

# Credit Card Analysis

August 28, 2024

Import Pandas , Matplotlib , seaborn

## 0.0.1 Import Pandas, Numpy, Seaborn

```
[3]: import os
import pandas as pd
```

Importing data sets (csv files ) namely Credit card & Customers

```
[4]: cc = pd.read_csv('credit_card.csv')
```

```
[5]: cust= pd.read_csv('customer.csv')
```

```
[6]: cust.head()
```

```
[6]: Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \
0    708082083         24      F             1      Uneducated
1    708083283         62      F             0      Unknown
2    708084558         32      F             1      Unknown
3    708085458         38      M             2      Uneducated
4    708086958         48      M             4      Graduate

   Marital_Status  state_cd  Zipcode  Car_Owner  House_Owner  Personal_loan  \
0      Single      FL      91750      no      yes      no
1    Married      NJ      91750      no      no      no
2    Married      NJ      91750      yes      no      no
3      Single      NY      91750      no      no      no
4      Single      TX      91750      yes      yes      no

   contact  Customer_Job  Income  Cust_Satisfaction_Score
0  unknown  Businessman  202326              3
1  cellular  Selfemployed  5225              2
2  unknown  Selfemployed  14235              2
3  cellular  Blue-collar  45683              1
4  cellular  Businessman  59279              1
```

```
[7]: cc.head()
```

```

[7]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
1 708083283 Blue 445 1
2 708084558 Blue 140 0
3 708085458 Blue 250 1
4 708086958 Blue 320 1

Customer_Acq_Cost Week_Start_Date Week_Num Qtr current_year Credit_Limit \
0 87 01-01-2023 Week-1 Q1 2023 3544.0
1 108 01-01-2023 Week-1 Q1 2023 3421.0
2 106 01-01-2023 Week-1 Q1 2023 8258.0
3 150 01-01-2023 Week-1 Q1 2023 1438.3
4 106 01-01-2023 Week-1 Q1 2023 3128.0

Total_Revolving_Bal Total_Trans_Amt Total_Trans_Vol \
0 1661 15149 111
1 2517 992 21
2 1771 1447 23
3 0 3940 82
4 749 4369 59

Avg_Utilization_Ratio Use Chip Exp Type Interest_Earned \
0 0.469 Chip Travel 4393.21
1 0.736 Swipe Entertainment 69.44
2 0.214 Chip Bills 202.58
3 0.000 Online Grocery 236.40
4 0.239 Swipe Fuel 1004.87

Delinquent_Acc
0 0
1 0
2 0
3 0
4 1

```

## 0.1 Data Cleaning

### 1. to check nan ( missing) values if any

```

[8]: #to check nan values

nan_df = cust[cust.isna().any(axis=1)]

nan_df.head()

```

```

[8]: Empty DataFrame
Columns: [Client_Num, Customer_Age, Gender, Dependent_Count, Education_Level,
Marital_Status, state_cd, Zipcode, Car_Owner, House_Owner, Personal_loan,

```

```
contact, Customer_Job, Income, Cust_Satisfaction_Score]
Index: []
```

```
[9]: #to check nan values
nan_df = cc[cc.isna().any(axis=1)]
nan_df.head()
```

```
[9]: Empty DataFrame
Columns: [Client_Num, Card_Category, Annual_Fees, Activation_30_Days,
Customer_Acq_Cost, Week_Start_Date, Week_Num, Qtr, current_year, Credit_Limit,
Total_Revolving_Bal, Total_Trans_Amt, Total_Trans_Vol, Avg_Utilization_Ratio,
Use_Chip, Exp_Type, Interest_Earned, Delinquent_Acc]
Index: []
```

```
[10]: cust.head()
```

```
[10]:
```

|   | Client_Num | Customer_Age | Gender | Dependent_Count | Education_Level | \ |
|---|------------|--------------|--------|-----------------|-----------------|---|
| 0 | 708082083  | 24           | F      | 1               | Uneducated      |   |
| 1 | 708083283  | 62           | F      | 0               | Unknown         |   |
| 2 | 708084558  | 32           | F      | 1               | Unknown         |   |
| 3 | 708085458  | 38           | M      | 2               | Uneducated      |   |
| 4 | 708086958  | 48           | M      | 4               | Graduate        |   |

|   | Marital_Status | state_cd | Zipcode | Car_Owner | House_Owner | Personal_loan | \ |
|---|----------------|----------|---------|-----------|-------------|---------------|---|
| 0 | Single         | FL       | 91750   | no        | yes         | no            |   |
| 1 | Married        | NJ       | 91750   | no        | no          | no            |   |
| 2 | Married        | NJ       | 91750   | yes       | no          | no            |   |
| 3 | Single         | NY       | 91750   | no        | no          | no            |   |
| 4 | Single         | TX       | 91750   | yes       | yes         | no            |   |

|   | contact  | Customer_Job | Income | Cust_Satisfaction_Score |
|---|----------|--------------|--------|-------------------------|
| 0 | unknown  | Businessman  | 202326 | 3                       |
| 1 | cellular | Selfemployed | 5225   | 2                       |
| 2 | unknown  | Selfemployed | 14235  | 2                       |
| 3 | cellular | Blue-collar  | 45683  | 1                       |
| 4 | cellular | Businessman  | 59279  | 1                       |

## 2. Convert Columns to correct Data types ( string to numeric here)

```
[11]: #Convert Columns to correct data type

cust['Customer_Age']= pd.to_numeric(cust['Customer_Age'])

cust['Income']= pd.to_numeric(cust['Income'])
```

```
cust['Dependent_Count']= pd.to_numeric(cust['Dependent_Count'])
```

```
[12]: #Convert Columns of Cc table to correct data type
```

```
cc['Total_Trans_Amt']= pd.to_numeric(cc['Total_Trans_Amt'])
```

```
cc['Interest_Earned']= pd.to_numeric(cc['Interest_Earned'])
```

```
cc['Annual_Fees']= pd.to_numeric(cc['Annual_Fees'])
```

```
cc.head()
```

```
[12]:
```

|   | Client_Num | Card_Category | Annual_Fees | Activation_30_Days | \ |
|---|------------|---------------|-------------|--------------------|---|
| 0 | 708082083  | Blue          | 200         | 0                  |   |
| 1 | 708083283  | Blue          | 445         | 1                  |   |
| 2 | 708084558  | Blue          | 140         | 0                  |   |
| 3 | 708085458  | Blue          | 250         | 1                  |   |
| 4 | 708086958  | Blue          | 320         | 1                  |   |

|   | Customer_Acq_Cost | Week_Start_Date | Week_Num | Qtr | current_year | Credit_Limit | \ |
|---|-------------------|-----------------|----------|-----|--------------|--------------|---|
| 0 | 87                | 01-01-2023      | Week-1   | Q1  | 2023         | 3544.0       |   |
| 1 | 108               | 01-01-2023      | Week-1   | Q1  | 2023         | 3421.0       |   |
| 2 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 8258.0       |   |
| 3 | 150               | 01-01-2023      | Week-1   | Q1  | 2023         | 1438.3       |   |
| 4 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 3128.0       |   |

|   | Total_Revolving_Bal | Total_Trans_Amt | Total_Trans_Vol | \ |
|---|---------------------|-----------------|-----------------|---|
| 0 | 1661                | 15149           | 111             |   |
| 1 | 2517                | 992             | 21              |   |
| 2 | 1771                | 1447            | 23              |   |
| 3 | 0                   | 3940            | 82              |   |
| 4 | 749                 | 4369            | 59              |   |

|   | Avg_Utilization_Ratio | Use Chip | Exp Type      | Interest_Earned | \ |
|---|-----------------------|----------|---------------|-----------------|---|
| 0 | 0.469                 | Chip     | Travel        | 4393.21         |   |
| 1 | 0.736                 | Swipe    | Entertainment | 69.44           |   |
| 2 | 0.214                 | Chip     | Bills         | 202.58          |   |
| 3 | 0.000                 | Online   | Grocery       | 236.40          |   |
| 4 | 0.239                 | Swipe    | Fuel          | 1004.87         |   |

|   | Delinquent_Acc |
|---|----------------|
| 0 | 0              |
| 1 | 0              |
| 2 | 0              |
| 3 | 0              |
| 4 | 1              |

[0]:

## 0.2 3. Creating new column Age group based on following condition using “apply”

```
[13]: def val (d):  
    if d['Customer_Age'] < 30:  
        return "<30"  
    elif d['Customer_Age'] >=30 and d['Customer_Age']<40:  
        return "30-40"  
    elif d['Customer_Age']>=40 and d['Customer_Age']<50:  
        return "40-50"  
    elif d['Customer_Age'] >=5 and d['Customer_Age']<60:  
        return "50-60"  
    elif d['Customer_Age'] >=60:  
        return ">=60"  
  
cust['Age_Group'] = cust.apply(val, axis =1)  
  
cust.head()
```

```
[13]: Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \  
0    708082083         24      F           1      Uneducated  \  
1    708083283         62      F           0      Unknown    \  
2    708084558         32      F           1      Unknown    \  
3    708085458         38      M           2      Uneducated  \  
4    708086958         48      M           4      Graduate    \  
  
    Marital_Status  state_cd  Zipcode  Car_Owner  House_Owner  Personal_loan  \  
0      Single      FL      91750      no      yes      no  \  
1    Married      NJ      91750      no      no      no  \  
2    Married      NJ      91750      yes     no      no  \  
3      Single      NY      91750      no      no      no  \  
4      Single      TX      91750      yes     yes     no  \  
  
    contact  Customer_Job  Income  Cust_Satisfaction_Score  Age_Group  \  
0    unknown  Businessman  202326           3      <30  \  
1    cellular  Selfemployed  5225           2      >=60  \  
2    unknown  Selfemployed  14235           2     30-40  \  
3    cellular  Blue-collar  45683           1     30-40  \  
4    cellular  Businessman  59279           1     40-50
```

```
[14]: #creating new column ' Income Group ' based on following condition using "apply"
```

```
def val (d):
    if d['Income'] < 35000:
        return "Low"
    elif d['Income'] >=35000 and d['Income']<70000:
        return "Medium"
    elif d['Income']>=70000:
        return "High"
```

```
cust['Income_Group'] = cust.apply(val, axis =1)
```

```
cust.head()
```

```
[14]: Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \
0    708082083         24      F           1      Uneducated
1    708083283         62      F           0      Unknown
2    708084558         32      F           1      Unknown
3    708085458         38      M           2      Uneducated
4    708086958         48      M           4      Graduate

      Marital_Status  state_cd  Zipcode  Car_Owner  House_Owner  Personal_loan  \
0         Single      FL      91750         no         yes         no
1        Married      NJ      91750         no         no         no
2        Married      NJ      91750         yes         no         no
3         Single      NY      91750         no         no         no
4         Single      TX      91750         yes         yes         no

      contact  Customer_Job  Income  Cust_Satisfaction_Score  Age_Group  \
0    unknown  Businessman  202326              3      <30
1   cellular  Selfemployeed   5225              2      >=60
2    unknown  Selfemployeed  14235              2     30-40
3   cellular  Blue-collar   45683              1     30-40
4   cellular  Businessman   59279              1     40-50

      Income_Group
0         High
1         Low
2         Low
3        Medium
4        Medium
```

```
[15]: cc.head()
```

```
[15]: Client_Num  Card_Category  Annual_Fees  Activation_30_Days  \
0    708082083         Blue         200              0
```

