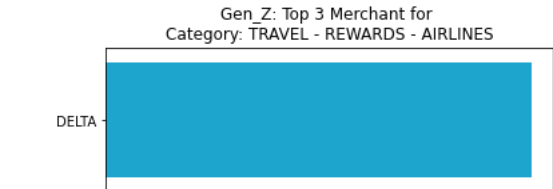
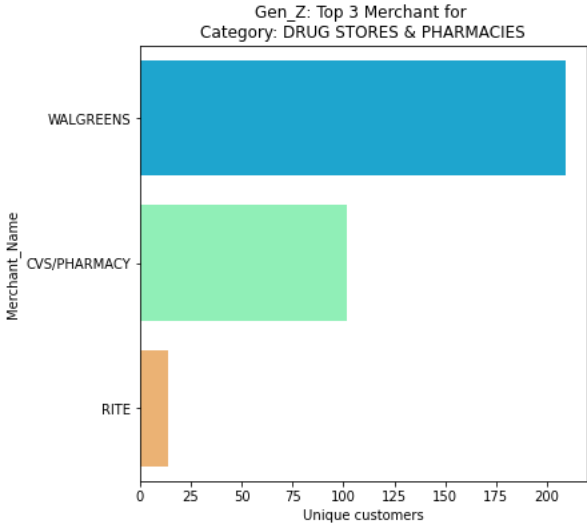
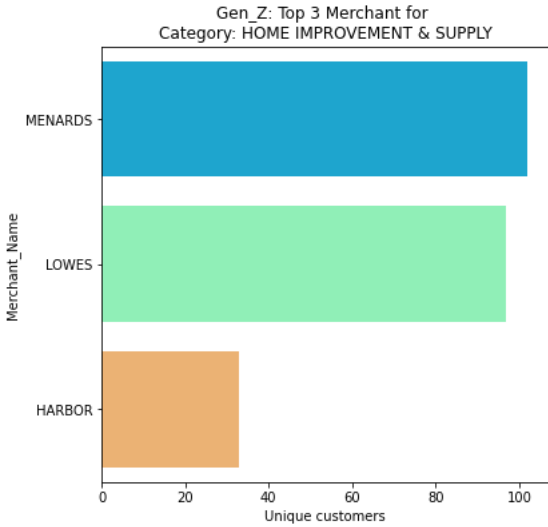
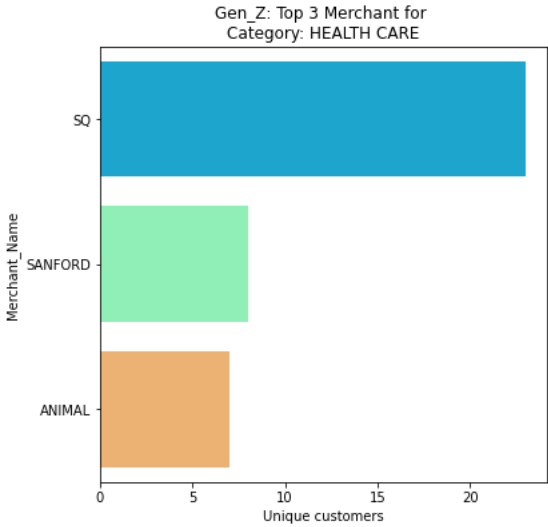
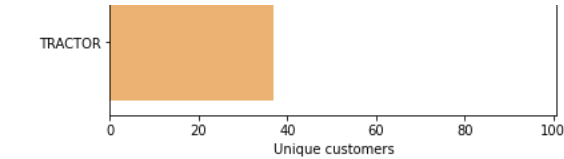
/usr/local/lib/python3.7/dist-packages/ipykernel\_launcher.py:6: RuntimeWarning: More than 20 figures have been opened. Figures create

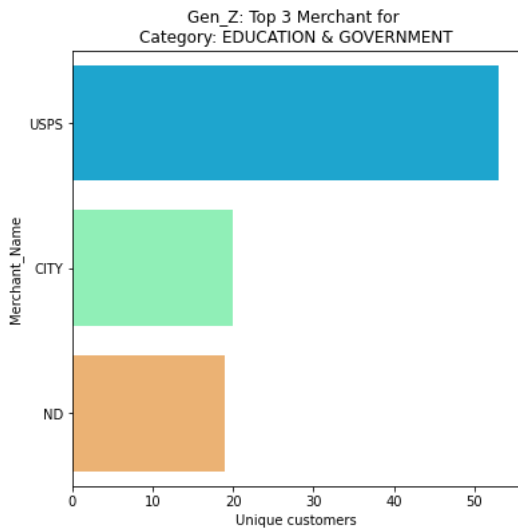
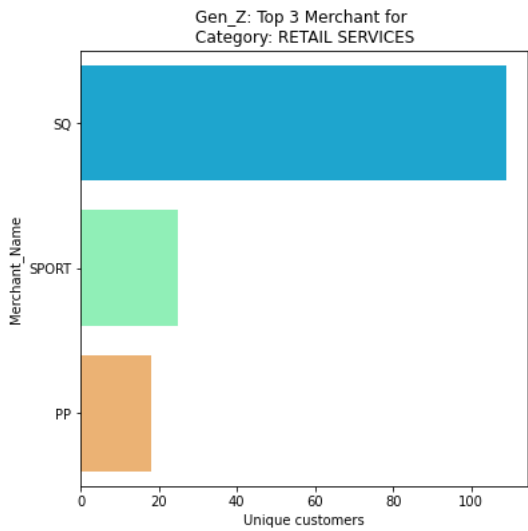
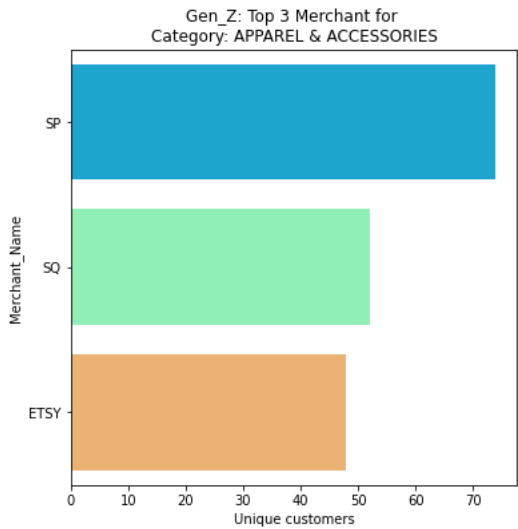
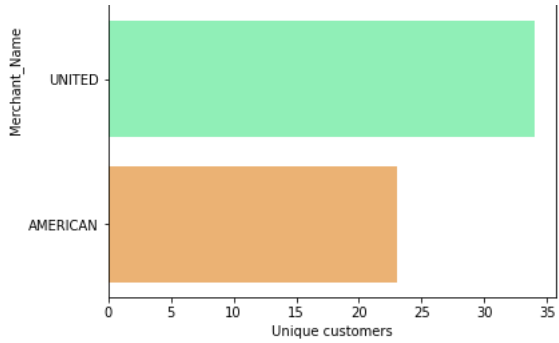


