

```

import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

df_transaction=pd.read_csv('Transactions.csv')
df_Products=pd.read_csv('Products.csv')
df_Customers=pd.read_csv('Customers.csv')

print(f"Shape of df_transaction : {df_transaction.shape}")
print(f"Shape of df_Products: {df_Products.shape}")
print(f"Shape of df_Customers : {df_Customers.shape}")

Shape of df_transaction : (1000, 7)
Shape of df_Products: (100, 4)
Shape of df_Customers : (200, 4)

print(f"Null values in df_transaction :
{df_transaction.isnull().sum()}")
print(f"Null values in df_Products: {df_Products.isnull().sum()}")
print(f"Null values in df_Customers : {df_Customers.isnull().sum()}")

Null values in df_transaction : TransactionID      0
CustomerID      0
ProductID      0
TransactionDate  0
Quantity      0
TotalValue     0
Price          0
dtype: int64
Null values in df_Products: ProductID      0
ProductName     0
Category        0
Price           0
dtype: int64
Null values in df_Customers : CustomerID      0
CustomerName    0
Region          0
SignupDate     0
dtype: int64

print(f"Null values in df_transaction :
{df_transaction.duplicated().sum()}")
print(f"Null values in df_Products: {df_Products.duplicated().sum()}")
print(f"Null values in df_Customers :
{df_Customers.duplicated().sum()}")

Null values in df_transaction : 0
Null values in df_Products: 0
Null values in df_Customers : 0

```

```
df_transaction.head(3)
```

| | TransactionID | CustomerID | ProductID | TransactionDate | Quantity | \ |
|---|---------------|------------|-----------|---------------------|----------|---|
| 0 | T00001 | C0199 | P067 | 2024-08-25 12:38:23 | 1 | |
| 1 | T00112 | C0146 | P067 | 2024-05-27 22:23:54 | 1 | |
| 2 | T00166 | C0127 | P067 | 2024-04-25 07:38:55 | 1 | |

| | TotalValue | Price |
|---|------------|--------|
| 0 | 300.68 | 300.68 |
| 1 | 300.68 | 300.68 |
| 2 | 300.68 | 300.68 |

```
df_Customers.head(3)
```

| | CustomerID | CustomerName | Region | SignupDate |
|---|------------|------------------|---------------|------------|
| 0 | C0001 | Lawrence Carroll | South America | 2022-07-10 |
| 1 | C0002 | Elizabeth Lutz | Asia | 2022-02-13 |
| 2 | C0003 | Michael Rivera | South America | 2024-03-07 |

```
df_Products.head(3)
```

| | ProductID | ProductName | Category | Price |
|---|-----------|-------------------------|-------------|--------|
| 0 | P001 | ActiveWear Biography | Books | 169.30 |
| 1 | P002 | ActiveWear Smartwatch | Electronics | 346.30 |
| 2 | P003 | ComfortLiving Biography | Books | 44.12 |

```
Transactions_with_Customers = df_transaction.merge(df_Customers,
on='CustomerID', how='left')
Merged_data = Transactions_with_Customers.merge(df_Products,
on='ProductID', how='left')
```

```
Merged_data
```

| | TransactionID | CustomerID | ProductID | TransactionDate | Quantity |
|-----|---------------|------------|-----------|---------------------|----------|
| 0 | T00001 | C0199 | P067 | 2024-08-25 12:38:23 | 1 |
| 1 | T00112 | C0146 | P067 | 2024-05-27 22:23:54 | 1 |
| 2 | T00166 | C0127 | P067 | 2024-04-25 07:38:55 | 1 |
| 3 | T00272 | C0087 | P067 | 2024-03-26 22:55:37 | 2 |
| 4 | T00363 | C0070 | P067 | 2024-03-21 15:10:10 | 3 |
| .. | ... | ... | ... | ... | ... |
| 995 | T00496 | C0118 | P037 | 2024-10-24 08:30:27 | 1 |
| 996 | T00759 | C0059 | P037 | 2024-06-04 02:15:24 | 3 |
| 997 | T00922 | C0018 | P037 | 2024-04-05 13:05:32 | 4 |

| | | | | | |
|-----|--------|-------|------|---------------------|---|
| 998 | T00959 | C0115 | P037 | 2024-09-29 10:16:02 | 2 |
| 999 | T00992 | C0024 | P037 | 2024-04-21 10:52:24 | 1 |