|   |           |      |     |   |
|---|-----------|------|-----|---|
| 1 | 708083283 | Blue | 445 | 1 |
| 2 | 708084558 | Blue | 140 | 0 |
| 3 | 708085458 | Blue | 250 | 1 |
| 4 | 708086958 | Blue | 320 | 1 |

|   | Customer_Acq_Cost | Week_Start_Date | Week_Num | Qtr | current_year | Credit_Limit | \ |
|---|-------------------|-----------------|----------|-----|--------------|--------------|---|
| 0 | 87                | 01-01-2023      | Week-1   | Q1  | 2023         | 3544.0       |   |
| 1 | 108               | 01-01-2023      | Week-1   | Q1  | 2023         | 3421.0       |   |
| 2 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 8258.0       |   |
| 3 | 150               | 01-01-2023      | Week-1   | Q1  | 2023         | 1438.3       |   |
| 4 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 3128.0       |   |

|   | Total_Revolving_Bal | Total_Trans_Amt | Total_Trans_Vol | \ |
|---|---------------------|-----------------|-----------------|---|
| 0 | 1661                | 15149           | 111             |   |
| 1 | 2517                | 992             | 21              |   |
| 2 | 1771                | 1447            | 23              |   |
| 3 | 0                   | 3940            | 82              |   |
| 4 | 749                 | 4369            | 59              |   |

|   | Avg_Utilization_Ratio | Use Chip | Exp Type      | Interest_Earned | \ |
|---|-----------------------|----------|---------------|-----------------|---|
| 0 | 0.469                 | Chip     | Travel        | 4393.21         |   |
| 1 | 0.736                 | Swipe    | Entertainment | 69.44           |   |
| 2 | 0.214                 | Chip     | Bills         | 202.58          |   |
| 3 | 0.000                 | Online   | Grocery       | 236.40          |   |
| 4 | 0.239                 | Swipe    | Fuel          | 1004.87         |   |

|   | Delinquent_Acc |
|---|----------------|
| 0 | 0              |
| 1 | 0              |
| 2 | 0              |
| 3 | 0              |
| 4 | 1              |

[0]:

### 0.3 4.Creating new column “Total Revenue” I. e. Total Revenue generated by bank for its credit card services to the customers.

####Total Revenue = Annual Fees + Interest earned + Total Transaction Amount.

```
[16]: cc['Total_Revenue']= cc['Annual_Fees'] + cc['Total_Trans_Amt'] +
      cc['Interest_Earned']

cc.head()
```

```
[16]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
```

|   |           |      |     |   |
|---|-----------|------|-----|---|
| 1 | 708083283 | Blue | 445 | 1 |
| 2 | 708084558 | Blue | 140 | 0 |
| 3 | 708085458 | Blue | 250 | 1 |
| 4 | 708086958 | Blue | 320 | 1 |

|   | Customer_Acq_Cost | Week_Start_Date | Week_Num | Qtr | current_year | Credit_Limit | \ |
|---|-------------------|-----------------|----------|-----|--------------|--------------|---|
| 0 | 87                | 01-01-2023      | Week-1   | Q1  | 2023         | 3544.0       |   |
| 1 | 108               | 01-01-2023      | Week-1   | Q1  | 2023         | 3421.0       |   |
| 2 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 8258.0       |   |
| 3 | 150               | 01-01-2023      | Week-1   | Q1  | 2023         | 1438.3       |   |
| 4 | 106               | 01-01-2023      | Week-1   | Q1  | 2023         | 3128.0       |   |

|   | Total_Revolving_Bal | Total_Trans_Amt | Total_Trans_Vol | \ |
|---|---------------------|-----------------|-----------------|---|
| 0 | 1661                | 15149           | 111             |   |
| 1 | 2517                | 992             | 21              |   |
| 2 | 1771                | 1447            | 23              |   |
| 3 | 0                   | 3940            | 82              |   |
| 4 | 749                 | 4369            | 59              |   |

|   | Avg_Utilization_Ratio | Use Chip | Exp Type      | Interest_Earned | \ |
|---|-----------------------|----------|---------------|-----------------|---|
| 0 | 0.469                 | Chip     | Travel        | 4393.21         |   |
| 1 | 0.736                 | Swipe    | Entertainment | 69.44           |   |
| 2 | 0.214                 | Chip     | Bills         | 202.58          |   |
| 3 | 0.000                 | Online   | Grocery       | 236.40          |   |
| 4 | 0.239                 | Swipe    | Fuel          | 1004.87         |   |

|   | Delinquent_Acc | Total_Revenue |
|---|----------------|---------------|
| 0 | 0              | 19742.21      |
| 1 | 0              | 1506.44       |
| 2 | 0              | 1789.58       |
| 3 | 0              | 4426.40       |
| 4 | 1              | 5693.87       |

```
[17]: cc['Week_No. '] = cc['Week_Num'].apply(lambda x: x.split('-')[1])
cc.head()
```

```
[17]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
1 708083283 Blue 445 1
2 708084558 Blue 140 0
3 708085458 Blue 250 1
4 708086958 Blue 320 1
```

|   | Customer_Acq_Cost | Week_Start_Date | Week_Num | Qtr | current_year | Credit_Limit | \ |
|---|-------------------|-----------------|----------|-----|--------------|--------------|---|
| 0 | 87                | 01-01-2023      | Week-1   | Q1  | 2023         | 3544.0       |   |
| 1 | 108               | 01-01-2023      | Week-1   | Q1  | 2023         | 3421.0       |   |



|   |     |            |        |    |      |        |
|---|-----|------------|--------|----|------|--------|
| 2 | 106 | 01-01-2023 | Week-1 | Q1 | 2023 | 8258.0 |
| 3 | 150 | 01-01-2023 | Week-1 | Q1 | 2023 | 1438.3 |
| 4 | 106 | 01-01-2023 | Week-1 | Q1 | 2023 | 3128.0 |

|   | Total_Revolving_Bal | Total_Trans_Amt | Total_Trans_Vol | \ |
|---|---------------------|-----------------|-----------------|---|
| 0 | 1661                | 15149           | 111             |   |
| 1 | 2517                | 992             | 21              |   |
| 2 | 1771                | 1447            | 23              |   |
| 3 | 0                   | 3940            | 82              |   |
| 4 | 749                 | 4369            | 59              |   |

|   | Avg_Utilization_Ratio | Use Chip | Exp Type      | Interest_Earned | \ |
|---|-----------------------|----------|---------------|-----------------|---|
| 0 | 0.469                 | Chip     | Travel        | 4393.21         |   |
| 1 | 0.736                 | Swipe    | Entertainment | 69.44           |   |
| 2 | 0.214                 | Chip     | Bills         | 202.58          |   |
| 3 | 0.000                 | Online   | Grocery       | 236.40          |   |
| 4 | 0.239                 | Swipe    | Fuel          | 1004.87         |   |

|   | Delinquent_Acc | Total_Revenue | Week_No. |
|---|----------------|---------------|----------|
| 0 | 0              | 19742.21      | 1        |
| 1 | 0              | 1506.44       | 1        |
| 2 | 0              | 1789.58       | 1        |
| 3 | 0              | 4426.40       | 1        |
| 4 | 1              | 5693.87       | 1        |

```
[18]: cc['Week_No.'] = pd.to_numeric(cc['Week_No.'])
```

```
[19]: import matplotlib.pyplot as plt

import seaborn as sns
%matplotlib inline
```

```
[20]: cust.head()
```

```
[20]: Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \
0    708082083         24      F           1      Uneducated
1    708083283         62      F           0      Unknown
2    708084558         32      F           1      Unknown
3    708085458         38      M           2      Uneducated
4    708086958         48      M           4      Graduate
```

|   | Marital_Status | state_cd | Zipcode | Car_Owner | House_Owner | Personal_loan | \ |
|---|----------------|----------|---------|-----------|-------------|---------------|---|
| 0 | Single         | FL       | 91750   | no        | yes         | no            |   |
| 1 | Married        | NJ       | 91750   | no        | no          | no            |   |
| 2 | Married        | NJ       | 91750   | yes       | no          | no            |   |
| 3 | Single         | NY       | 91750   | no        | no          | no            |   |
| 4 | Single         | TX       | 91750   | yes       | yes         | no            |   |

|   | contact  | Customer_Job | Income | Cust_Satisfaction_Score | Age_Group | \ |
|---|----------|--------------|--------|-------------------------|-----------|---|
| 0 | unknown  | Businessman  | 202326 | 3                       | <30       |   |
| 1 | cellular | Selfemployed | 5225   | 2                       | >=60      |   |
| 2 | unknown  | Selfemployed | 14235  | 2                       | 30-40     |   |
| 3 | cellular | Blue-collar  | 45683  | 1                       | 30-40     |   |
| 4 | cellular | Businessman  | 59279  | 1                       | 40-50     |   |

|   | Income_Group |
|---|--------------|
| 0 | High         |
| 1 | Low          |
| 2 | Low          |
| 3 | Medium       |
| 4 | Medium       |

[0]:

## 0.4 Basic Insights

[21]: cust.head()

[21]:

|   | Client_Num | Customer_Age | Gender | Dependent_Count | Education_Level | \ |
|---|------------|--------------|--------|-----------------|-----------------|---|
| 0 | 708082083  | 24           | F      | 1               | Uneducated      |   |
| 1 | 708083283  | 62           | F      | 0               | Unknown         |   |
| 2 | 708084558  | 32           | F      | 1               | Unknown         |   |
| 3 | 708085458  | 38           | M      | 2               | Uneducated      |   |
| 4 | 708086958  | 48           | M      | 4               | Graduate        |   |

|   | Marital_Status | state_cd | Zipcode | Car_Owner | House_Owner | Personal_loan | \ |
|---|----------------|----------|---------|-----------|-------------|---------------|---|
| 0 | Single         | FL       | 91750   | no        | yes         | no            |   |
| 1 | Married        | NJ       | 91750   | no        | no          | no            |   |
| 2 | Married        | NJ       | 91750   | yes       | no          | no            |   |
| 3 | Single         | NY       | 91750   | no        | no          | no            |   |
| 4 | Single         | TX       | 91750   | yes       | yes         | no            |   |

|   | contact  | Customer_Job | Income | Cust_Satisfaction_Score | Age_Group | \ |
|---|----------|--------------|--------|-------------------------|-----------|---|
| 0 | unknown  | Businessman  | 202326 | 3                       | <30       |   |
| 1 | cellular | Selfemployed | 5225   | 2                       | >=60      |   |
| 2 | unknown  | Selfemployed | 14235  | 2                       | 30-40     |   |
| 3 | cellular | Blue-collar  | 45683  | 1                       | 30-40     |   |
| 4 | cellular | Businessman  | 59279  | 1                       | 40-50     |   |