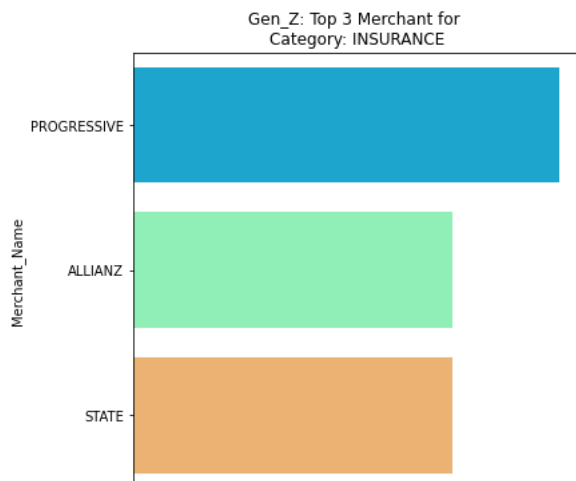
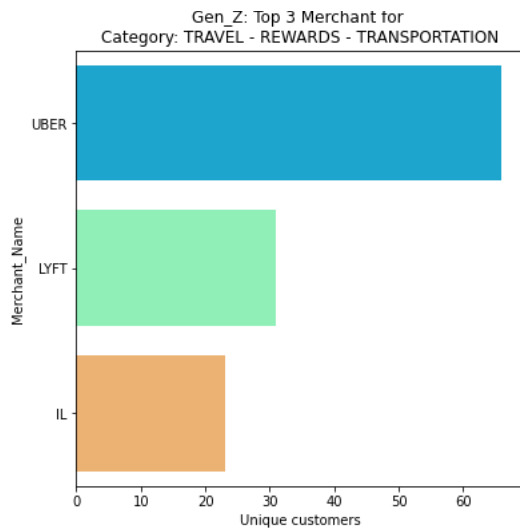


Gen\_Z: Top 3 Merchant for









### Analysis of MCC\_DESCRIPTION for GEN\_Z

```

Gen_Z: Top 3 Merchant for
x=Gen_Z['MCC_DESCRIPTION'].value_counts().rename_axis('MCC_DESCRIPTION').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(Gen_Z.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(Gen_Z.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(Gen_Z.groupby('MCC_DESCRIPTION')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'MCC_DESCRIPTION')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=5, columns=['SUM'])
fig=plt.figure(figsize = (6,6))
plt.title('GEN_Z: Top 5 Mcc Description \nwrt Total Amount Spent in Dollar', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="SUM", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION", palette='rainbow').set(xlabel='Amount in Dollar',yli

```



```
[Text(0, 0.5, 'MCC Description'), Text(0.5, 0, 'Amount in Dollar')]
```

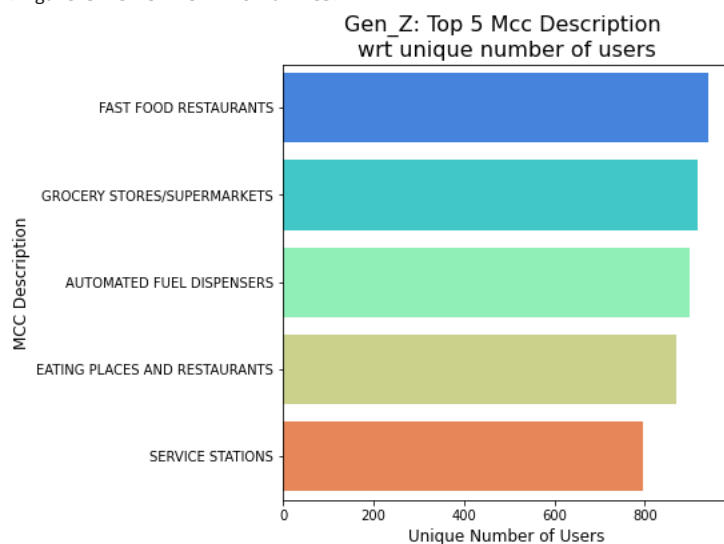
GEN\_Z: Top 5 Mcc Description  
wrt Total Amount Spent in Dollar



```
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=5, columns=['acct_id'])
fig=plt.figure(figsize = (6,6))
fig=plt.figure(figsize = (6,6))
plt.title('Gen_Z: Top 5 Mcc Description \nwrt unique number of users', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="acct_id", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION", palette='rainbow').set(xlabel='Unique Number of
```

```
[Text(0, 0.5, 'MCC Description'), Text(0.5, 0, 'Unique Number of Users')]
```

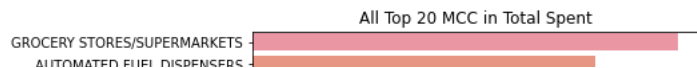
<Figure size 432x432 with 0 Axes>



Double-click (or enter) to edit

```
x=df['MCC_DESCRIPTION'].value_counts().rename_axis('MCC_DESCRIPTION').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(df.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(df.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(df.groupby('MCC_DESCRIPTION')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'MCC_DESCRIPTION')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])
plt.figure(figsize = (6,6))
sn.barplot(x="SUM", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='All Top 20 MCC in Total Spent')
```

