

Import Libraries

```
# Import necessary libraries
import pandas as pd

txn = pd.read_csv(r'E:/Internship
Studio/Project/Retail_data_Transactions.csv', header=0, encoding='utf-8')
```

txn

	customer_id	trans_date	tran_amount
0	CS5295	11-Feb-13	35
1	CS4768	15-Mar-15	39
2	CS2122	26-Feb-13	52
3	CS1217	16-Nov-11	99
4	CS1850	20-Nov-13	78
...
124995	CS8433	26-Jun-11	64
124996	CS7232	19-Aug-14	38
124997	CS8731	28-Nov-14	42
124998	CS8133	14-Dec-13	13
124999	CS7996	13-Dec-14	36

[125000 rows x 3 columns]

```
response = pd.read_csv(r'E:/Internship
Studio/Project/Retail_data_Response.csv', header=0, encoding='utf-8')
```

response

	customer_id	response
0	CS1112	0
1	CS1113	0
2	CS1114	1
3	CS1115	1
4	CS1116	1
...
6879	CS8996	0
6880	CS8997	0
6881	CS8998	0
6882	CS8999	0
6883	CS9000	0

[6884 rows x 2 columns]

```
df = txn.merge(response, on='customer_id', how='left')
```

df

	customer_id	trans_date	tran_amount	response
0	CS5295	11-Feb-13	35	1.0

1	CS4768	15-Mar-15	39	1.0
2	CS2122	26-Feb-13	52	0.0
3	CS1217	16-Nov-11	99	0.0
4	CS1850	20-Nov-13	78	0.0
...
124995	CS8433	26-Jun-11	64	0.0
124996	CS7232	19-Aug-14	38	0.0
124997	CS8731	28-Nov-14	42	0.0
124998	CS8133	14-Dec-13	13	0.0
124999	CS7996	13-Dec-14	36	0.0

[125000 rows x 4 columns]

features

df.dtypes

```
customer_id    object
trans_date     object
tran_amount    int64
response       float64
dtype: object
```

df.shape

(125000, 4)

df.tail()

	customer_id	trans_date	tran_amount	response
124995	CS8433	26-Jun-11	64	0.0
124996	CS7232	19-Aug-14	38	0.0
124997	CS8731	28-Nov-14	42	0.0
124998	CS8133	14-Dec-13	13	0.0
124999	CS7996	13-Dec-14	36	0.0

df.describe()

	tran_amount	response
count	125000.000000	124969.000000
mean	64.991912	0.110763
std	22.860006	0.313840
min	10.000000	0.000000
25%	47.000000	0.000000
50%	65.000000	0.000000
75%	83.000000	0.000000
max	105.000000	1.000000

Missing Values

df.isnull().sum()

```
customer_id    0
trans_date     0
tran_amount    0
response       31
dtype: int64
```

```
df = df.dropna()
```

```
df
```

	customer_id	trans_date	tran_amount	response
0	CS5295	11-Feb-13	35	1.0
1	CS4768	15-Mar-15	39	1.0
2	CS2122	26-Feb-13	52	0.0
3	CS1217	16-Nov-11	99	0.0
4	CS1850	20-Nov-13	78	0.0
...
124995	CS8433	26-Jun-11	64	0.0
124996	CS7232	19-Aug-14	38	0.0
124997	CS8731	28-Nov-14	42	0.0
124998	CS8133	14-Dec-13	13	0.0
124999	CS7996	13-Dec-14	36	0.0

```
[124969 rows x 4 columns]
```

```
# change dtypes
```

```
df['trans_date'] = pd.to_datetime(df['trans_date'])
df['response'] = df['response'].astype('int64')
```

```
C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\2474506332.py:3:
UserWarning: Could not infer format, so each element will be parsed
individually, falling back to `dateutil`. To ensure parsing is
consistent and as-expected, please specify a format.
```

```
df['trans_date'] = pd.to_datetime(df['trans_date'])
```

```
C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\2474506332.py:3:
SettingWithCopyWarning:
```

```
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