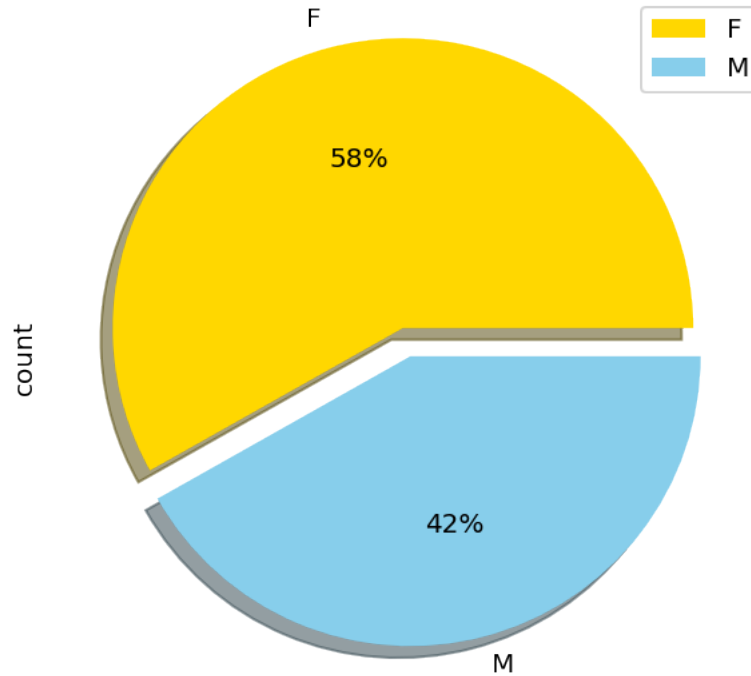
|   | Income_Group |
|---|--------------|
| 0 | High         |
| 1 | Low          |
| 2 | Low          |
| 3 | Medium       |

### 0.4.1 Gender Distribution

```
[22]: cust['Gender'].value_counts().plot.pie(figsize=(5,5), autopct='%1.
      ↪0f%%',legend=True, shadow=True, explode=(0.1,0), colors=['gold', 'skyblue'])
```

```
[22]: <Axes: ylabel='count'>
```

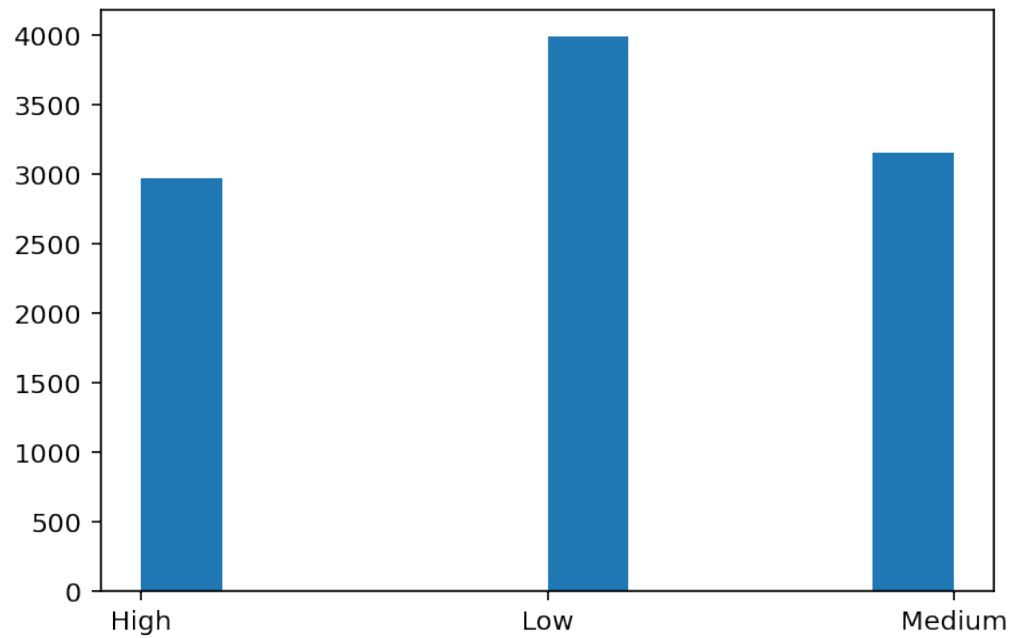
```
[22]:
```



## 0.5 Frequency Distribution of Customers in various Income groups

```
[23]: plt.hist(cust.Income_Group);
```

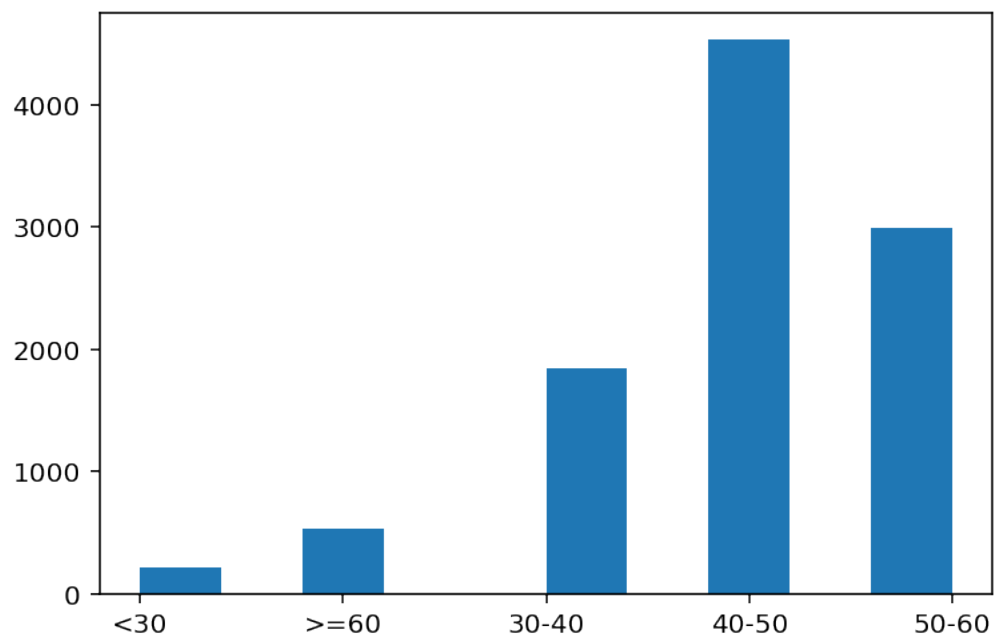
```
[23]:
```



### 0.5.1 2.Frequency Distribution of customers in various Age groups

```
[24]: plt.hist(cust.Age_Group);
```

[24]:

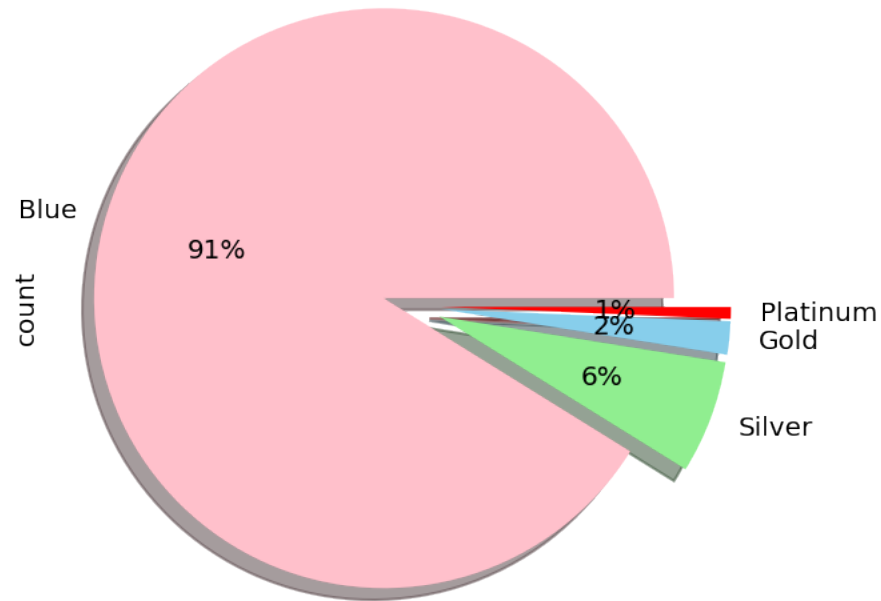


### 0.5.2 3. Frequency Distribution of Card Categories

```
[25]: cc['Card_Category'].value_counts().plot.pie(figsize=(5,5), autopct='%1.0f%%',  
      ↪shadow=True, explode=(0.1,0.1,0.1,0.1), colors=['pink', 'lightgreen',  
      ↪'skyblue','red'])
```

[25]: <Axes: ylabel='count'>

[25]:

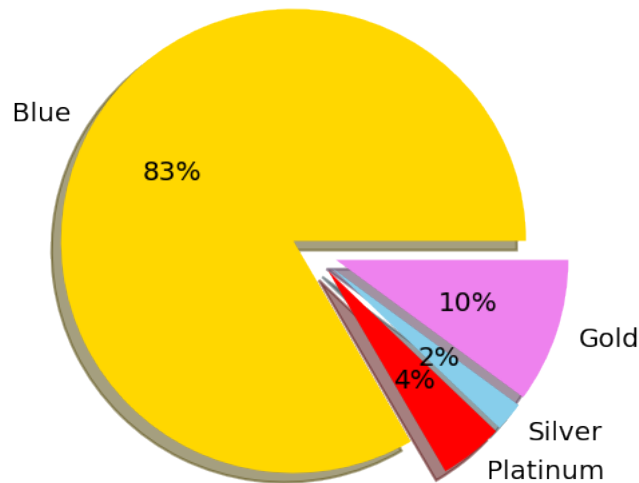


### 0.5.3 5. Total Revenue as per Card Category

```
[26]: result=cc.groupby('Card_Category').sum()  
  
category = cc['Card_Category'].unique()  
  
plt.pie(result['Total_Revenue'],labels=category,autopct= '%1.  
      ↪0f%%',colors=['Gold', 'Red', 'Skyblue','Violet'], explode=(0.1,0.1,0.1,0.  
      ↪1),shadow=True)  
  
#cc['Total_Revenue'].plot.pie(labels=category, autopct='%1.0f%%',  
      ↪colors=['Gold', 'Red', 'Skyblue', 'Violet'], explode=(0.1, 0.1, 0.1, 0.1),  
      ↪figsize=(7, 7))
```

```
[26]: ([<matplotlib.patches.Wedge at 0x7f4b9ce72bf0>,
      <matplotlib.patches.Wedge at 0x7f4b9cf4bb80>,
      <matplotlib.patches.Wedge at 0x7f4b9ce73880>,
      <matplotlib.patches.Wedge at 0x7f4b9ceac1c0>],
      [Text(-1.0407002504518528, 0.5974470593361816, 'Blue'),
       Text(0.7431925849665428, -0.9421596370311924, 'Platinum'),
       Text(0.9185538928635727, -0.7721779237359591, 'Silver'),
       Text(1.1401084181007262, -0.3743698638724276, 'Gold')],
      [Text(-0.6070751460969142, 0.3485107846127725, '83%'),
       Text(0.43352900789715, -0.5495931216015288, '4%'),
       Text(0.5358231041704173, -0.4504371221793094, '2%'),
       Text(0.6650632438920902, -0.21838242059224944, '10%')])
```

[26]:



```
[27]: chip_usage = merged.groupby(['Education_Level', 'Card_Category' 1]).size().
      ↪unstack()
      chip_usage.plot(kind='bar', stacked=True, color=['tomato', 'royalblue', 'gold'])
      plt.title('Chip Usage Frequency by Card Category')
      plt.xlabel('Card Category')
      plt.ylabel('Chip Usage Rate')
      plt.show()
```

File "/tmp/ipykernel\_449/1564304773.py", line 1

```
      chip_usage = merged.groupby(['Education_Level', 'Card_Category' 1]).size().
      ↪unstack()
```