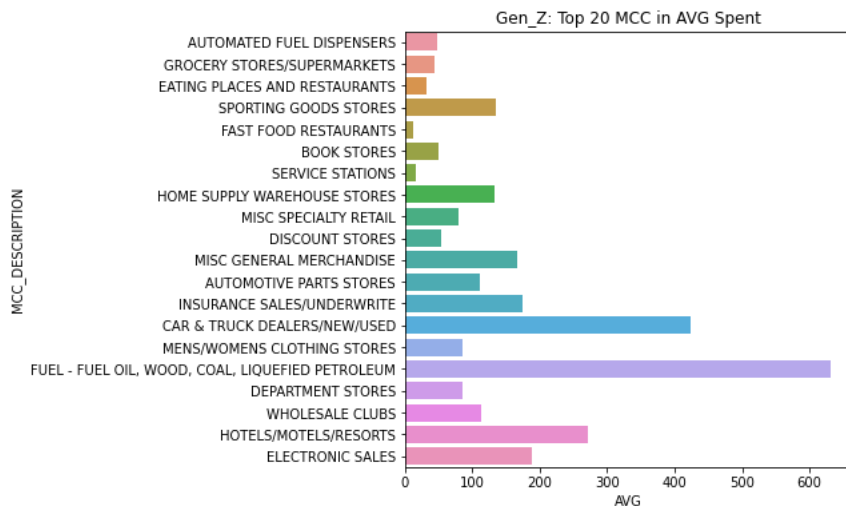
```
[Text(0.5, 1.0, 'All Top 20 MCC in Total Spent')]
```



```
plt.figure(figsize = (6,6))
```

```
sn.barplot(x="AVG", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Gen_Z: Top 20 MCC in AVG Spent')
```

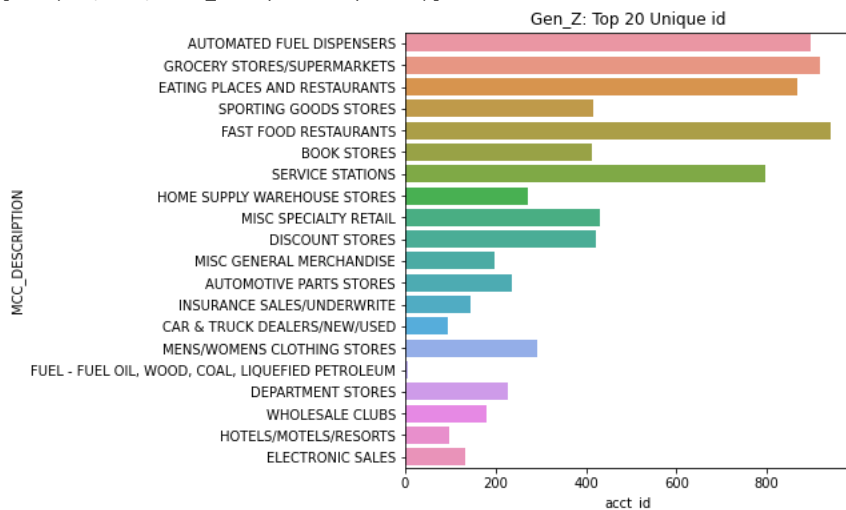
```
[Text(0.5, 1.0, 'Gen_Z: Top 20 MCC in AVG Spent')]
```



```
plt.figure(figsize = (6,6))
```

```
sn.barplot(x="acct_id", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Gen_Z: Top 20 Unique id')
```

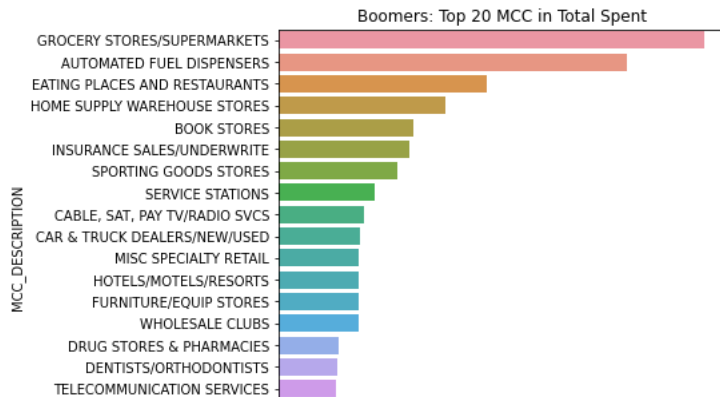
```
[Text(0.5, 1.0, 'Gen_Z: Top 20 Unique id')]
```



### Analysis of MCC\_DESCRIPTION for Boomers

```
x=Boomers['MCC_DESCRIPTION'].value_counts().rename_axis('MCC_DESCRIPTION').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'MCC_DESCRIPTION')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])
plt.figure(figsize = (6,6))
sn.barplot(x="SUM", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Boomers: Top 20 MCC in Total Spent')
```

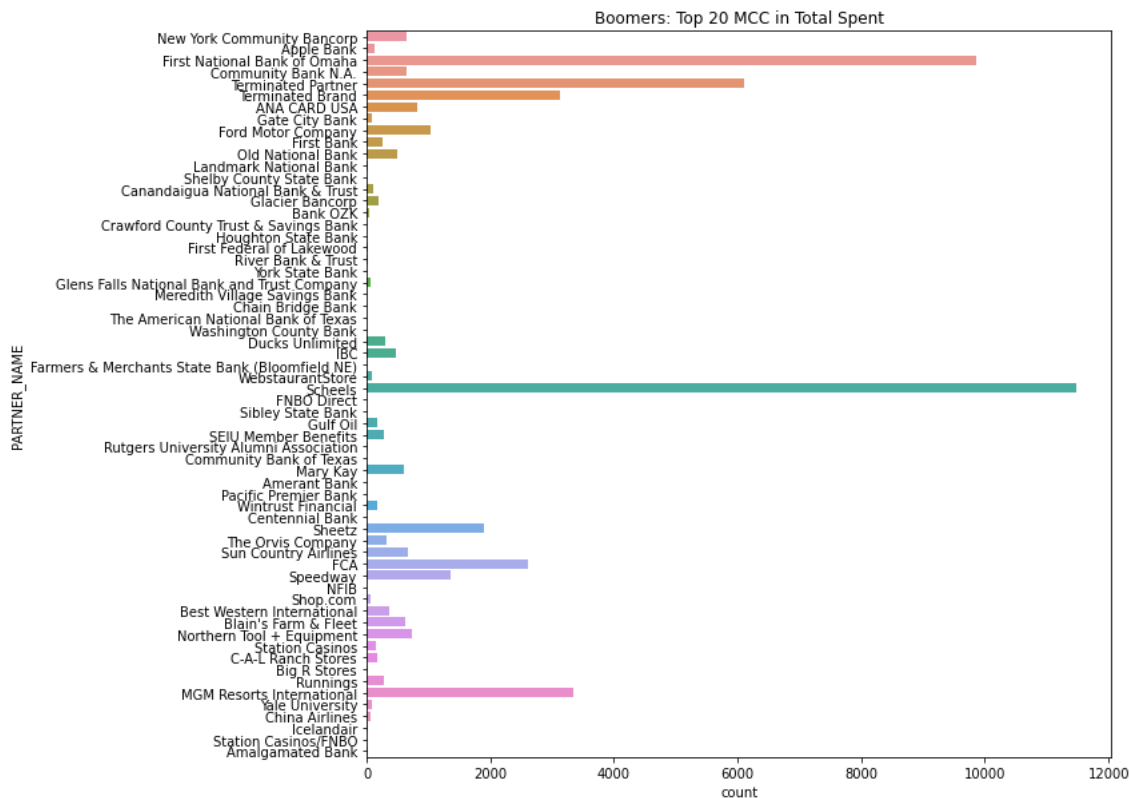
```
[Text(0.5, 1.0, 'Boomers: Top 20 MCC in Total Spent')]
```



```
plt.figure(figsize = (10,10))
```

```
sn.countplot(y="PARTNER_NAME", data=cus_data,label="MCC_DESCRIPTION").set(title='Boomers: Top 20 MCC in Total Spent')
```