```
See the caveats in the documentation:
```

```
https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#
returning-a-view-versus-a-copy
```

```
df['trans_date'] = pd.to_datetime(df['trans_date'])
```

```
C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\2474506332.py:4:
SettingWithCopyWarning:
```

```
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead
```

```
See the caveats in the documentation:
```

```
https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#
```

```

returning-a-view-versus-a-copy
df['response']= df['response'].astype('int64')

set(df['response'])

{0, 1}

df.info()

<class 'pandas.core.frame.DataFrame'>
Index: 124969 entries, 0 to 124999
Data columns (total 4 columns):
#   Column          Non-Null Count  Dtype
---  -
0   customer_id     124969 non-null    object
1   trans_date      124969 non-null    datetime64[ns]
2   tran_amount     124969 non-null    int64
3   response        124969 non-null    int64
dtypes: datetime64[ns](1), int64(2), object(1)
memory usage: 4.8+ MB

# check outliers
# z-score

from scipy import stats
import numpy as np

#calc z score
z_scores = np.abs(stats.zscore(df['tran_amount']))

#set a threshold

threshold= 3

outliers= z_scores>threshold

print(df[outliers])

Empty DataFrame
Columns: [customer_id, trans_date, tran_amount, response]
Index: []

# check outliers
# z-score

from scipy import stats
import numpy as np

#calc z score
z_scores = np.abs(stats.zscore(df['response']))

```

```

#set a threshold
threshold= 3

outliers= z_scores>threshold

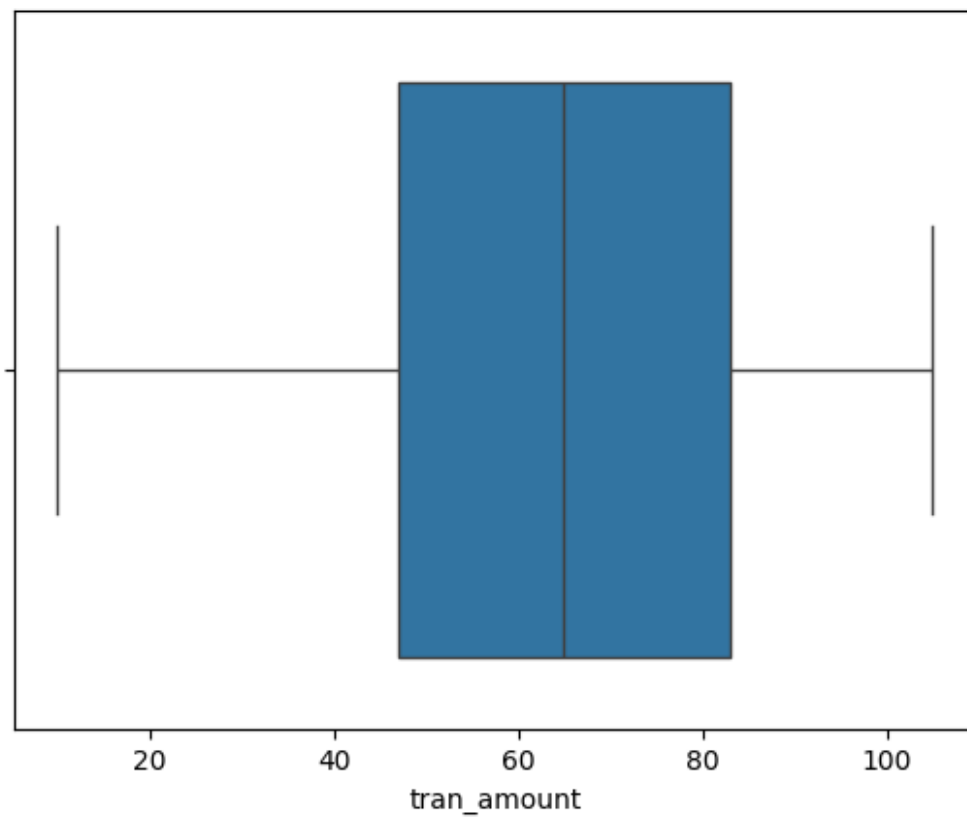
print(df[outliers])