SyntaxError: invalid syntax. Perhaps you forgot a comma?

```
[28]: chip_usage = merged.groupby(['Card_Category', 'Use Chip']).size().unstack()
chip_usage.plot(kind='bar', stacked=True, color=['tomato', 'royalblue', 'gold'])
plt.title('Chip Usage Frequency by Card Category')
plt.xlabel('Card Category')
plt.ylabel('Chip Usage Rate')
plt.show()
```

```
-----
NameError                                Traceback (most recent call last)
/tmp/ipykernel_449/87453868.py in <cell line: 1>()
----> 1 chip_usage = merged.groupby(['Card_Category', 'Use Chip']).size().
↳ unstack()
      2 chip_usage.plot(kind='bar', stacked=True, color=['tomato',
↳ 'royalblue', 'gold'])
      3 plt.title('Chip Usage Frequency by Card Category')
      4 plt.xlabel('Card Category')
      5 plt.ylabel('Chip Usage Rate')

NameError: name 'merged' is not defined
```

[0]:

```
[29]: cc.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10108 entries, 0 to 10107
Data columns (total 20 columns):
#   Column                                Non-Null Count  Dtype
---  -
0   Client_Num                            10108 non-null  int64
1   Card_Category                         10108 non-null  object
2   Annual_Fees                           10108 non-null  int64
3   Activation_30_Days                    10108 non-null  int64
4   Customer_Acq_Cost                     10108 non-null  int64
5   Week_Start_Date                       10108 non-null  object
6   Week_Num                              10108 non-null  object
7   Qtr                                    10108 non-null  object
8   current_year                          10108 non-null  int64
9   Credit_Limit                          10108 non-null  float64
10  Total_Revolving_Bal                   10108 non-null  int64
11  Total_Trans_Amt                       10108 non-null  int64
12  Total_Trans_Vol                       10108 non-null  int64
13  Avg_Utilization_Ratio                 10108 non-null  float64
14  Use Chip                              10108 non-null  object
```

```

15 Exp Type          10108 non-null object
16 Interest_Earned   10108 non-null float64
17 Delinquent_Acc    10108 non-null int64
18 Total_Revenue     10108 non-null float64
19 Week_No.          10108 non-null int64
dtypes: float64(4), int64(10), object(6)
memory usage: 1.5+ MB

```

```
[30]: cc.head()
```

```

[30]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
1 708083283 Blue 445 1
2 708084558 Blue 140 0
3 708085458 Blue 250 1
4 708086958 Blue 320 1

Customer_Acq_Cost Week_Start_Date Week_Num Qtr current_year Credit_Limit \
0 87 01-01-2023 Week-1 Q1 2023 3544.0
1 108 01-01-2023 Week-1 Q1 2023 3421.0
2 106 01-01-2023 Week-1 Q1 2023 8258.0
3 150 01-01-2023 Week-1 Q1 2023 1438.3
4 106 01-01-2023 Week-1 Q1 2023 3128.0

Total_Revolving_Bal Total_Trans_Amt Total_Trans_Vol \
0 1661 15149 111
1 2517 992 21
2 1771 1447 23
3 0 3940 82
4 749 4369 59

Avg_Utilization_Ratio Use Chip Exp Type Interest_Earned \
0 0.469 Chip Travel 4393.21
1 0.736 Swipe Entertainment 69.44
2 0.214 Chip Bills 202.58
3 0.000 Online Grocery 236.40
4 0.239 Swipe Fuel 1004.87

Delinquent_Acc Total_Revenue Week_No.
0 0 19742.21 1
1 0 1506.44 1
2 0 1789.58 1
3 0 4426.40 1
4 1 5693.87 1

```

```
[31]: result=cc.groupby('Card_Category').sum()
```



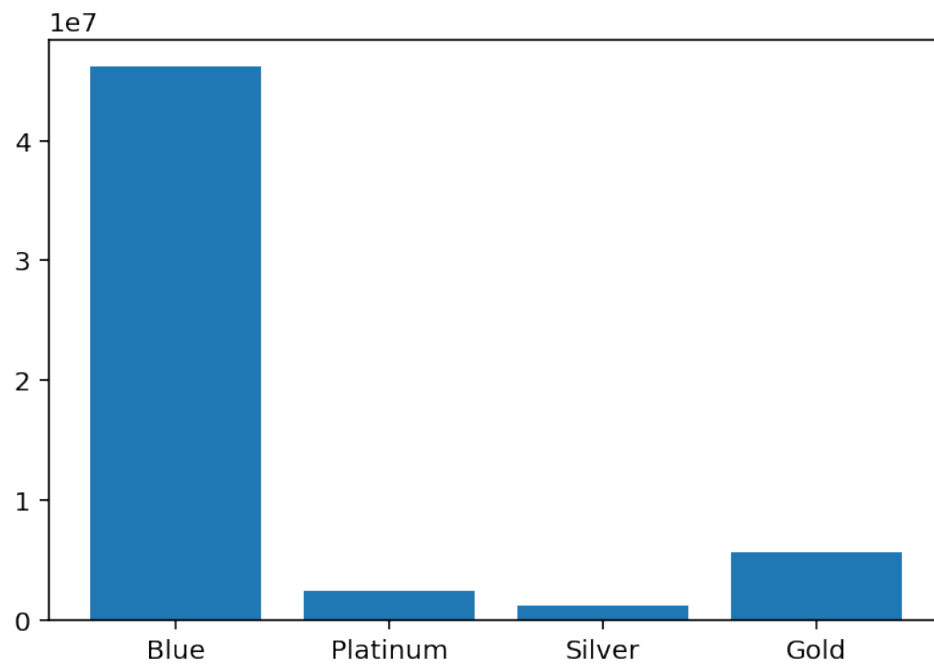
```
category = cc['Card_Category'].unique()

plt.bar(category, result['Total_Revenue'])

plt.xticks(category)

plt.show()
```

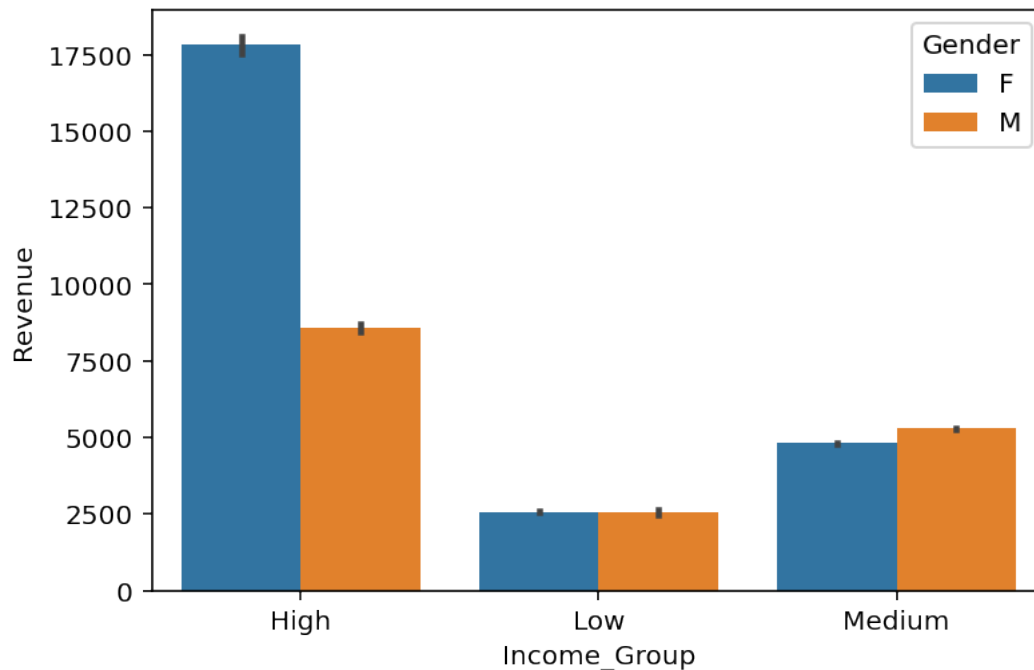
[31]:



```
[32]: cust['Revenue'] = cc['Total_Revenue']
```

```
[33]: sns.barplot(x=cust.Income_Group, y=cust.Revenue, hue=cust.Gender);
```

[33]:



```
[34]: cust.head()
```

```
[34]:   Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \
0   708082083           24      F              1      Uneducated
1   708083283           62      F              0      Unknown
2   708084558           32      F              1      Unknown
3   708085458           38      M              2      Uneducated
4   708086958           48      M              4      Graduate

   Marital_Status  state_cd  Zipcode  Car_Owner  House_Owner  Personal_loan  \
0      Single      FL      91750      no      yes      no
1    Married      NJ      91750      no      no      no
2    Married      NJ      91750      yes      no      no
3     Single      NY      91750      no      no      no
4     Single      TX      91750      yes      yes      no

   contact  Customer_Job  Income  Cust_Satisfaction_Score  Age_Group  \
0   unknown  Businessman  202326              3      <30
1  cellular  Selfemployed   5225              2      >=60
2   unknown  Selfemployed  14235              2     30-40
3  cellular  Blue-collar  45683              1     30-40
4  cellular  Businessman  59279              1     40-50

   Income_Group  Revenue
0      High  19742.21
```

|   |        |         |
|---|--------|---------|
| 1 | Low    | 1506.44 |
| 2 | Low    | 1789.58 |
| 3 | Medium | 4426.40 |
| 4 | Medium | 5693.87 |

```
[35]: cc.head()
```

```
[35]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
1 708083283 Blue 445 1
2 708084558 Blue 140 0
3 708085458 Blue 250 1
4 708086958 Blue 320 1

Customer_Acq_Cost Week_Start_Date Week_Num Qtr current_year Credit_Limit \
0 87 01-01-2023 Week-1 Q1 2023 3544.0
1 108 01-01-2023 Week-1 Q1 2023 3421.0
2 106 01-01-2023 Week-1 Q1 2023 8258.0
3 150 01-01-2023 Week-1 Q1 2023 1438.3
4 106 01-01-2023 Week-1 Q1 2023 3128.0

Total_Revolving_Bal Total_Trans_Amt Total_Trans_Vol \
0 1661 15149 111
1 2517 992 21
2 1771 1447 23
3 0 3940 82
4 749 4369 59

Avg_Utilization_Ratio Use Chip Exp Type Interest_Earned \
0 0.469 Chip Travel 4393.21
1 0.736 Swipe Entertainment 69.44
2 0.214 Chip Bills 202.58
3 0.000 Online Grocery 236.40
4 0.239 Swipe Fuel 1004.87

Delinquent_Acc Total_Revenue Week_No.
0 0 19742.21 1
1 0 1506.44 1
2 0 1789.58 1
3 0 4426.40 1
4 1 5693.87 1
```

```
[36]: w= cc['Qtr'].unique
w
```

```
[36]: <bound method Series.unique of 0 Q1
1 Q1
```

```

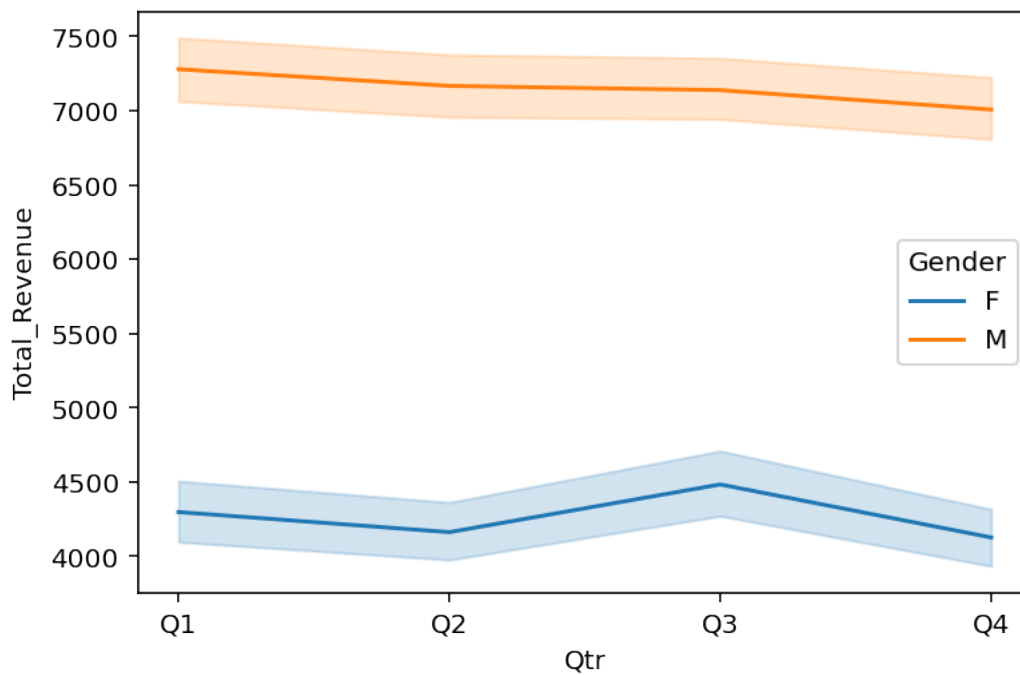
2      Q1
3      Q1
4      Q1
...
10103  Q4
10104  Q4
10105  Q4
10106  Q4
10107  Q4
Name: Qtr, Length: 10108, dtype: object>