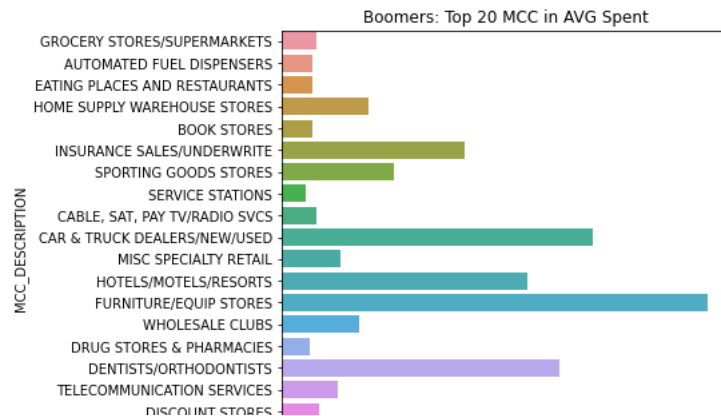
```
[Text(0.5, 1.0, 'Boomers: Top 20 MCC in Total Spent')]
```



```
x=Boomers['MCC_DESCRIPTION'].value_counts().rename_axis('MCC_DESCRIPTION').reset_index(name='Total_Transactions')
avg_transaction = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].mean())
total_transaction = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['TRANSACTIONAMT'].sum())
unique_customer = pd.DataFrame(Boomers.groupby('MCC_DESCRIPTION')['acct_id'].nunique())
merchant_avg=pd.merge(x, avg_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_avg, total_transaction, on = 'MCC_DESCRIPTION')
merchant_all=pd.merge(merchant_all, unique_customer, on = 'MCC_DESCRIPTION')
merchant_all_min_trans_30=merchant_all[merchant_all['Total_Transactions']>30]
merchant_all_min_trans_30=merchant_all_min_trans_30.rename(columns={"TRANSACTIONAMT_x": "AVG", "TRANSACTIONAMT_y": "SUM"})
Gen_Z_Top_merchant=merchant_all_min_trans_30.nlargest(n=20, columns=['SUM'])
plt.figure(figsize = (6,6))
sn.barplot(x="SUM", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Boomers: Top 20 MCC in Total Spent')

plt.figure(figsize = (6,6))
sn.barplot(x="AVG", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Boomers: Top 20 MCC in AVG Spent')
```

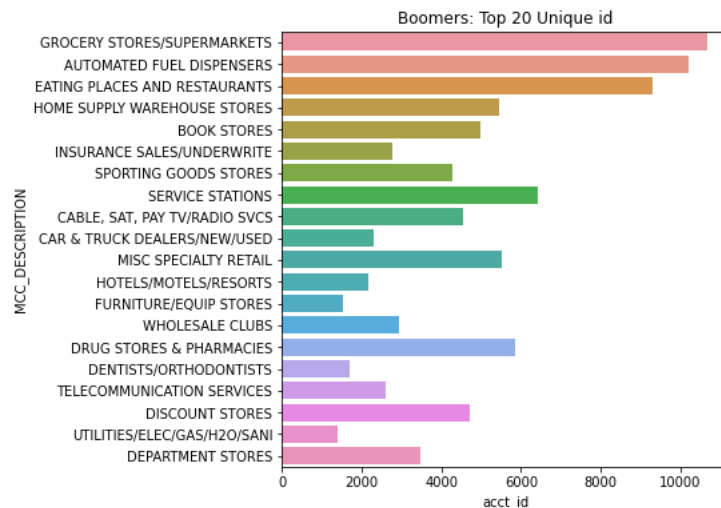
```
[Text(0.5, 1.0, 'Boomers: Top 20 MCC in AVG Spent')]
```



```
plt.figure(figsize = (6,6))
```

```
sn.barplot(x="acct_id", y="MCC_DESCRIPTION", data=Gen_Z_Top_merchant,label="MCC_DESCRIPTION").set(title='Boomers: Top 20 Unique id')
```

```
[Text(0.5, 1.0, 'Boomers: Top 20 Unique id')]
```



```
Gen_Z.columns
```

```
Index(['acct_id', 'VINTAGE_YEAR', 'STATE', 'GENERATION', 'AGE', 'FICO',
      'MONTHLY_INCOME', 'PRODUCT_SEGMENT', 'PARTNERBUSINESSKEY',
      'PARTNER_NAME', 'CREDIT_LIMIT', 'TRANSACTIONPOSTDT', 'TRANSACTIONAMT',
      'MERCHANTDESC', 'MCC', 'MCC_DESCRIPTION', 'SPENDCATEGORYNM', 'ENTRYNBR',
      'ME_BALANCE', 'date', 'buy_month', 'time_series', 'buy_weekday',
      'Merchant_Name', 'Spending_ratio'],
      dtype='object')
```