Empty DataFrame
Columns: [customer_id, trans_date, tran_amount, response]
Index: []

import seaborn as sns
import matplotlib.pyplot as plt

sns.boxplot(x=df['tran_amount'])
plt.show()

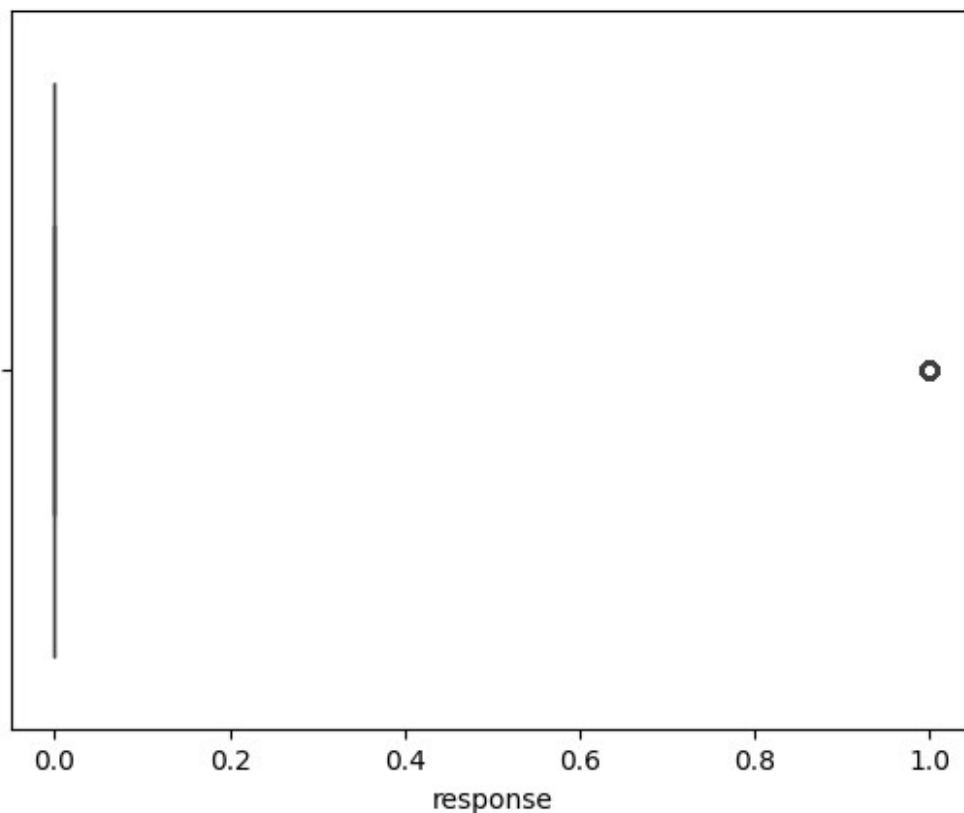
```



```

sns.boxplot(x=df['response'])
plt.show()

```



```
# creating new columns
```

```
df['month']= df['trans_date'].dt.month
```

C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\197175934.py:3:

SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using `.loc[row_indexer,col_indexer] = value` instead

See the caveats in the documentation:

https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
df['month']= df['trans_date'].dt.month
```

```
df
```

	customer_id	trans_date	tran_amount	response	month
0	CS5295	2013-02-11	35	1	2
1	CS4768	2015-03-15	39	1	3
2	CS2122	2013-02-26	52	0	2
3	CS1217	2011-11-16	99	0	11
4	CS1850	2013-11-20	78	0	11
...
124995	CS8433	2011-06-26	64	0	6
124996	CS7232	2014-08-19	38	0	8

124997	CS8731	2014-11-28	42	0	11
124998	CS8133	2013-12-14	13	0	12
124999	CS7996	2014-12-13	36	0	12

[124969 rows x 5 columns]