| | TotalValue | Price_x | CustomerName | Region | |
|--------------|------------|---------|----------------------|---------------|------------|
| SignupDate \ | | | | | |
| 0 | 300.68 | 300.68 | Andrea Jenkins | Europe | 2022-12-03 |
| 1 | 300.68 | 300.68 | Brittany Harvey | Asia | 2024-09-04 |
| 2 | 300.68 | 300.68 | Kathryn Stevens | Europe | 2024-04-04 |
| 3 | 601.36 | 300.68 | Travis Campbell | South America | 2024-04-11 |
| 4 | 902.04 | 300.68 | Timothy Perez | Europe | 2022-03-15 |
| .. | ... | ... | ... | ... | |
| ... | | | | | |
| 995 | 459.86 | 459.86 | Jacob Holt | South America | 2022-01-22 |
| 996 | 1379.58 | 459.86 | Mrs. Kimberly Wright | North America | 2024-04-07 |
| 997 | 1839.44 | 459.86 | Tyler Haynes | North America | 2024-09-21 |
| 998 | 919.72 | 459.86 | Joshua Hamilton | Asia | 2024-11-11 |
| 999 | 459.86 | 459.86 | Michele Cooley | North America | 2024-02-05 |

| | ProductName | Category | Price_y |
|-----|---------------------------------|-------------|---------|
| 0 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 1 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 2 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 3 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 4 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| .. | ... | ... | ... |
| 995 | SoundWave Smartwatch | Electronics | 459.86 |
| 996 | SoundWave Smartwatch | Electronics | 459.86 |
| 997 | SoundWave Smartwatch | Electronics | 459.86 |
| 998 | SoundWave Smartwatch | Electronics | 459.86 |
| 999 | SoundWave Smartwatch | Electronics | 459.86 |

[1000 rows x 13 columns]

Merged_data.isnull().sum()

| | |
|---------------|---|
| TransactionID | 0 |
| CustomerID | 0 |

```
ProductID      0
TransactionDate 0
Quantity        0
TotalValue      0
Price_x         0
CustomerName    0
Region          0
SignupDate      0
ProductName      0
Category        0
Price_y         0
dtype: int64
```

```
Merged_data.describe()
```

| | Quantity | TotalValue | Price_x | Price_y |
|-------|-------------|-------------|-------------|-------------|
| count | 1000.000000 | 1000.000000 | 1000.000000 | 1000.000000 |
| mean | 2.537000 | 689.995560 | 272.55407 | 272.55407 |
| std | 1.117981 | 493.144478 | 140.73639 | 140.73639 |
| min | 1.000000 | 16.080000 | 16.08000 | 16.08000 |
| 25% | 2.000000 | 295.295000 | 147.95000 | 147.95000 |
| 50% | 3.000000 | 588.880000 | 299.93000 | 299.93000 |
| 75% | 4.000000 | 1011.660000 | 404.40000 | 404.40000 |
| max | 4.000000 | 1991.040000 | 497.76000 | 497.76000 |

```
Merged_data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 1000 entries, 0 to 999
```

```
Data columns (total 13 columns):
```

| # | Column | Non-Null Count | Dtype |
|----|-----------------|----------------|---------|
| 0 | TransactionID | 1000 non-null | object |
| 1 | CustomerID | 1000 non-null | object |
| 2 | ProductID | 1000 non-null | object |
| 3 | TransactionDate | 1000 non-null | object |
| 4 | Quantity | 1000 non-null | int64 |
| 5 | TotalValue | 1000 non-null | float64 |
| 6 | Price_x | 1000 non-null | float64 |
| 7 | CustomerName | 1000 non-null | object |
| 8 | Region | 1000 non-null | object |
| 9 | SignupDate | 1000 non-null | object |
| 10 | ProductName | 1000 non-null | object |
| 11 | Category | 1000 non-null | object |
| 12 | Price_y | 1000 non-null | float64 |

```
dtypes: float64(3), int64(1), object(9)
```

```
memory usage: 101.7+ KB
```

```
Merged_data.head(3)
```

| | TransactionID | CustomerID | ProductID | TransactionDate | Quantity | \ |
|---|---------------|------------|-----------|---------------------|----------|---|
| 0 | T00001 | C0199 | P067 | 2024-08-25 12:38:23 | 1 | |
| 1 | T00112 | C0146 | P067 | 2024-05-27 22:23:54 | 1 | |
| 2 | T00166 | C0127 | P067 | 2024-04-25 07:38:55 | 1 | |