## Spending Ratio

```
spending=pd.DataFrame(Gen_Z.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
```

```
len(spending)
```

```
7692
```

```
Gen_Z['acct_id'].nunique()
```

```
1277
```

```
limit=pd.DataFrame(Gen_Z.groupby('acct_id')['CREDIT_LIMIT'].max())
limit.reset_index(inplace=True)
```

```
spending=spending.merge(limit, on='acct_id')
```

```

id=Gen_Z['acct_id'].unique()
for i in range(10):
    data=spending[spending['acct_id']== id[random.randint(0,1200)]]
    print(data)

```

	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6765	EDM0000008753475	1	33.4	1600.0
6766	EDM0000008753475	3	106.5	1600.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
2459	EDM0000003536736	1	122.10	900.0
2460	EDM0000003536736	2	290.15	900.0
2461	EDM0000003536736	3	228.34	900.0
2462	EDM0000003536736	4	257.02	900.0
2463	EDM0000003536736	5	393.34	900.0
2464	EDM0000003536736	6	484.31	900.0
2465	EDM0000003536736	7	249.52	900.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
3003	EDM0000003907290	1	410.50	1000.0
3004	EDM0000003907290	2	275.24	1000.0
3005	EDM0000003907290	3	487.45	1000.0
3006	EDM0000003907290	4	472.18	1000.0
3007	EDM0000003907290	5	271.40	1000.0
3008	EDM0000003907290	6	744.55	1000.0
3009	EDM0000003907290	7	13.45	1000.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6271	EDM0000008600049	1	46.70	500.0
6272	EDM0000008600049	5	629.70	500.0
6273	EDM0000008600049	6	256.74	500.0
6274	EDM0000008600049	7	2.16	500.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6712	EDM0000008732375	1	152.03	9400.0
6713	EDM0000008732375	2	1371.79	9400.0
6714	EDM0000008732375	3	331.52	9400.0
6715	EDM0000008732375	4	8.82	9400.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6250	EDM0000008595453	1	433.25	1000.0
6251	EDM0000008595453	2	309.94	1000.0
6252	EDM0000008595453	3	425.30	1000.0
6253	EDM0000008595453	4	336.31	1000.0
6254	EDM0000008595453	5	101.39	1000.0
6255	EDM0000008595453	6	521.73	1000.0
6256	EDM0000008595453	7	553.94	1000.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6257	EDM0000008596634	1	144.90	1000.0
6258	EDM0000008596634	2	352.54	1000.0
6259	EDM0000008596634	3	277.68	1000.0
6260	EDM0000008596634	4	66.84	1000.0
6261	EDM0000008596634	5	387.01	1000.0
6262	EDM0000008596634	6	861.20	1000.0
6263	EDM0000008596634	7	301.95	1000.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
6297	EDM0000008602752	1	215.86	1500.0
6298	EDM0000008602752	2	61.00	1500.0
6299	EDM0000008602752	3	362.36	1500.0
6300	EDM0000008602752	4	292.76	1500.0
6301	EDM0000008602752	5	80.09	1500.0
6302	EDM0000008602752	6	1352.30	1500.0
6303	EDM0000008602752	7	323.57	1500.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT
5555	EDM0000006696916	1	54.00	1400.0
5556	EDM0000006696916	2	15.12	1400.0
5557	EDM0000006696916	7	123.29	1400.0
	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT

```
spending['Credit_Utilization']=((spending['TRANSACTIONAMT']/spending['CREDIT_LIMIT'])*100).round(2)
```

```
spending.take([103,104,105,106,107,108])
```

	acct_id	buy_month	TRANSACTIONAMT	CREDIT_LIMIT	Credit_Utilization
103	EDM0000000376174	1	726.70	5000.0	14.53
104	EDM0000000376174	2	1035.33	5000.0	20.71
105	EDM0000000376174	3	1610.14	5000.0	32.20
106	EDM0000000376174	4	1475.95	5000.0	29.52
107	EDM0000000376174	5	461.39	5000.0	9.23
108	EDM0000000376174	6	858.26	5000.0	17.17

```

#sns.set_theme(style="ticks")

# Initialize the figure with a logarithmic x axis
f, ax = plt.subplots(figsize=(7, 6))
#ax.set_xscale("log")

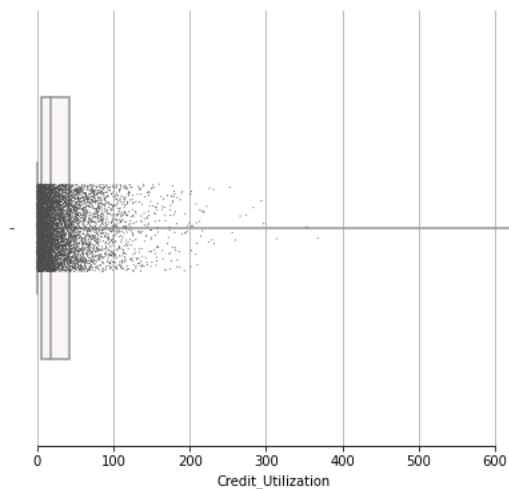
# Load the example planets dataset
#planets = sns.load_dataset("planets")

# Plot the orbital period with horizontal boxes
sn.boxplot(x="Credit_Utilization", data=spending, whis=[0, 100], width=.6, palette="vlag")

# Add in points to show each observation
sn.stripplot(x="Credit_Utilization", data=spending, size=1, color=".3", linewidth=0)

# Tweak the visual presentation
ax.xaxis.grid(True)
ax.set(ylabel="")
sn.despine(trim=True, left=True)

```



```

f, ax = plt.subplots(figsize=(20, 8))
sn.histplot(x='Credit_Utilization', data = spending).set(title='Gen_Z Credit_Utilization')
ax.set_xticks([i for i in range(-100,650,10)])