Which 3 months have had the highest transaction amounts?

```
monthly_sales = df.groupby('month')['tran_amount'].sum()
monthly_sales =
monthly_sales.sort_values(ascending=False).reset_index().head(3)
monthly_sales
```

	month	tran_amount
0	8	726775
1	10	725058
2	1	724089

Customers having highest num of orders

```
customer_counts= df['customer_id'].value_counts().reset_index()
customer_counts.columns=['customer_id','count']
```

sort

```
top_5_cus= customer_counts.sort_values(by='count',
ascending=False).head(5)
top_5_cus
```

	customer_id	count
0	CS4424	39
1	CS4320	38
2	CS3799	36
3	CS3013	35
4	CS1215	35

```
sns.set(style='darkgrid')
```

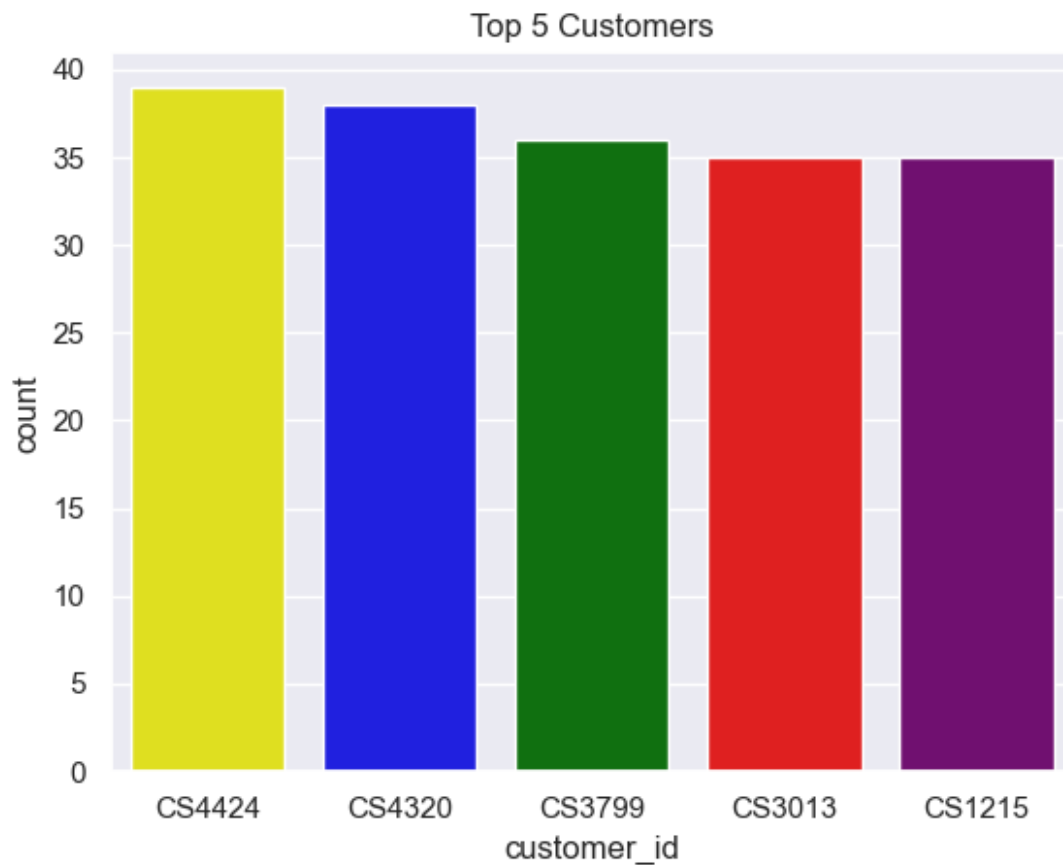
```
colors = ['yellow', 'blue', 'green', 'red', 'purple']
```

```
sns.barplot(x='customer_id',y='count',data=top_5_cus, palette=colors )
plt.title('Top 5 Customers')
plt.savefig('count_plot.png')
```

C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\1920850022.py:3:
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.barplot(x='customer_id',y='count',data=top_5_cus, palette=colors
)
```



Customers having highest value of orders