```

```
[37]: sns.lineplot(x= cc.Qtr,y= cc.Total_Revenue, hue= cust. Gender)
```

```
[37]: <Axes: xlabel='Qtr', ylabel='Total_Revenue'>
```

```
[37]:
```



```
[38]: cc['current_year'].unique
```

```
[38]: <bound method Series.unique of 0      2023
1      2023
2      2023
3      2023
4      2023
...
10103  2023
10104  2023
```

```

10105    2023
10106    2023
10107    2023
Name: current_year, Length: 10108, dtype: int64>

```

```
[39]: cust.head()
```

```

[39]:   Client_Num  Customer_Age  Gender  Dependent_Count  Education_Level  \
0    708082083           24      F             1      Uneducated
1    708083283           62      F             0      Unknown
2    708084558           32      F             1      Unknown
3    708085458           38      M             2      Uneducated
4    708086958           48      M             4      Graduate

      Marital_Status  state_cd  Zipcode  Car_Owner  House_Owner  Personal_loan  \
0         Single      FL      91750         no         yes         no
1        Married      NJ      91750         no         no         no
2        Married      NJ      91750         yes         no         no
3         Single      NY      91750         no         no         no
4         Single      TX      91750         yes         yes         no

      contact  Customer_Job  Income  Cust_Satisfaction_Score  Age_Group  \
0    unknown  Businessman  202326              3      <30
1  cellular  Selfemployeed   5225              2      >=60
2    unknown  Selfemployeed  14235              2      30-40
3  cellular  Blue-collar   45683              1      30-40
4  cellular  Businessman   59279              1      40-50

      Income_Group  Revenue
0         High  19742.21
1          Low  1506.44
2          Low  1789.58
3        Medium  4426.40
4        Medium  5693.87

```

## 0.6 Some More Insights

#Analysis

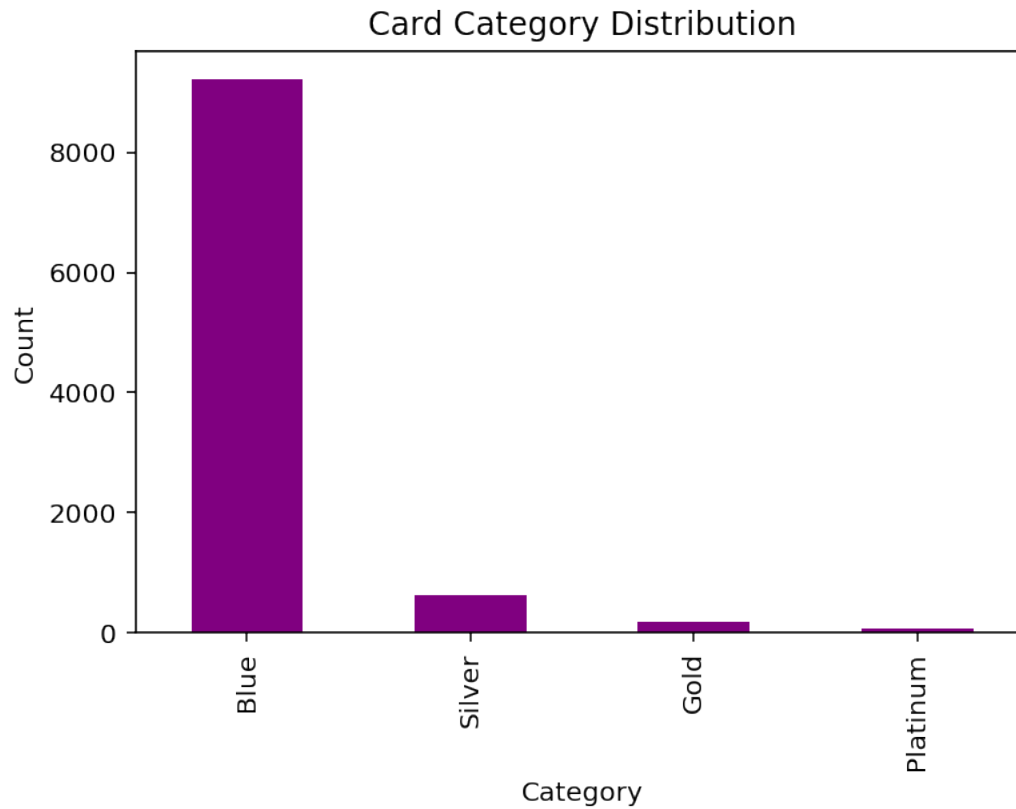
### 0.7 1.Card Category distribution

```

[40]: cc['Card_Category'].value_counts().plot(kind='bar', color='Purple')
plt.title('Card Category Distribution')
plt.xlabel('Category')
plt.ylabel('Count')
plt.show()

```

[40]:

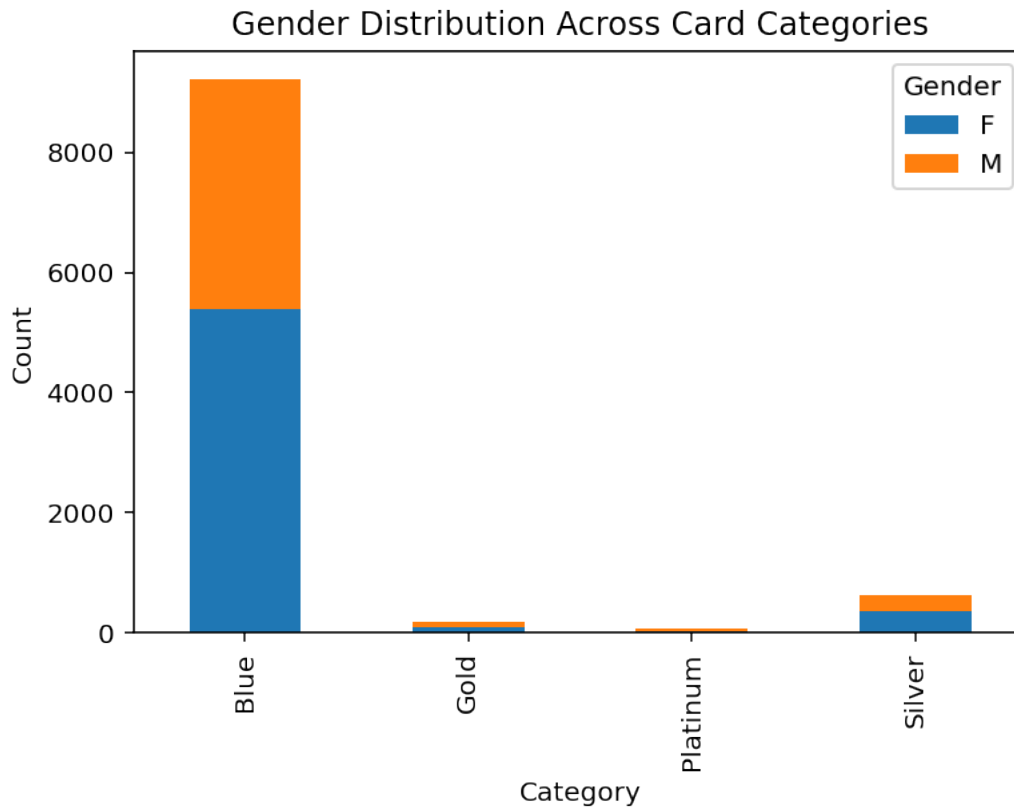


## 0.8 2. Gender Distribution Across Card Categories

```
[41]: cust['Card_Category'] = cc['Card_Category']
```

```
[42]: cust.groupby(['Card_Category', 'Gender']).size().unstack().plot(kind='bar',  
    ↪stacked=True)  
plt.title('Gender Distribution Across Card Categories')  
plt.xlabel('Category')  
plt.ylabel('Count')  
plt.show()
```

```
[42]:
```



### 0.9 3. Activation 30 days with card category & Gender

[0]:

### 0.10 Merge two data frames cust & cc

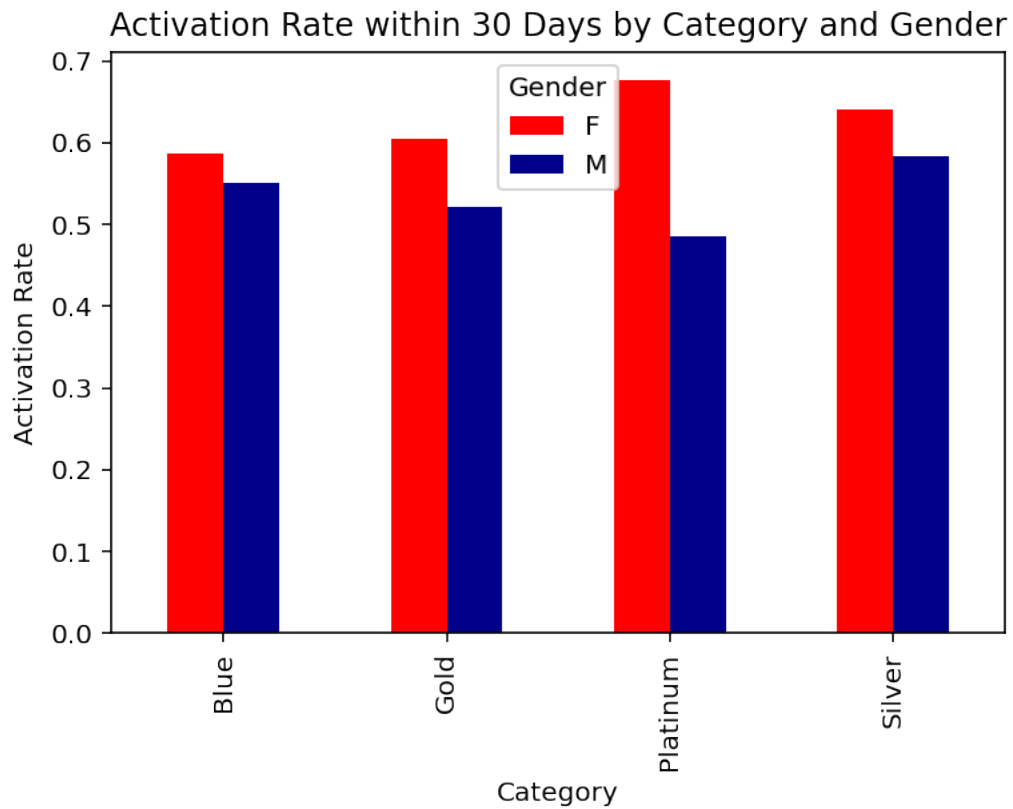
```
[43]: import pandas as pd
import matplotlib.pyplot as plt
# Assuming you have the following DataFrames:
# cust = pd.read_csv('customer_details.csv') # Customer details DataFrame
# cc = pd.read_csv('credit_card_details.csv') # Credit card details DataFrame
# Merge the two DataFrames on Client ID

merged = pd.merge(cc, cust[['Client_Num', 'Gender']], on='Client_Num')

[44]: activation_rate = merged.groupby(['Card_Category',
    ↪ 'Gender'])['Activation_30_Days'].mean().unstack()
activation_rate.plot(kind='bar', color=['Red', 'darkblue'])
plt.title('Activation Rate within 30 Days by Category and Gender')
plt.xlabel('Category')
```

```
plt.ylabel('Activation Rate')  
plt.show()
```