| | TotalValue | Price_x | CustomerName | Region | SignupDate | \ |
|---|------------|---------|-----------------|--------|------------|---|
| 0 | 300.68 | 300.68 | Andrea Jenkins | Europe | 2022-12-03 | |
| 1 | 300.68 | 300.68 | Brittany Harvey | Asia | 2024-09-04 | |
| 2 | 300.68 | 300.68 | Kathryn Stevens | Europe | 2024-04-04 | |

| | ProductName | Category | Price_y |
|---|---------------------------------|-------------|---------|
| 0 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 1 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |
| 2 | ComfortLiving Bluetooth Speaker | Electronics | 300.68 |

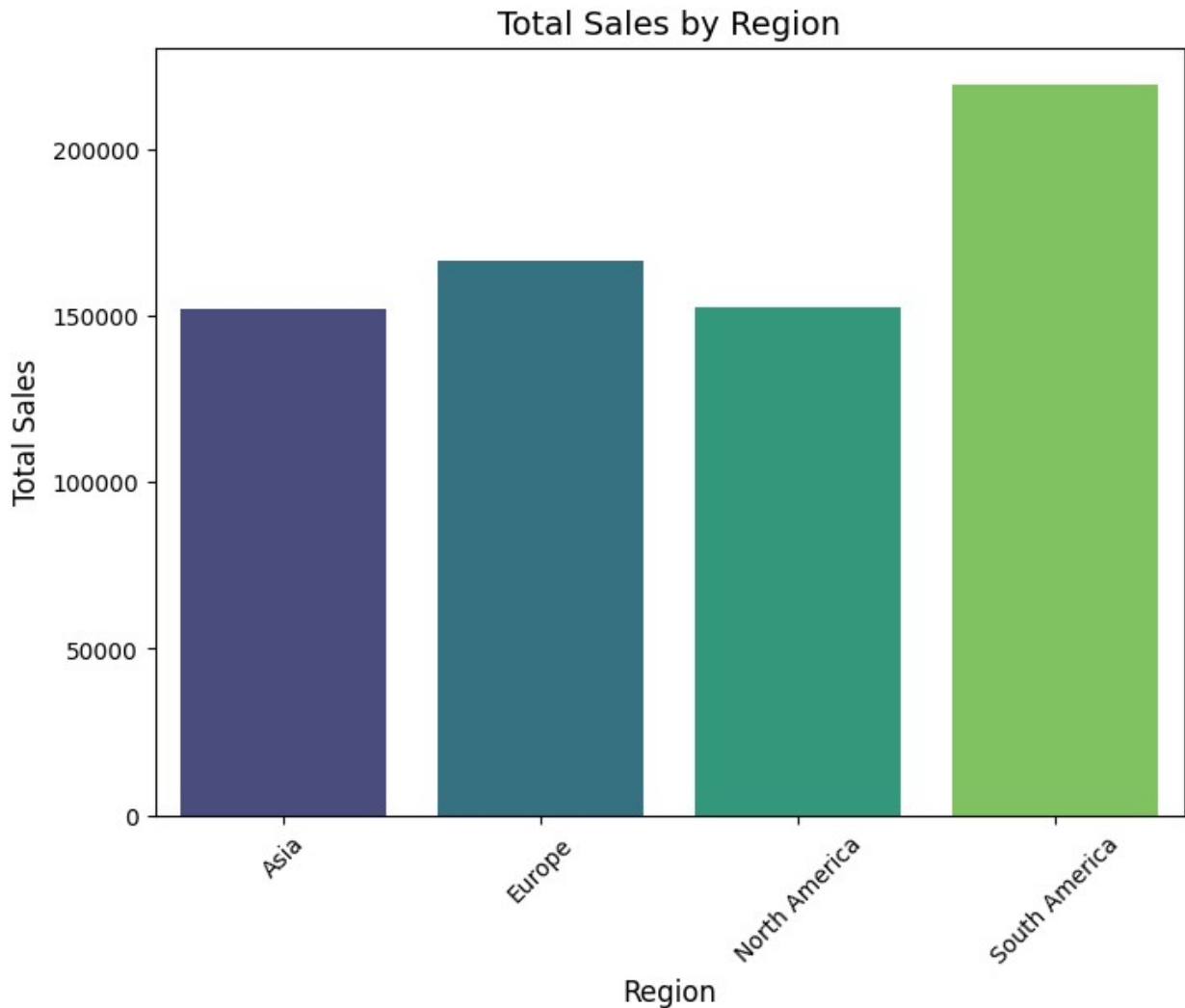
```
sales_by_region = Merged_data.groupby("Region")
["TotalValue"].sum().reset_index()
```

```
plt.figure(figsize=(8, 6))
sns.barplot(data=sales_by_region, x="Region", y="TotalValue",
palette="viridis")
plt.title("Total Sales by Region", fontsize=14)
plt.xlabel("Region", fontsize=12)
plt.ylabel("Total Sales", fontsize=12)
plt.xticks(rotation=45)
plt.show()
```