```
customer_sales = df.groupby('customer_id')
['tran_amount'].sum().reset_index()
```

sort

```
top_5_sal= customer_sales.sort_values(by='tran_amount',
ascending=False).head(5)
top_5_sal
```

	customer_id	tran_amount
3312	CS4424	2933
3208	CS4320	2647
4640	CS5752	2612
3548	CS4660	2527
2687	CS3799	2513

```
colors = ['yellow', 'blue', 'green', 'red', 'purple']
```

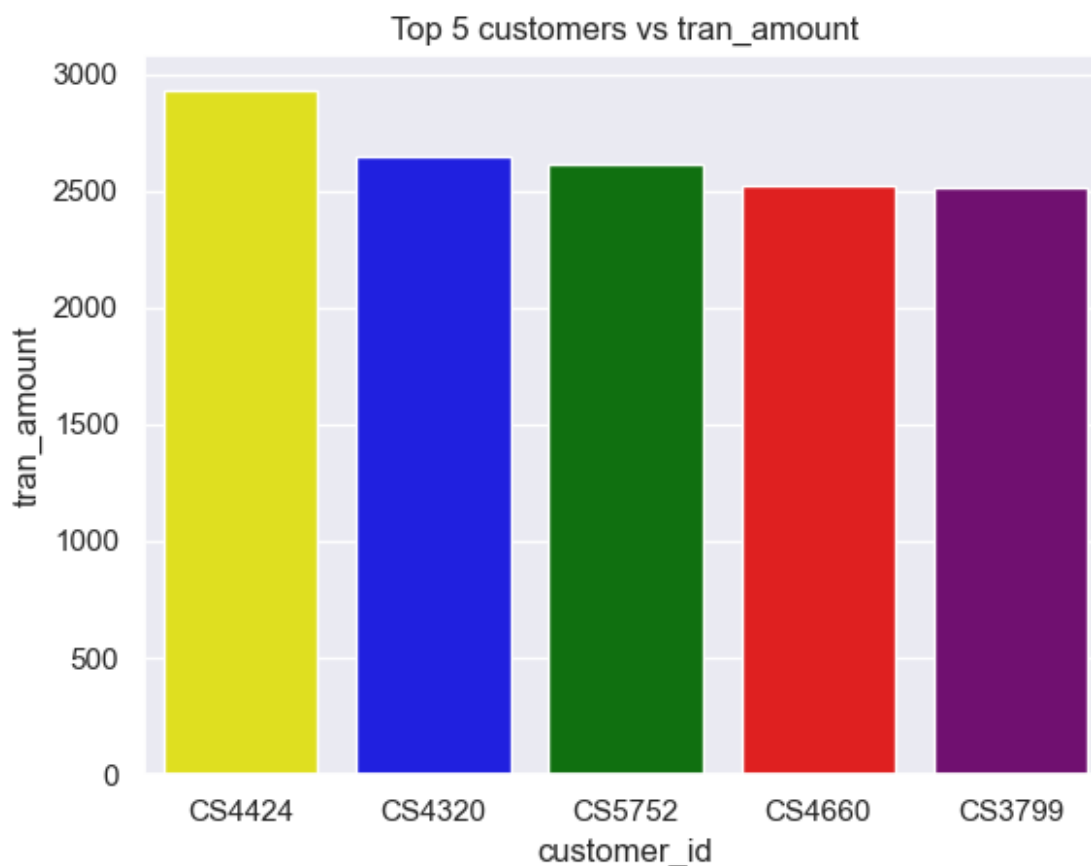


```
sns.barplot(x='customer_id',y='tran_amount',data=top_5_sal,
palette=colors)
plt.title('Top 5 customers vs tran_amount')
plt.savefig('bar_plot.png')
```

C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\2125539671.py:3:
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.barplot(x='customer_id',y='tran_amount',data=top_5_sal,
palette=colors)
```