[44]:

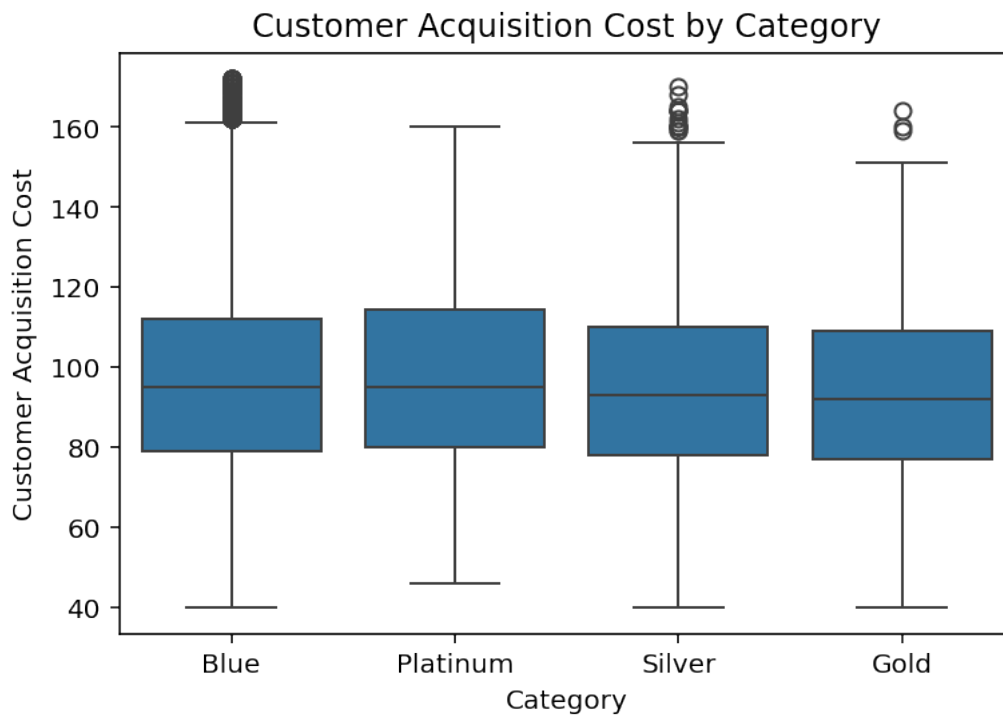


#### 0.11 4. Customer Acquisition Cost by Card Category.

```
[45]: sns.boxplot(x='Card_Category', y='Customer_Acq_Cost', data=cc)  
plt.title('Customer Acquisition Cost by Category')  
plt.xlabel('Category')  
plt.ylabel('Customer Acquisition Cost')  
plt.show()
```

[45]:



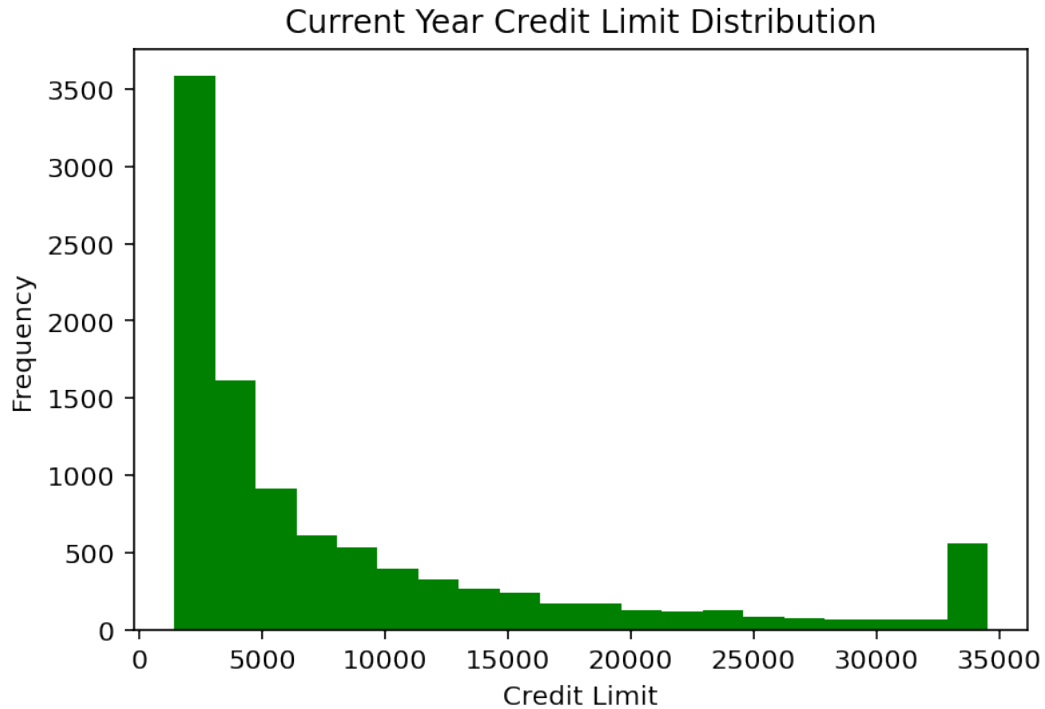


[0]:

## 0.12 5. Current Year Credit Limit Distribution

```
[46]: cc['Credit_Limit'].plot(kind='hist', bins=20, color='green')
plt.title('Current Year Credit Limit Distribution')
plt.xlabel('Credit Limit')
plt.ylabel('Frequency')
plt.show()
```

[46]:



### 0.13 6. Total Revolving balance by category

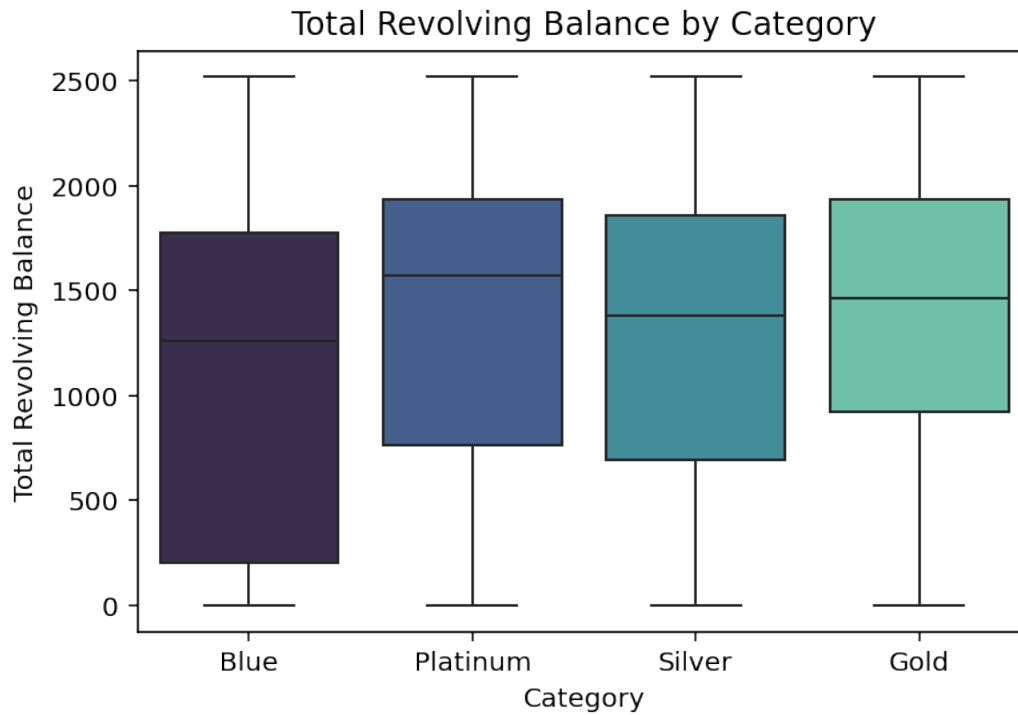
```
[47]: sns.boxplot(x='Card_Category', y='Total_Revolving_Bal', data=cc, palette="mako")
plt.title('Total Revolving Balance by Category')
plt.xlabel('Category')
plt.ylabel('Total Revolving Balance')
plt.show()
```

/tmp/ipykernel\_449/1479599055.py:1: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

```
sns.boxplot(x='Card_Category', y='Total_Revolving_Bal', data=cc,
palette="mako")
```

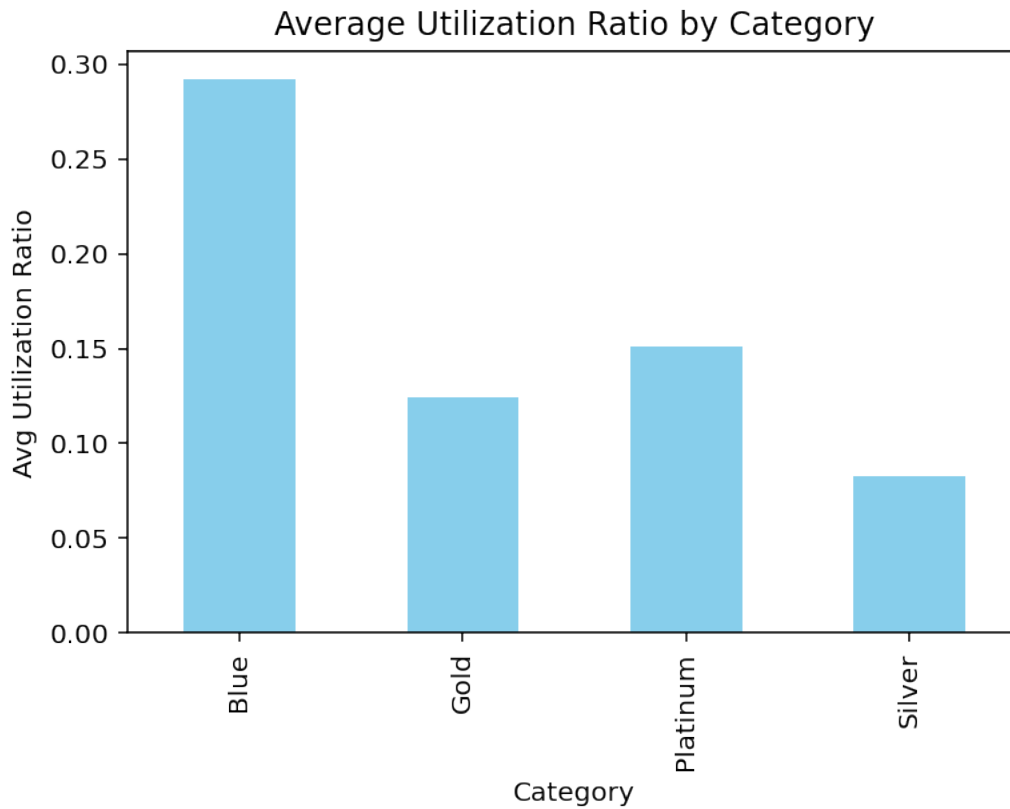
[47]:



### 0.13.1 7. Average Utilization Ratio by card category

```
[48]: cc.groupby('Card_Category')['Avg_Utilization_Ratio'].mean().plot(kind='bar',  
    color='skyblue')  
plt.title('Average Utilization Ratio by Category')  
plt.xlabel('Category')  
plt.ylabel('Avg Utilization Ratio')  
plt.show()
```

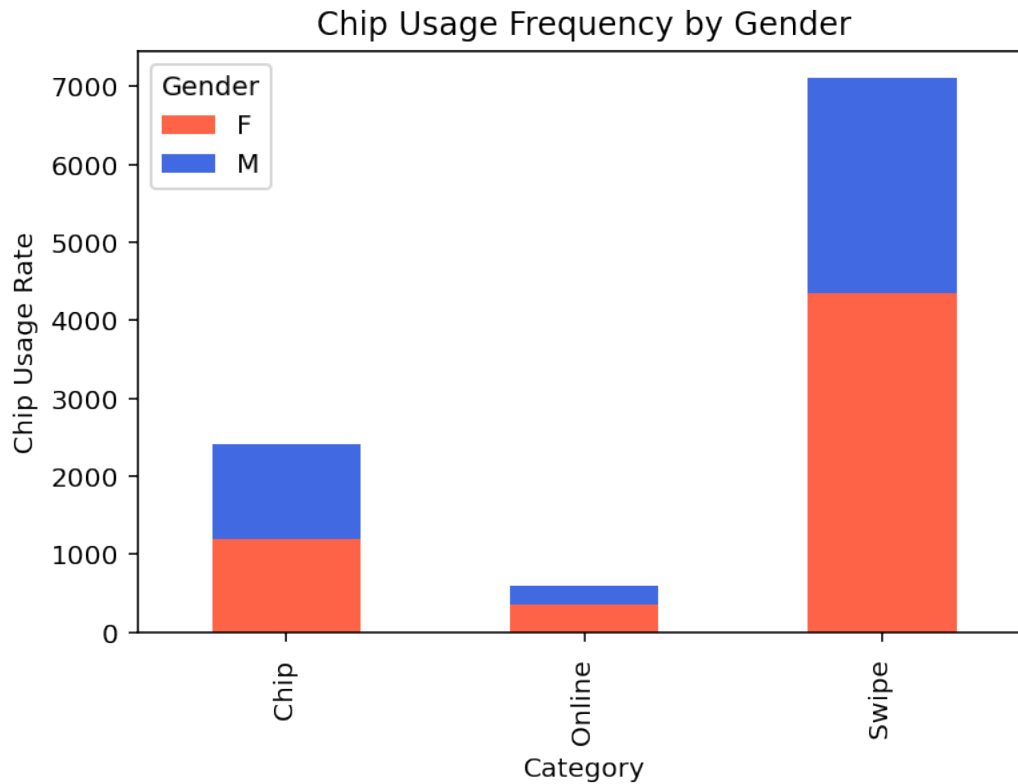
[48]:



### 0.13.2 8. Chip Usage Rate by Category & Gender

```
[49]: chip_usage = merged.groupby(['Use Chip', 'Gender']).size().unstack()
chip_usage.plot(kind='bar', stacked=True, color=['tomato', 'royalblue'])
plt.title('Chip Usage Frequency by Gender')
plt.xlabel('Category')
plt.ylabel('Chip Usage Rate')
plt.show()
```

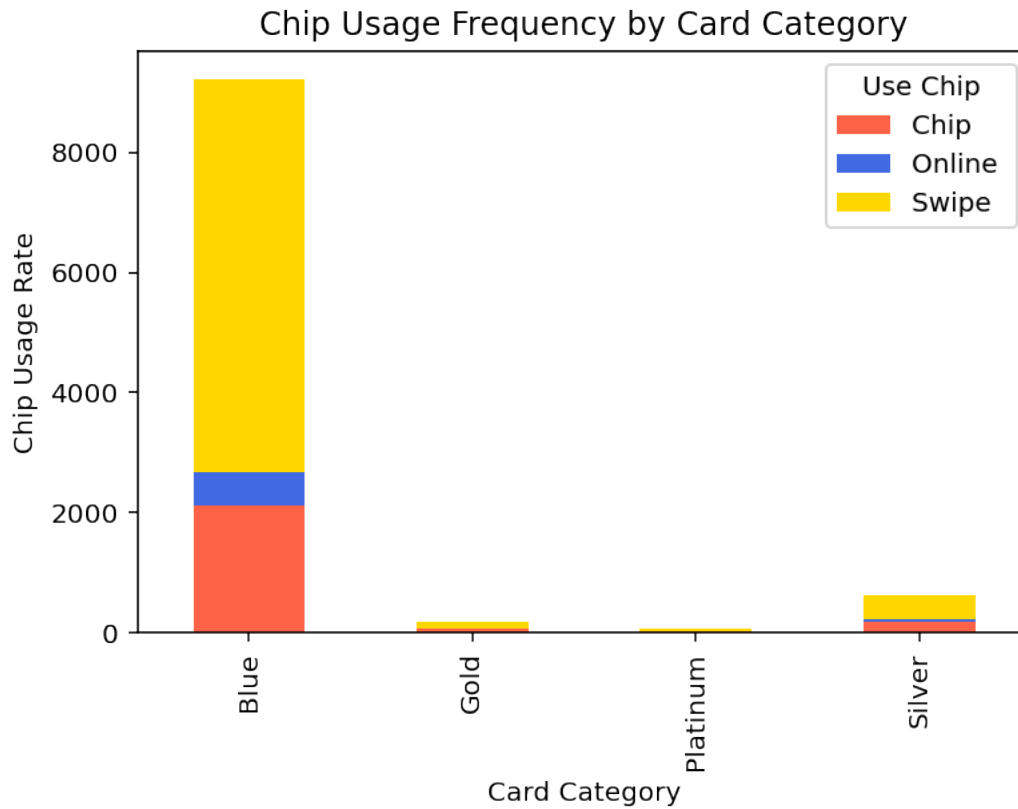
[49]:



#### 0.13.3 9. Chip usage frequency as per Card Category

```
[50]: chip_usage = merged.groupby(['Card_Category', 'Use Chip']).size().unstack()
chip_usage.plot(kind='bar', stacked=True, color=['tomato', 'royalblue', 'gold'])
plt.title('Chip Usage Frequency by Card Category')
plt.xlabel('Card Category')
plt.ylabel('Chip Usage Rate')
plt.show()
```

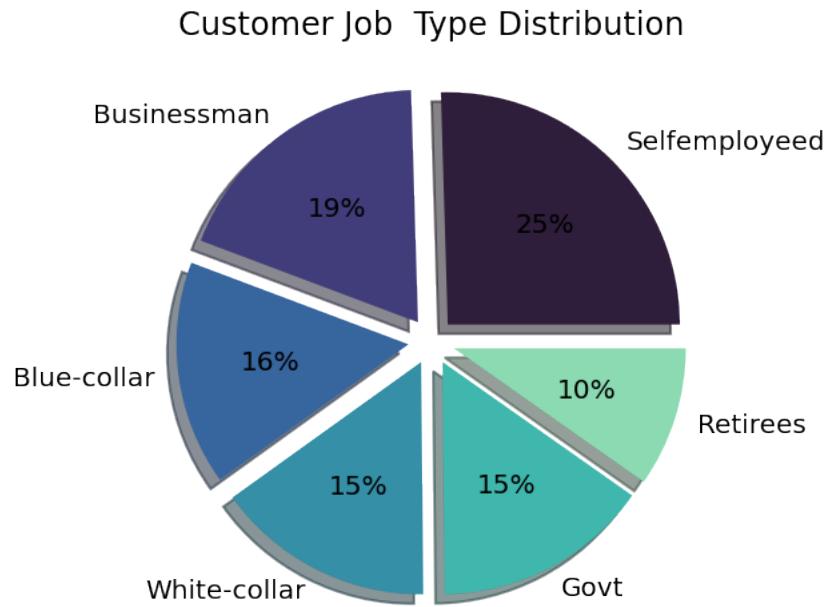
[50]:



#### 0.13.4 10.1 Customer Job Type Distribution

```
[51]: cust['Customer_Job'].value_counts().plot(kind='pie', autopct='%1.0f%%',
        colors=sns.color_palette('mako'), shadow=True, explode=(0.1,0.1,0.1,0.1,0.
        1,0.1))
plt.title('Customer Job Type Distribution')
plt.ylabel('')
plt.show()
```

[51]:

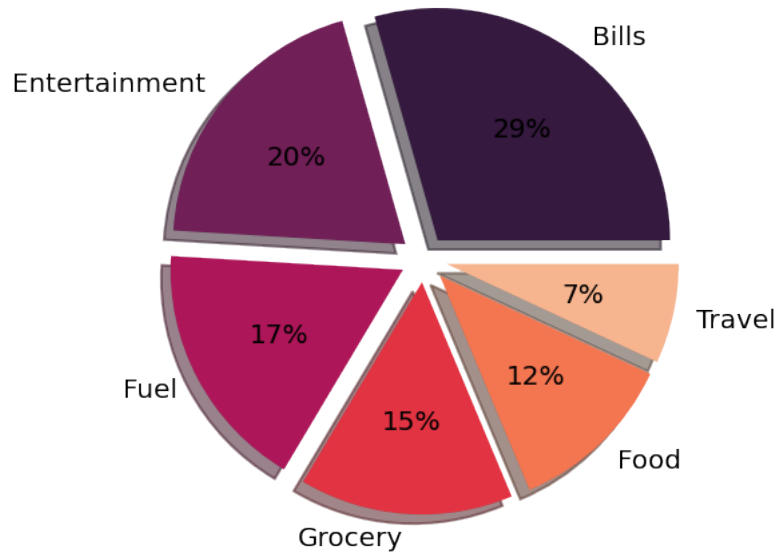


#### 0.13.5 10.2 Expenditure Type DisDistribution

```
[52]: cc['Exp Type'].value_counts().plot(kind='pie', autopct='%1.0f%%', colors=sns.
      ↪color_palette('rocket'),shadow= True, explode=(0.1,0.1,0.1,0.1,0.1,0.1))
plt.title('Expenditure Type Distribution')
plt.ylabel('')
plt.show()
```

[52]:

Expenditure Type Distribution



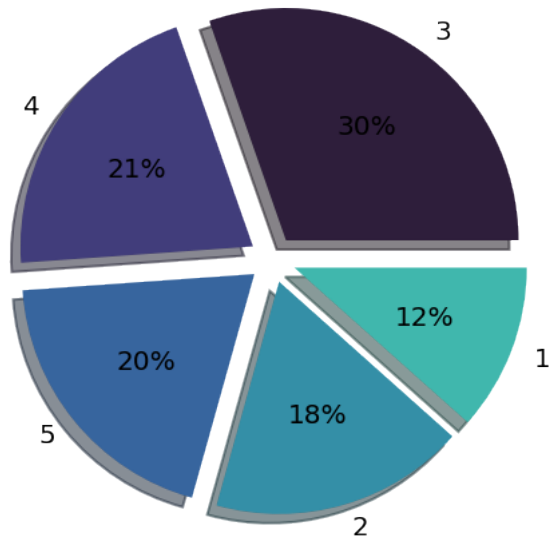
#### 0.13.6 10.3 Customer Satisfaction

```
[53]: cust['Cust_Satisfaction_Score'].value_counts().plot(kind='pie', autopct='%1.
      ↪0f%%', colors=sns.color_palette('mako'), shadow=True, explode=(0.1,0.1,0.1,0.
      ↪1,0.1))
plt.title('Customer Satisfaction Score Distribution')
plt.ylabel('')
plt.show()
#cust['Cust_Satisfaction _Score'].value_counts().plot(kind='pie', autopct='%1.
      ↪0f%%', colors=sns.color_palette('rocket'),shadow= True, explode=(0.1,0.1,0.
      ↪1,0.1,0.1))
```

[53]:



Customer Satisfaction Score Distribution



```
[54]: cc.head()
```

```
[54]: Client_Num Card_Category Annual_Fees Activation_30_Days \
0 708082083 Blue 200 0
1 708083283 Blue 445 1
2 708084558 Blue 140 0
3 708085458 Blue 250 1
4 708086958 Blue 320 1
```

```
Customer_Acq_Cost Week_Start_Date Week_Num Qtr current_year Credit_Limit \
0 87 01-01-2023 Week-1 Q1 2023 3544.0
1 108 01-01-2023 Week-1 Q1 2023 3421.0
2 106 01-01-2023 Week-1 Q1 2023 8258.0
3 150 01-01-2023 Week-1 Q1 2023 1438.3
4 106 01-01-2023 Week-1 Q1 2023 3128.0
```

```
Total_Revolving_Bal Total_Trans_Amt Total_Trans_Vol \
0 1661 15149 111
1 2517 992 21
2 1771 1447 23
3 0 3940 82
4 749 4369 59
```

```
Avg_Utilization_Ratio Use Chip Exp Type Interest_Earned \
0 0.469 Chip Travel 4393.21
1 0.736 Swipe Entertainment 69.44
```

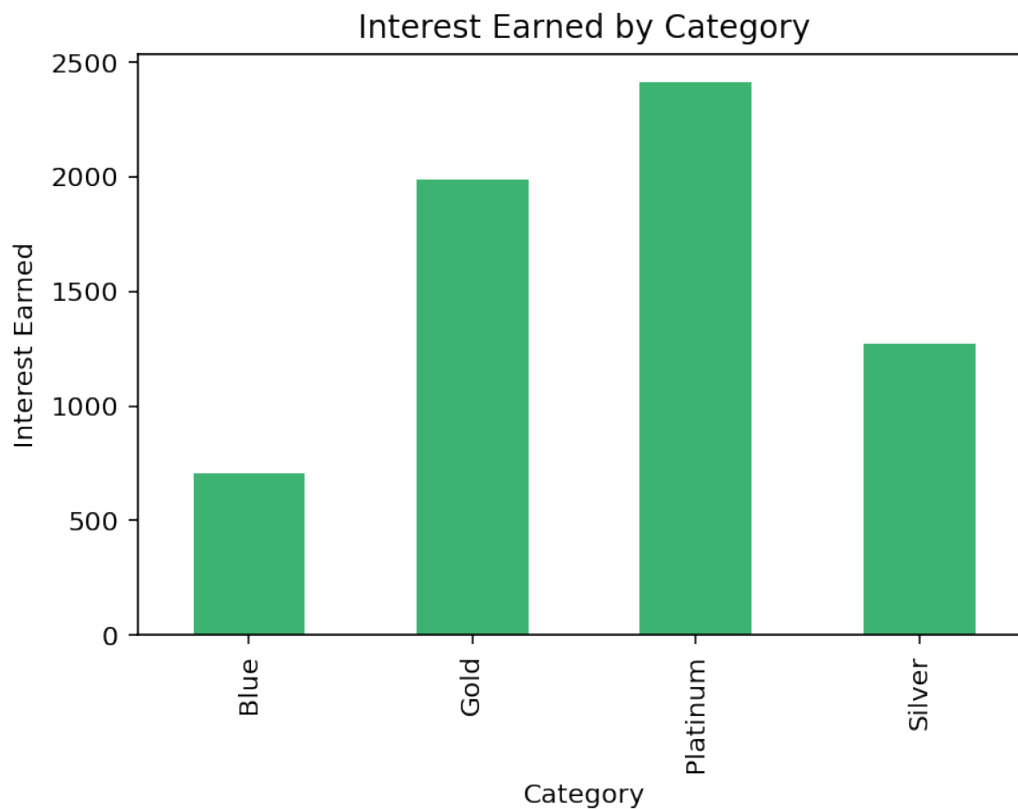
|   |       |        |         |         |
|---|-------|--------|---------|---------|
| 2 | 0.214 | Chip   | Bills   | 202.58  |
| 3 | 0.000 | Online | Grocery | 236.40  |
| 4 | 0.239 | Swipe  | Fuel    | 1004.87 |

|   | Delinquent_Acc | Total_Revenue | Week_No. |
|---|----------------|---------------|----------|
| 0 | 0              | 19742.21      | 1        |
| 1 | 0              | 1506.44       | 1        |
| 2 | 0              | 1789.58       | 1        |
| 3 | 0              | 4426.40       | 1        |
| 4 | 1              | 5693.87       | 1        |

### 0.13.7 11. Interest Earned by Category

```
[55]: cc.groupby('Card_Category')['Interest_Earned'].mean().plot(kind='bar',
    color='mediumseagreen')
plt.title('Interest Earned by Category')
plt.xlabel('Category')
plt.ylabel('Interest Earned')
plt.show()
```

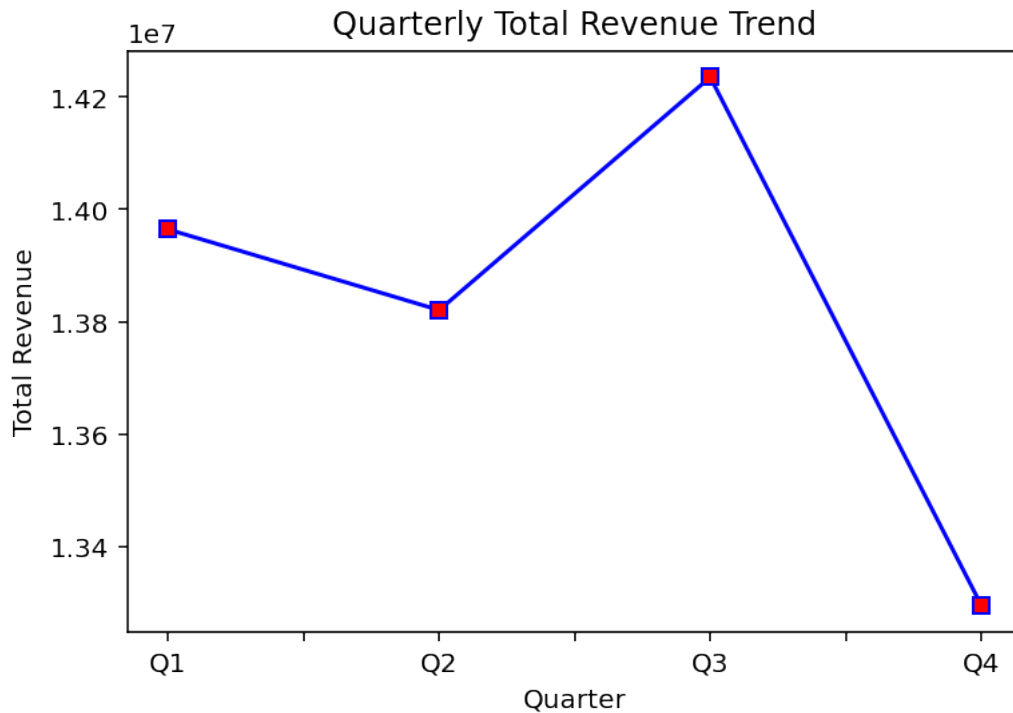
[55]:



### 0.13.8 12. Quarterly Total Revenue Trend

```
[56]: cc.groupby('Qtr')['Total_Revenue'].sum().plot(kind='line',marker='s',color='blue', mfc='red')
plt.title('Quarterly Total Revenue Trend')
plt.xlabel('Quarter')
plt.ylabel('Total Revenue')
plt.show()
```

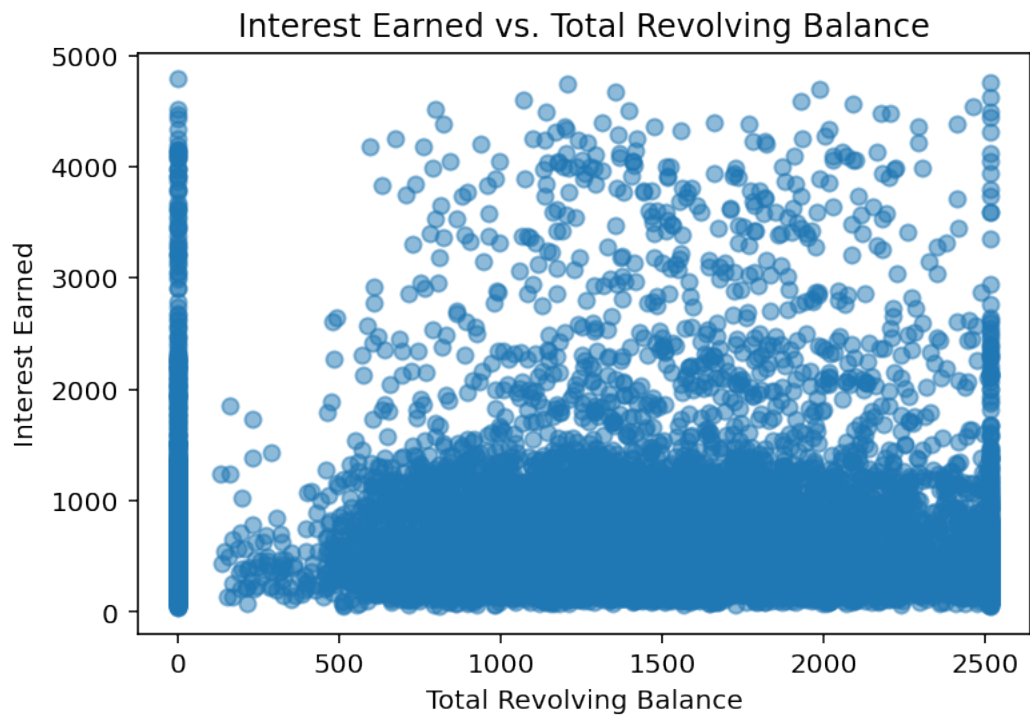
[56]:



### 0.13.9 13. Interest Earned vs. Total Revolving Balance

```
[57]: plt.scatter(cc['Total_Revolving_Bal'], cc['Interest_Earned'], alpha=0.5)
plt.title('Interest Earned vs. Total Revolving Balance')
plt.xlabel('Total Revolving Balance')
plt.ylabel('Interest Earned')
plt.show()
```

[57]:



[0] :