C:\Users\hp\AppData\Local\Temp\ipykernel_4788\2835220877.py:4:
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(data=sales_by_region, x="Region", y="TotalValue",
palette="viridis")
```



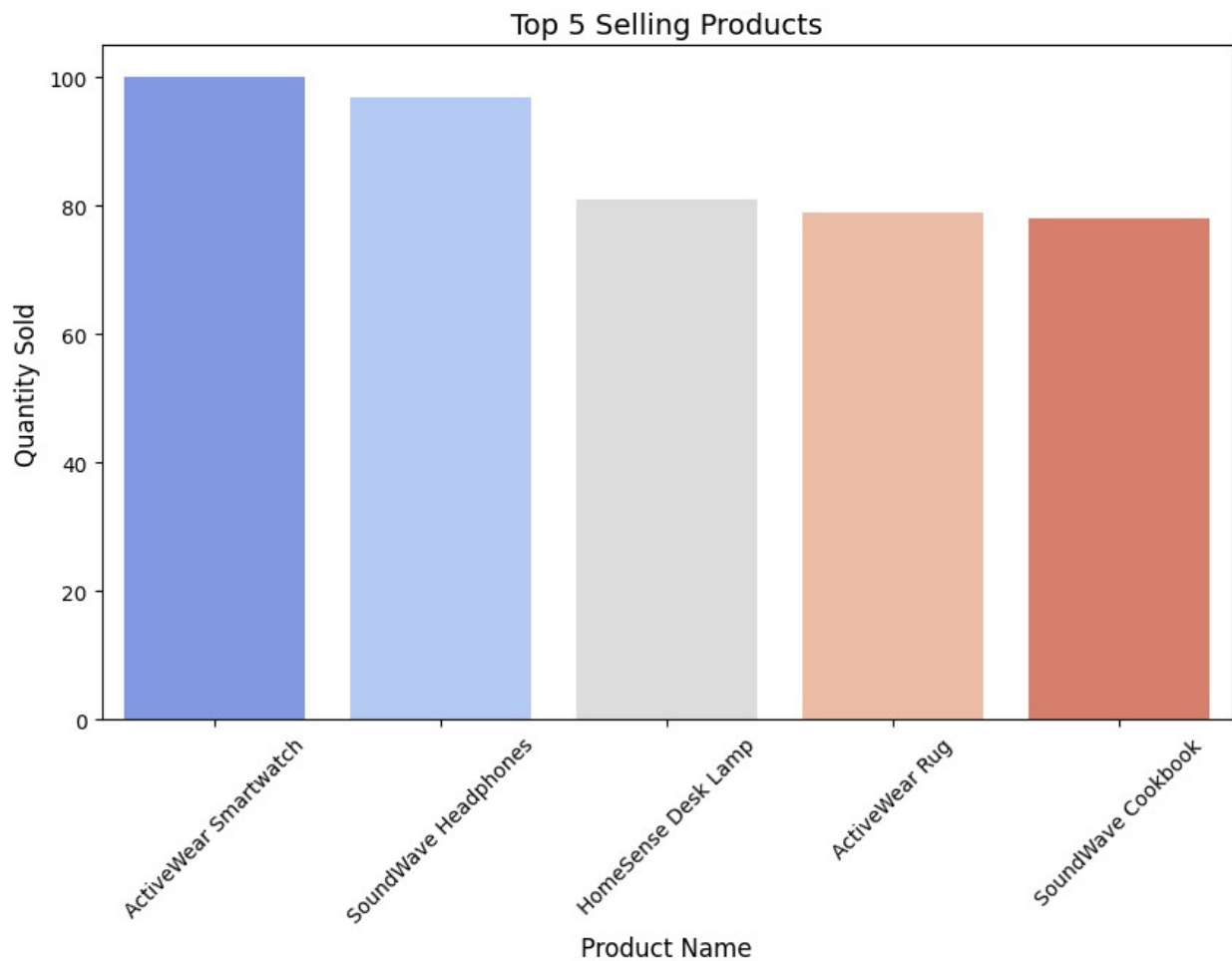
```
top_products = Merged_data.groupby("ProductName")
["Quantity"].sum().sort_values(ascending=False).head(5).reset_index()

