```
Import Libraries
```

```
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from datetime import datetime
Load the Data
# Load the dataset
data = pd.read_csv('Customers.csv')
# Display the first few rows of the dataset
print(data.head())
₹
      CustomerID
                         CustomerName
                                               Region
                                                       SignupDate
            C0001
                     Lawrence Carroll
                                       South America
                                                       2022-07-10
            C0002
                                                       2022-02-13
                       Elizabeth Lutz
                                                Asia
    1
            C0003
    2
                       Michael Rivera
                                       South America
                                                       2024-03-07
    3
            C0004
                   Kathleen Rodriguez
                                       South America
                                                       2022-10-09
            C0005
                          Laura Weber
                                                       2022-08-15
                                                 Asia
Data Overview
Data Preprocessing
# Get basic information about the dataset
print(data.info())
# Check for missing values
print(data.isnull().sum())
# Summary statistics
print(data.describe())
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 200 entries, 0 to 199
    Data columns (total 4 columns):
                        Non-Null Count Dtype
     #
         Column
     0
         CustomerID
                        200 non-null
                                        object
                        200 non-null
                                        object
         CustomerName
     1
                        200 non-null
         Region
                                        object
         SignupDate
                        200 non-null
                                        object
    dtypes: object(4)
    memory usage: 6.4+ KB
    None
    CustomerID
                     0
    CustomerName
    Region
                     0
    SignupDate
    dtype: int64
            CustomerID
                            CustomerName
                                                          SignupDate
                                                  Region
    count
                   200
                                     200
                                                     200
                                                                 200
                   200
                                     200
                                                       4
                                                                 179
    unique
                 C0001
                        Lawrence Carroll
                                          South America
                                                          2024-11-11
    top
    freq
                     1
                                       1
                                                      59
# Get basic information about the dataset
print(data.info())
# Check for missing values
print(data.isnull().sum())
# Summary statistics
print(data.describe())
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 200 entries, 0 to 199
    Data columns (total 4 columns):
                        Non-Null Count Dtype
     #
         Column
```

CustomerID

200 non-null

object

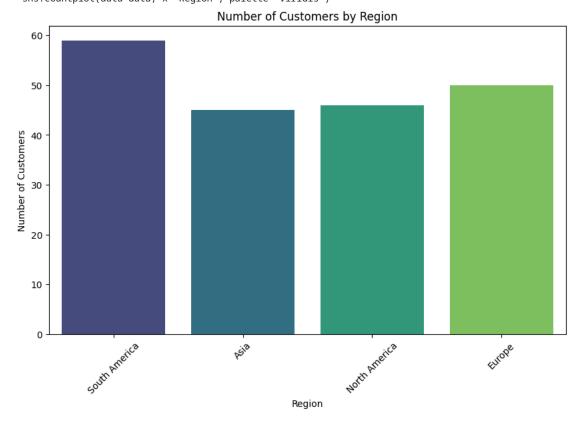
```
200 non-null
                                         object
          CustomerName
          Region
                        200 non-null
                                         object
          SignupDate
     3
                                         object
                        200 non-null
     dtypes: object(4)
     memory usage: 6.4+ KB
     None
     CustomerID
                     0
     {\tt CustomerName}
                     0
     Region
                     0
                     0
     SignupDate
     dtype: int64
            CustomerID
                             CustomerName
                                                   Region
                                                           SignupDate
     count
                   200
                                      200
                                                      200
                                                                  200
                   200
                                      200
                                                        4
                                                                  179
     unique
                 C0001
     top
                        Lawrence Carroll
                                           South America
                                                           2024-11-11
     freq
                                                       59
                                                                    3
# Convert SignupDate to datetime format
data['SignupDate'] = pd.to_datetime(data['SignupDate'])
# Extract year and month from SignupDate for further analysis
data['SignupYear'] = data['SignupDate'].dt.year
data['SignupMonth'] = data['SignupDate'].dt.month
```

## **Exploratory Data Analysis**

```
plt.figure(figsize=(10, 6))
sns.countplot(data=data, x='Region', palette='viridis')
plt.title('Number of Customers by Region')
plt.xlabel('Region')
plt.ylabel('Number of Customers')
plt.xticks(rotation=45)
plt.show()
```