```

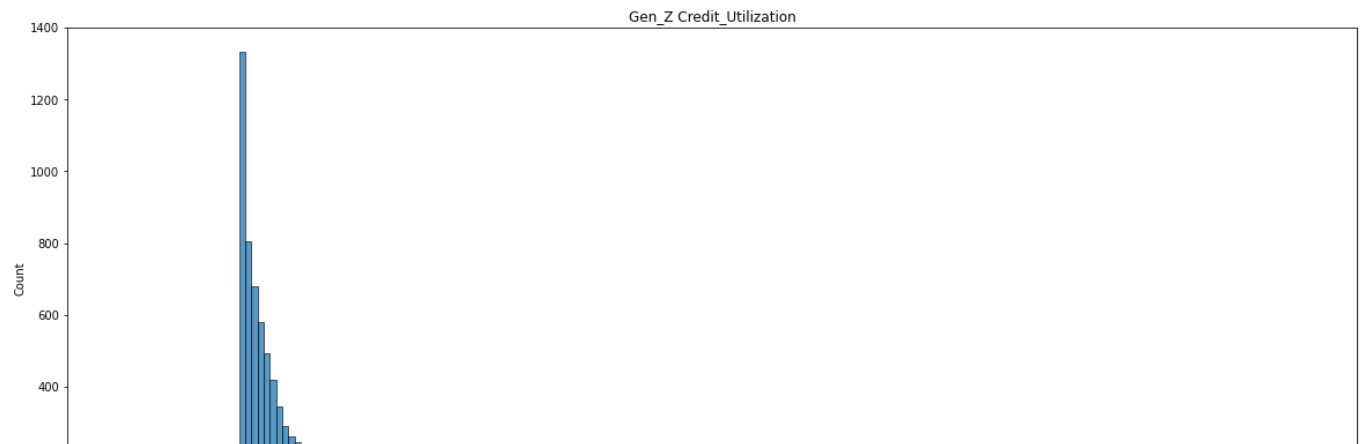
```

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spending=pd.DataFrame(Gen_Z.groupby(['acct_id', 'buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
limit=pd.DataFrame(Gen_Z.groupby('acct_id')['CREDIT_LIMIT'].max())
limit.reset_index(inplace=True)
spending=spending.merge(limit, on='acct_id')
spending['Credit_Utilization']=((spending['TRANSACTIONAMT']/spending['CREDIT_LIMIT'])*100).round(2)
f, ax = plt.subplots(figsize=(20, 8))
sn.histplot(x='Credit_Utilization', data = spending).set(title='Gen_Z Credit_Utilization')
ax.set_xticks([i for i in range(-100,650,20)])

```

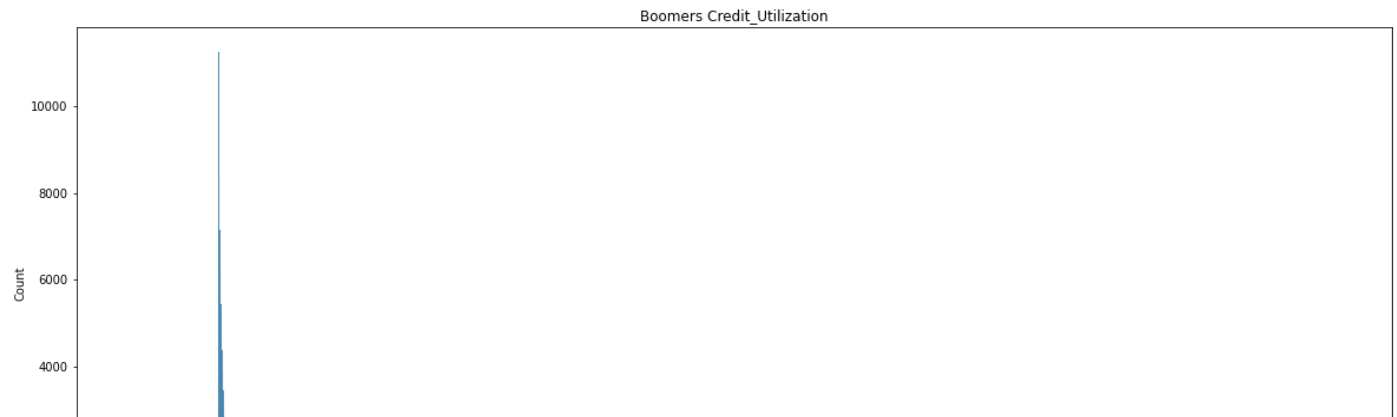
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```



```
spending=pd.DataFrame(Boomers.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
limit=pd.DataFrame(Boomers.groupby('acct_id')['CREDIT_LIMIT'].mean())
limit.reset_index(inplace=True)
spending=spending.merge(limit, on='acct_id')
spending['Credit_Utilization']=(spending['TRANSACTIONAMT']/spending['CREDIT_LIMIT'])*100).round(2)
f, ax = plt.subplots(figsize=(20, 8))
sn.histplot(x='Credit_Utilization', data = spending).set(title='Boomers Credit_Utilization')
ax.set_xticks([i for i in range(-100,200,20)])
```



```
[<matplotlib.axis.XTick at 0x7fda38a519d0>,
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<matplotlib.axis.XTick at 0x7fda38b9b050>]
```



### Credit Utilization based on age

```
data=df[((df['AGE']<31 ) | (df['GENERATION']== '2. Boomers')) & (df['TRANSACTIONAMT']>0 ) ]
#data=df[(df['AGE']<31 ) ]
```

```
spending=pd.DataFrame(data.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
```

```
avg_spending=pd.DataFrame(data.groupby('acct_id')['TRANSACTIONAMT'].mean().round(2))
avg_spending.reset_index(inplace=True)
```

```
avg_spending.head()
```

	acct_id	TRANSACTIONAMT
0	EDM0000000002119	98.12
1	EDM0000000007360	27.90
2	EDM0000000008180	52.57
3	EDM0000000018628	15.21
4	EDM0000000022348	108.10

```
cus_data=data[['acct_id','AGE', 'CREDIT_LIMIT','FICO','MONTHLY_INCOME']]
cus_data.drop_duplicates( "acct_id" , keep='first',inplace=True)
avg_spending=avg_spending.merge(cus_data, on='acct_id')
```

```
/usr/local/lib/python3.7/dist-packages/pandas/util/_decorators.py:311: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
```

```
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus-a-copy
return func(*args, **kwargs)
```

```
df.columns
```

```
Index(['acct_id', 'VINTAGE_YEAR', 'STATE', 'GENERATION', 'AGE', 'FICO',
'MONTHLY_INCOME', 'PRODUCT_SEGMENT', 'PARTNERBUSINESSKEY',
'PARTNER_NAME', 'CREDIT_LIMIT', 'TRANSACTIONPOSTDT', 'TRANSACTIONAMT',
'MERCHANTDESC', 'MCC', 'MCC_DESCRIPTION', 'SPENDCATEGORYNM', 'ENTRYNBR',
```

```
'ME_BALANCE', 'date', 'buy_month', 'time_series', 'buy_weekday'],
dtype='object')
```

```
cus_data=df[['acct_id', 'PARTNER_NAME']]
cus_data.drop_duplicates( "acct_id" , keep='first',inplace=True)
```

```
/usr/local/lib/python3.7/dist-packages/pandas/util/_decorators.py:311: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
```