plt.figure(figsize=(10, 6))
sns.barplot(data=top_products, x="ProductName", y="Quantity",
palette="coolwarm")
plt.title("Top 5 Selling Products", fontsize=14)
plt.xlabel("Product Name", fontsize=12)
plt.ylabel("Quantity Sold", fontsize=12)
plt.xticks(rotation=45)
plt.show()
```

C:\Users\hp\AppData\Local\Temp\ipykernel_4788\799798849.py:4:
FutureWarning:

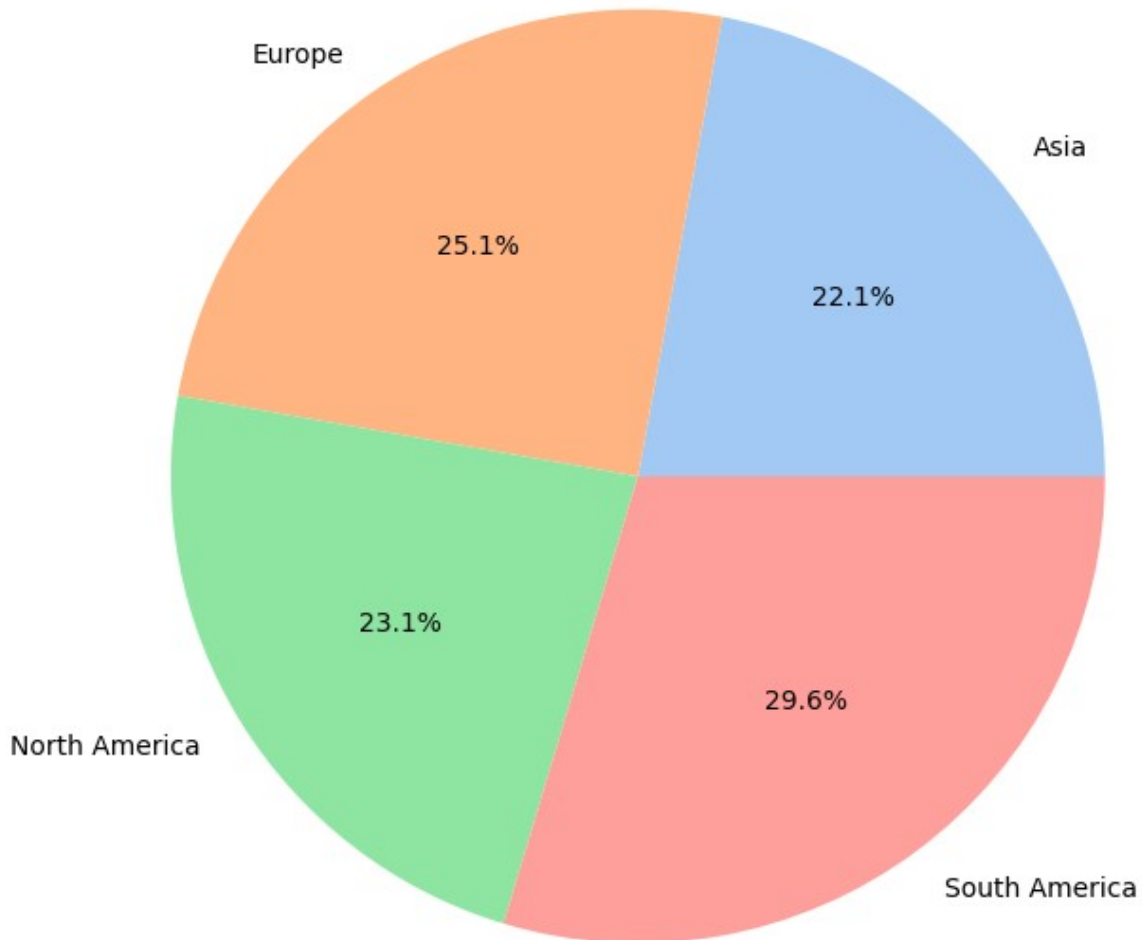
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