→ <ipython-input-6-c8e52b4b8882>:2: FutureWarning:

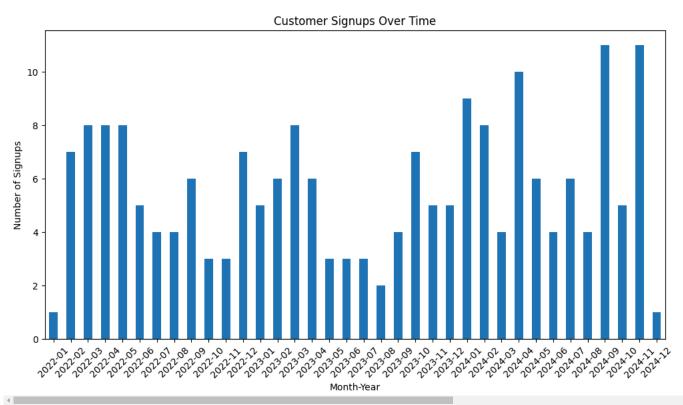
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and sns.countplot(data=data, x='Region', palette='viridis')



**Customers Over Time** 

```
plt.figure(figsize=(12, 6))
data['SignupDate'].dt.to_period('M').value_counts().sort_index().plot(kind='bar')
plt.title('Customer Signups Over Time')
plt.xlabel('Month-Year')
plt.ylabel('Number of Signups')
plt.xticks(rotation=45)
plt.show()
```



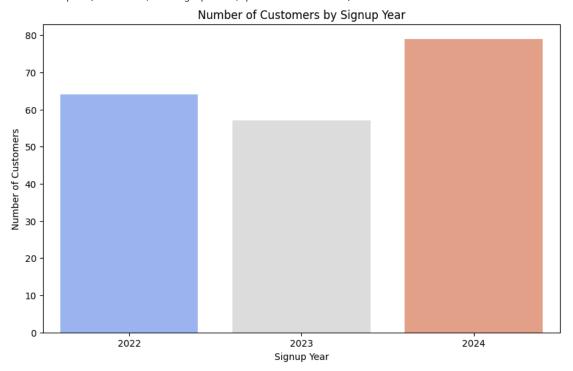


## Customers by Signup Year

```
plt.figure(figsize=(10, 6))
sns.countplot(data=data, x='SignupYear', palette='coolwarm')
plt.title('Number of Customers by Signup Year')
plt.xlabel('Signup Year')
plt.ylabel('Number of Customers')
plt.show()
```

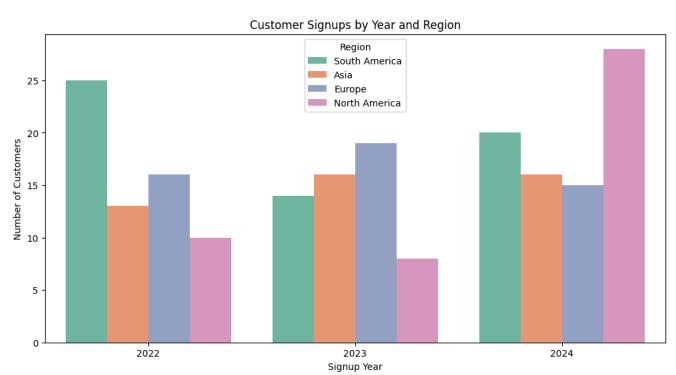
<ipython-input-8-1de7d37a130e>:2: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and sns.countplot(data=data, x='SignupYear', palette='coolwarm')



## Signup Trends by Region

```
plt.figure(figsize=(12, 6))
sns.countplot(data=data, x='SignupYear', hue='Region', palette='Set2')
plt.title('Customer Signups by Year and Region')
plt.xlabel('Signup Year')
plt.ylabel('Number of Customers')
plt.legend(title='Region')
plt.show()
```



```
# 1. Pie Chart of Customers by Region
plt.figure(figsize=(8, 8))
region_counts = data['Region'].value_counts()
plt.pie(region_counts, labels=region_counts.index, autopct='%1.1f%%', startangle=140)
plt.title('Proportion of Customers by Region')
plt.axis('equal')  # Equal aspect ratio ensures that pie is drawn as a circle.
plt.show()
```