Advanced Analytics

Time Serieres Analysis

df

	customer_id	trans_date	tran_amount	response	month
0	CS5295	2013-02-11	35	1	2

1	CS4768	2015-03-15	39	1	3
2	CS2122	2013-02-26	52	0	2
3	CS1217	2011-11-16	99	0	11
4	CS1850	2013-11-20	78	0	11
...
124995	CS8433	2011-06-26	64	0	6
124996	CS7232	2014-08-19	38	0	8
124997	CS8731	2014-11-28	42	0	11
124998	CS8133	2013-12-14	13	0	12
124999	CS7996	2014-12-13	36	0	12

[124969 rows x 5 columns]

```
import matplotlib.dates as mdates
```

```
df['month_year'] = df['trans_date'].dt.to_period('M')
df
```

C:\Users\Anish\AppData\Local\Temp\ipykernel_12564\2558405081.py:3:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation:

https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
df['month_year'] = df['trans_date'].dt.to_period('M')
```

	customer_id	trans_date	tran_amount	response	month	month_year
0	CS5295	2013-02-11	35	1	2	2013-02
1	CS4768	2015-03-15	39	1	3	2015-03
2	CS2122	2013-02-26	52	0	2	2013-02
3	CS1217	2011-11-16	99	0	11	2011-11
4	CS1850	2013-11-20	78	0	11	2013-11
...
124995	CS8433	2011-06-26	64	0	6	2011-06
124996	CS7232	2014-08-19	38	0	8	2014-08
124997	CS8731	2014-11-28	42	0	11	2014-11
124998	CS8133	2013-12-14	13	0	12	2013-12
124999	CS7996	2014-12-13	36	0	12	2014-12

[124969 rows x 6 columns]

```
# Convert the PeriodIndex to DateTimeIndex
```

```
monthly_sales = df.groupby('month_year')['tran_amount'].sum()
```

```
# Convert PeriodIndex to DateTimeIndex
```

```
monthly_sales.index = monthly_sales.index.to_timestamp()
```

```
plt.figure(figsize=(12,6)) # Increase the size of the figure
```

```
plt.plot(monthly_sales.index, monthly_sales.values) # Plot the data
```

```
plt.gca().xaxis.set_major_formatter(mdates.DateFormatter('%Y-%m')) #
Format the x-axis labels
plt.gca().xaxis.set_major_locator(mdates.MonthLocator(interval=6)) #
Set the x-axis interval
plt.xlabel('Month-Year')
plt.ylabel('Sales')
plt.title('Monthly Sales')
plt.xticks(rotation=45) # Rotate the x-axis labels
plt.tight_layout() # Adjust the layout for better visibility
plt.savefig('line_plot.png')
plt.show()
```



Cohort Segmentation

```
# Recency will be the maximum of trans_date
recency = df.groupby('customer_id')['trans_date'].max()

# Frequency will be the count of transactions
frequency = df.groupby('customer_id')['trans_date'].count()

# Monetary will be the sum of tran_amount
monetary = df.groupby('customer_id')['tran_amount'].sum()

# Combine all three into a DataFrame
rfm = pd.DataFrame({'recency': recency, 'frequency': frequency,
                    'monetary': monetary})

rfm
```

customer_id	recency	frequency	monetary
customer_id			

CS1112	2015-01-14	15	1012
CS1113	2015-02-09	20	1490
CS1114	2015-02-12	19	1432
CS1115	2015-03-05	22	1659
CS1116	2014-08-25	13	857
...
CS8996	2014-12-09	13	582
CS8997	2014-06-28	14	543
CS8998	2014-12-22	13	624
CS8999	2014-07-02	12	383
CS9000	2015-02-28	13	533

[6884 rows x 3 columns]

Customer segmentation

```
def segment_customer(row):
    if row['recency'].year >= 2012 and row['frequency'] >= 15 and
row['monetary'] > 1000:
        return 'P0'
    elif (2011 <= row['recency'].year < 2012) and (10 <
row['frequency'] <= 15) and (500 < row['monetary'] <= 1000):
        return 'P1'
    else:
        return 'P2'
```