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
return func(*args, **kwargs)
```

```
/usr/local/lib/python3.7/dist-packages/pandas/util/_decorators.py:311: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
```

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
return func(*args, **kwargs)
```

```
avg_spending[avg_spending['acct_id']=='EDM0000000328432']
```

	acct_id	TRANSACTIONAMT	AGE	CREDIT_LIMIT	FICO	MONTHLY_INCOME
84	EDM0000000328432	18.91	26	400.0	785	4166

```
avg_spending['Credit_Utilization']=((avg_spending['TRANSACTIONAMT']/avg_spending['CREDIT_LIMIT'])*100).round(2)
```

```
avg_spending.head()
```

	acct_id	TRANSACTIONAMT	AGE	CREDIT_LIMIT	FICO	MONTHLY_INCOME	Credit_Utilization
0	EDM0000000002119	98.12	66	19250.0	799	2000	0.51
1	EDM0000000007360	27.90	68	9000.0	741	4666	0.31
2	EDM0000000008180	52.57	73	2500.0	726	3333	2.10
3	EDM0000000018628	15.21	59	2800.0	642	3750	0.54
4	EDM0000000022348	108.10	76	24650.0	734	5250	0.44

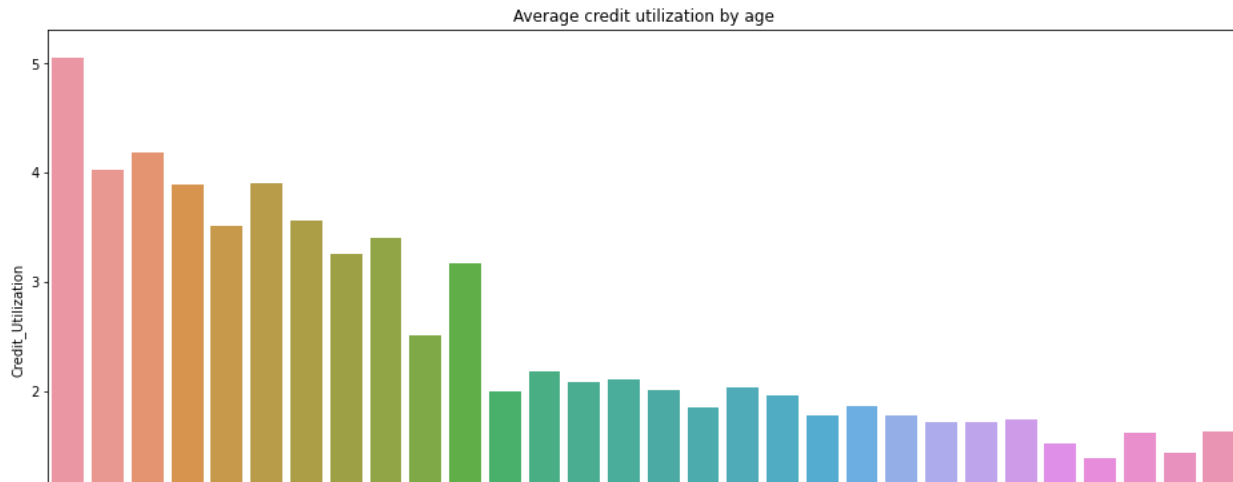
```
age_avg_utilization = pd.DataFrame(avg_spending.groupby('AGE')['Credit_Utilization'].mean())
age_avg_utilization.reset_index(inplace=True)
```

```
age_avg_utilization.head()
```

	AGE	Credit_Utilization
0	20	5.057222
1	21	4.031228
2	22	4.191824
3	23	3.895426
4	24	3.516524

```
plt.figure(figsize = (16,8))
sn.barplot(x="AGE", y="Credit_Utilization", data=age_avg_utilization).set(title='Average credit utilization by age')
```

```
[Text(0.5, 1.0, 'Average credit utilization by age')]
```



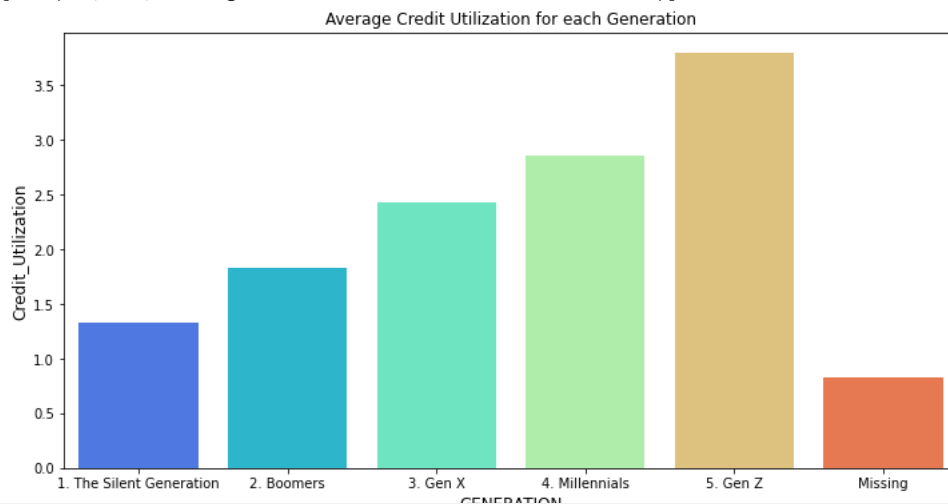
```
data=df[(df['TRANSACTIONAMT']>0 )]
spending=pd.DataFrame(data.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
avg_spending=pd.DataFrame(data.groupby('acct_id')['TRANSACTIONAMT'].mean().round(2))
avg_spending.reset_index(inplace=True)
cus_data=data[['acct_id','AGE', 'CREDIT_LIMIT','FICO','MONTHLY_INCOME','GENERATION']]
cus_data.drop_duplicates( "acct_id" , keep='first',inplace=True)
avg_spending=avg_spending.merge(cus_data, on='acct_id')
avg_spending['Credit_Utilization']=((avg_spending['TRANSACTIONAMT']/avg_spending['CREDIT_LIMIT'])*100).round(2)
age_avg_utilization = pd.DataFrame(avg_spending.groupby('GENERATION')['Credit_Utilization'].mean())
age_avg_utilization.reset_index(inplace=True)
fig=plt.figure(figsize = (12,6))
plt.title('Gen_Z: Top 3 Sporting Goods\n wrt unique number of users', fontsize=16)
plt.xlabel('xlabel', fontsize=12)
plt.ylabel('ylabel', fontsize=12)
sn.barplot(x="GENERATION", y="Credit_Utilization", data=age_avg_utilization, palette='rainbow').set(title='Average Credit Utilization for each
```

```
/usr/local/lib/python3.7/dist-packages/pandas/util/_decorators.py:311: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame
```