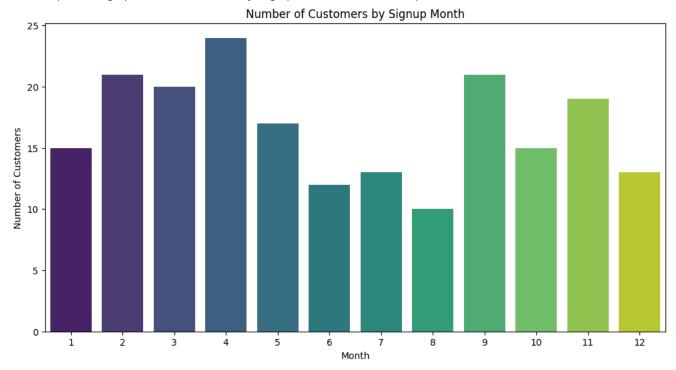


## Proportion of Customers by Region Asia 22.5% North America 29.5% South America Europe

```
# 2. Bar Plot of Customers by Signup Month
plt.figure(figsize=(12, 6))
signup_month_counts = data['SignupMonth'].value_counts().sort_index()
sns.barplot(x=signup_month_counts.index, y=signup_month_counts.values, palette='viridis')
plt.title('Number of Customers by Signup Month')
plt.xlabel('Month')
plt.ylabel('Number of Customers')
plt.show()
```

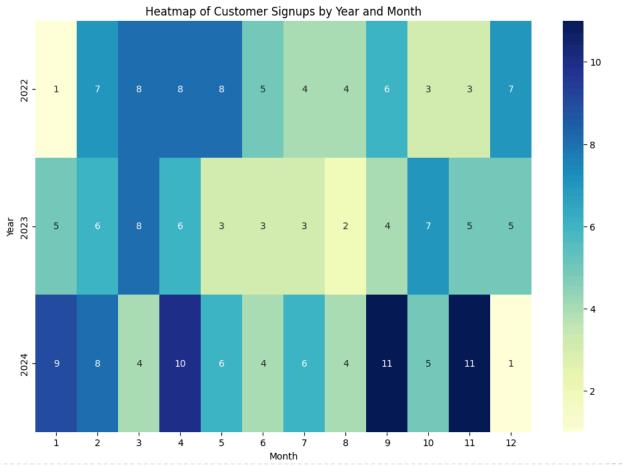
→ <ipython-input-12-a0886d74dfee>:4: FutureWarning:

Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and sns.barplot(x=signup\_month\_counts.index, y=signup\_month\_counts.values, palette='viridis')



```
# 3. Heatmap of Customer Signups by Year and Month
signup_counts = data.groupby(['SignupYear', 'SignupMonth']).size().unstack(fill_value=0)
plt.figure(figsize=(12, 8))
sns.heatmap(signup_counts, cmap='YlGnBu', annot=True, fmt='d')
plt.title('Heatmap of Customer Signups by Year and Month')
plt.xlabel('Month')
plt.ylabel('Year')
plt.ylabel('Year')
plt.xticks(ticks=np.arange(12) + 0.5, labels=['Jan', 'Feb', 'Mar', 'Apr', 'May', 'Jun', 'Jul', 'Aug', 'Sep', 'Oct', 'Nov', 'Dec'
plt.show()
```

NameError: name 'np' is not defined



```
Next steps: Explain error
```

```
# 4. Box Plot of Signup Dates
plt.figure(figsize=(12, 6))
sns.boxplot(data=data, x='SignupYear', y='SignupDate', palette='Set2')
plt.title('Box Plot of Signup Dates by Year')
plt.xlabel('Signup Year')
plt.ylabel('Signup Date')
plt.xticks(rotation=45)
plt.show()
```

<ipython-input-14-a2b58b17c844>:3: FutureWarning:

Descine 'holotto' without seciening 'hus' is depressed and will be removed in v@ 14 @ Assign the 'v' variable to 'hus' and