```
rfm['Segment'] = rfm.apply(segment_customer, axis=1)
```

rfm

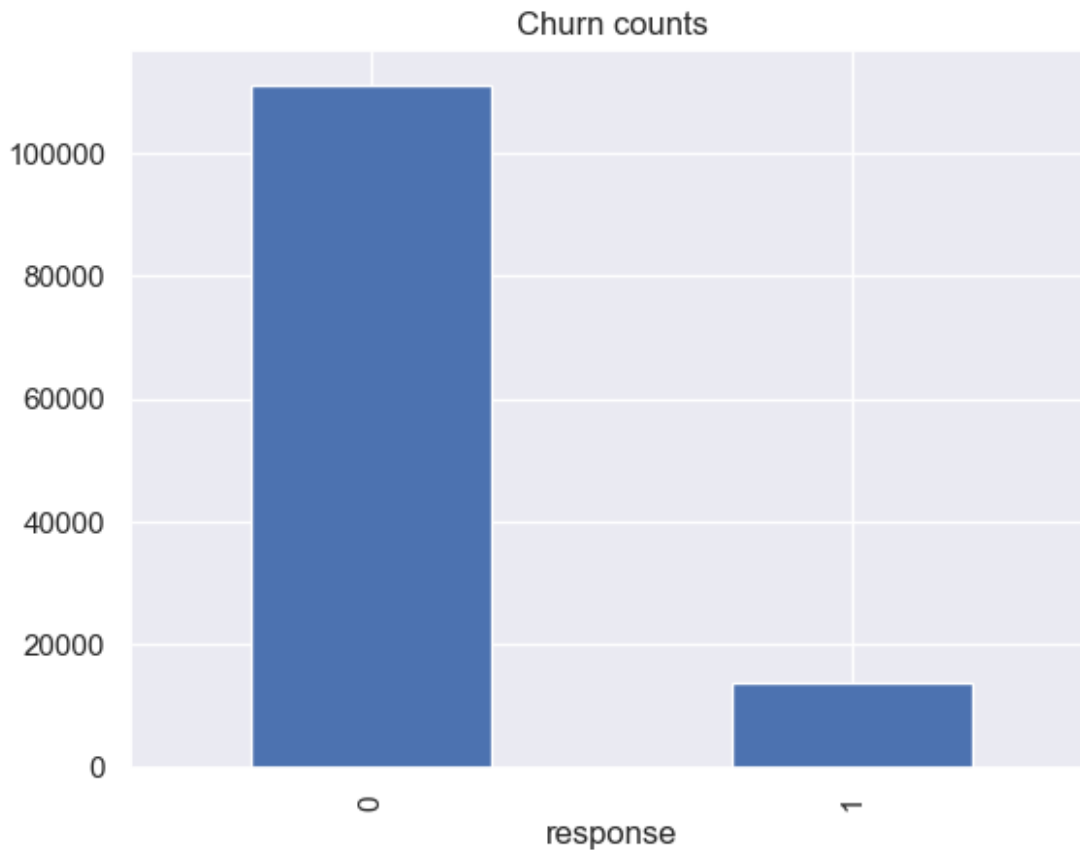
customer_id	recency	frequency	monetary	Segment
CS1112	2015-01-14	15	1012	P0
CS1113	2015-02-09	20	1490	P0
CS1114	2015-02-12	19	1432	P0
CS1115	2015-03-05	22	1659	P0
CS1116	2014-08-25	13	857	P2
...
CS8996	2014-12-09	13	582	P2
CS8997	2014-06-28	14	543	P2
CS8998	2014-12-22	13	624	P2
CS8999	2014-07-02	12	383	P2
CS9000	2015-02-28	13	533	P2

[6884 rows x 4 columns]

Churn Analysis

```
# Count the number of churned and active customers
churn_counts = df['response'].value_counts()
```