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
return func(*args, **kwargs)
```

```
[Text(0.5, 1.0, 'Average Credit Utilization for each Generation')]
```



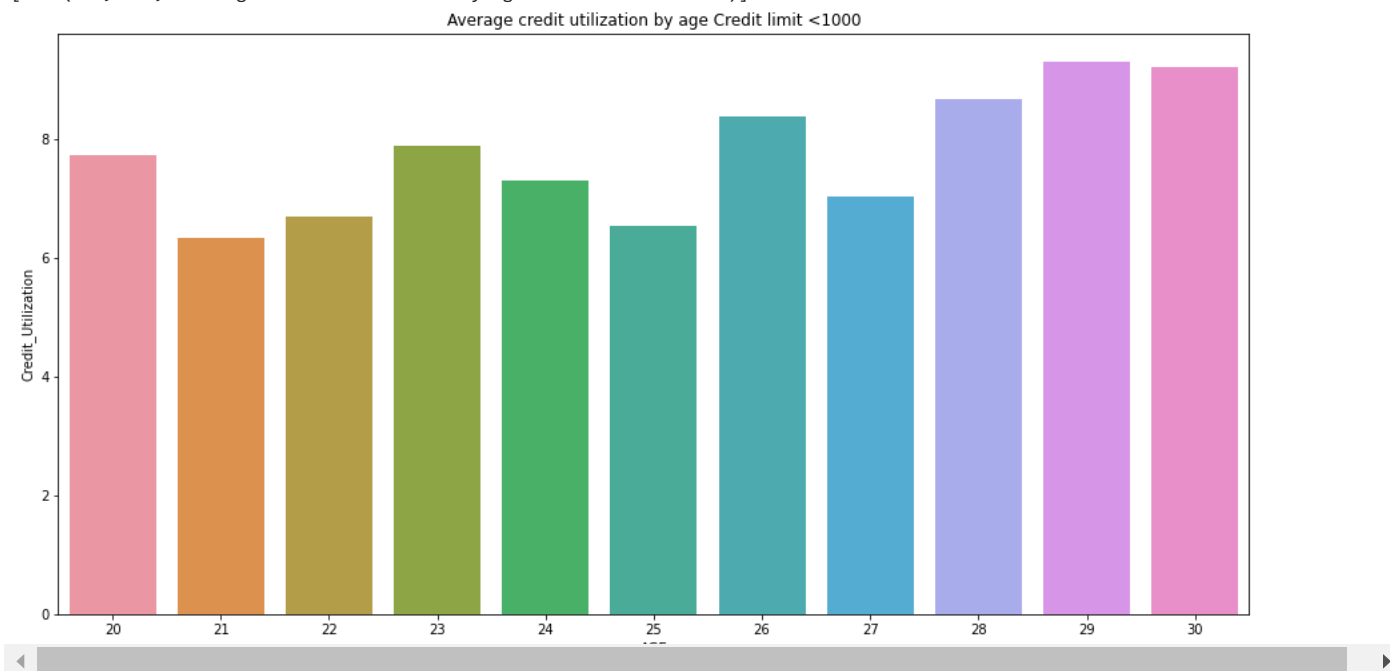
```
data=df[((df['AGE']<31 ) & (df['CREDIT_LIMIT']<1000) )& (df['TRANSACTIONAMT']>0 ) ]
spending=pd.DataFrame(data.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
avg_spending=pd.DataFrame(data.groupby('acct_id')['TRANSACTIONAMT'].mean().round(2))
avg_spending.reset_index(inplace=True)
cus_data=data[['acct_id','AGE', 'CREDIT_LIMIT','FICO','MONTHLY_INCOME']]
cus_data.drop_duplicates( "acct_id" , keep='first',inplace=True)
avg_spending=avg_spending.merge(cus_data, on='acct_id')
avg_spending['Credit_Utilization']=((avg_spending['TRANSACTIONAMT']/avg_spending['CREDIT_LIMIT'])*100).round(2)
age_avg_utilization = pd.DataFrame(avg_spending.groupby('AGE')['Credit_Utilization'].mean())
age_avg_utilization.reset_index(inplace=True)
```

```
plt.figure(figsize = (16,8))
sn.barplot(x="AGE", y="Credit_Utilization", data=age_avg_utilization).set(title='Average credit utilization by age Credit limit <1000')
```

/usr/local/lib/python3.7/dist-packages/pandas/util/\_decorators.py:311: SettingWithCopyWarning:  
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)

```
return func(*args, **kwargs)
[Text(0.5, 1.0, 'Average credit utilization by age Credit limit <1000')]
```



```
data=df[((df['AGE']<31 ) & (df['FICO']<650))& (df['TRANSACTIONAMT']>0 ) ]
spending=pd.DataFrame(data.groupby(['acct_id','buy_month'])['TRANSACTIONAMT'].sum().round(2))
spending.reset_index(inplace=True)
avg_spending=pd.DataFrame(data.groupby('acct_id')['TRANSACTIONAMT'].mean().round(2))
avg_spending.reset_index(inplace=True)
cus_data=data[['acct_id','AGE', 'CREDIT_LIMIT','FICO','MONTHLY_INCOME']]
cus_data.drop_duplicates( "acct_id" , keep='first',inplace=True)
avg_spending=avg_spending.merge(cus_data, on='acct_id')
avg_spending['Credit_Utilization']=((avg_spending['TRANSACTIONAMT']/avg_spending['CREDIT_LIMIT'])*100).round(2)
age_avg_utilization = pd.DataFrame(avg_spending.groupby('AGE')['Credit_Utilization'].mean())
age_avg_utilization.reset_index(inplace=True)
plt.figure(figsize = (16,8))
sn.barplot(x="AGE", y="Credit_Utilization", data=age_avg_utilization).set(title='Average credit utilization by age FICO <650')
```