```
# Plot
churn_counts.plot(kind='bar')
plt.title('Churn counts')
plt.savefig('churn_plot.png')
```

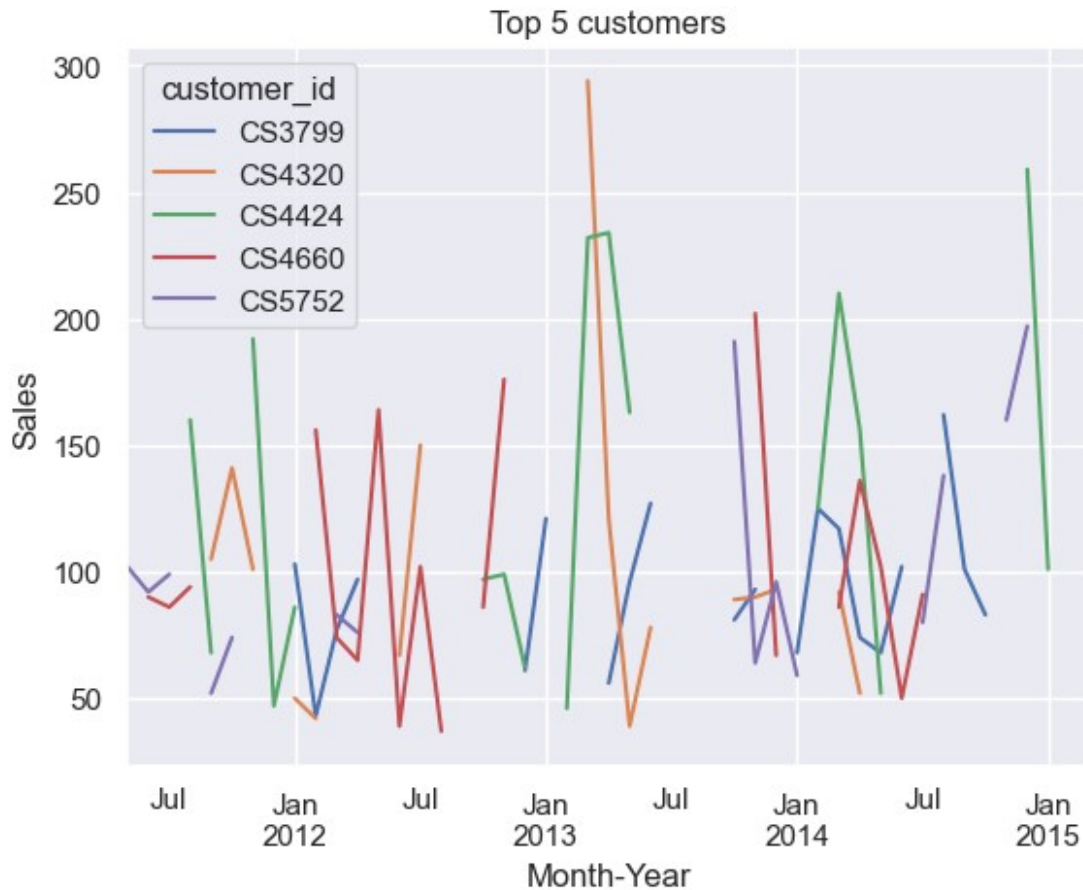


Analyzing top customers

```
# Top 5 customers
top_5_customers = monetary.sort_values(ascending=False).head(5).index

# Filter transactions of top 5 customers
top_customers_df = df[df['customer_id'].isin(top_5_customers)]

# Plot their monthly sales
top_customers_sales = top_customers_df.groupby(['customer_id',
'month_year'])['tran_amount'].sum().unstack(level=0)
top_customers_sales.plot(kind='line')
plt.xlabel('Month-Year')
plt.ylabel('Sales')
plt.title('Top 5 customers')
plt.savefig('line_plot1.png')
plt.show()
```



```
df.to_csv('Main_data.csv')
rfm.to_csv('Additional_analysis.csv')
# This command will use to insert the graphs into excel workbook

from openpyxl import load_workbook
from openpyxl.drawing.image import Image

# Load Excel file
workbook = load_workbook('Data.xlsx')
sheet = workbook.active

# Insert image
img = Image('line_plot1.png')
sheet.add_image(img, 'A1')

# Save the workbook
workbook.save('your_excel_file_with_plot.xlsx')
```