```
sns.barplot(data=top_products, x="ProductName", y="Quantity",  
palette="coolwarm")
```



```
customers_by_region = Merged_data.groupby("Region")  
["CustomerID"].nunique().reset_index()  
  
plt.figure(figsize=(8, 8))  
plt.pie(customers_by_region["CustomerID"],  
labels=customers_by_region["Region"], autopct='%1.1f%%',  
colors=sns.color_palette("pastel"))  
plt.title("Customer Distribution by Region", fontsize=14)  
plt.show()
```

Customer Distribution by Region



```
Merged_data["SignupDate"] = pd.to_datetime(Merged_data["SignupDate"], errors="coerce")
```

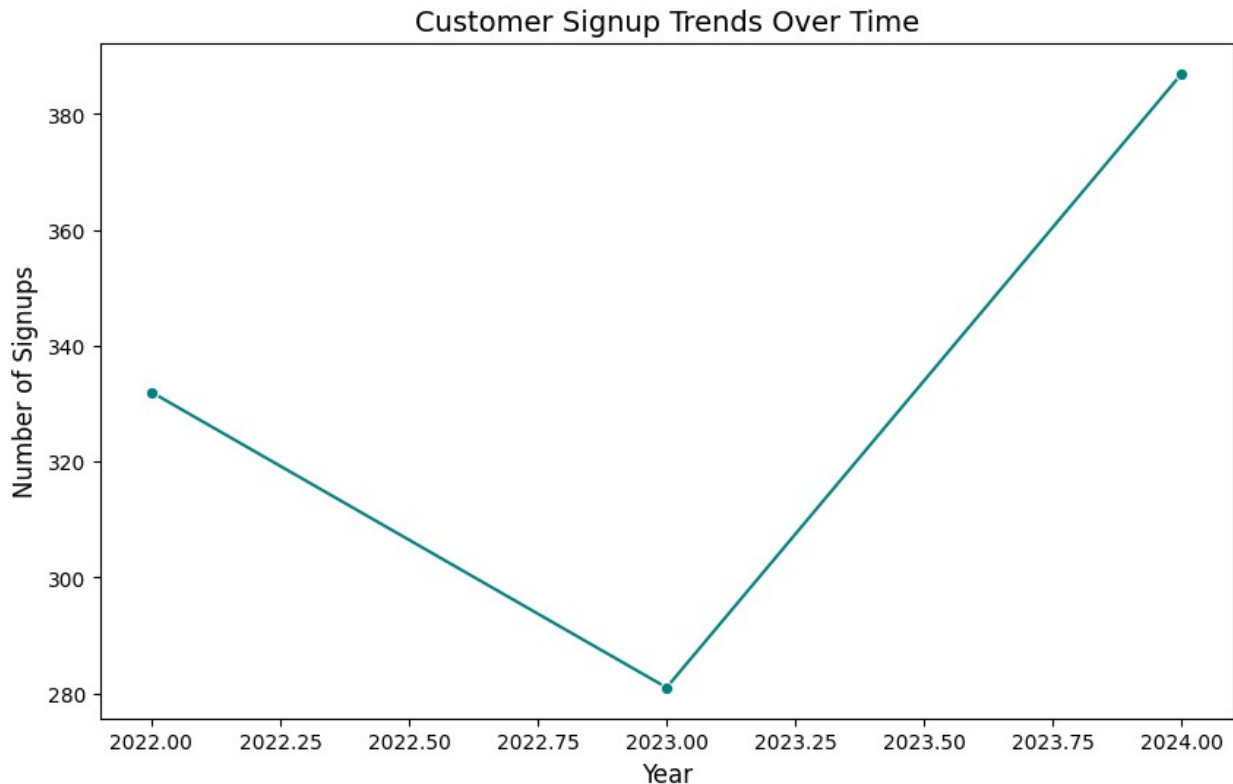
```
Merged_data["SignupYear"] = Merged_data["SignupDate"].dt.year
```

```
signup_trends =  
Merged_data["SignupYear"].value_counts().sort_index().reset_index()  
signup_trends.columns = ["Year", "Signups"]
```

```
plt.figure(figsize=(10, 6))  
sns.lineplot(data=signup_trends, x="Year", y="Signups", marker="o", color="teal")
```



```
plt.title("Customer Signup Trends Over Time", fontsize=14)
plt.xlabel("Year", fontsize=12)
plt.ylabel("Number of Signups", fontsize=12)
plt.show()
```

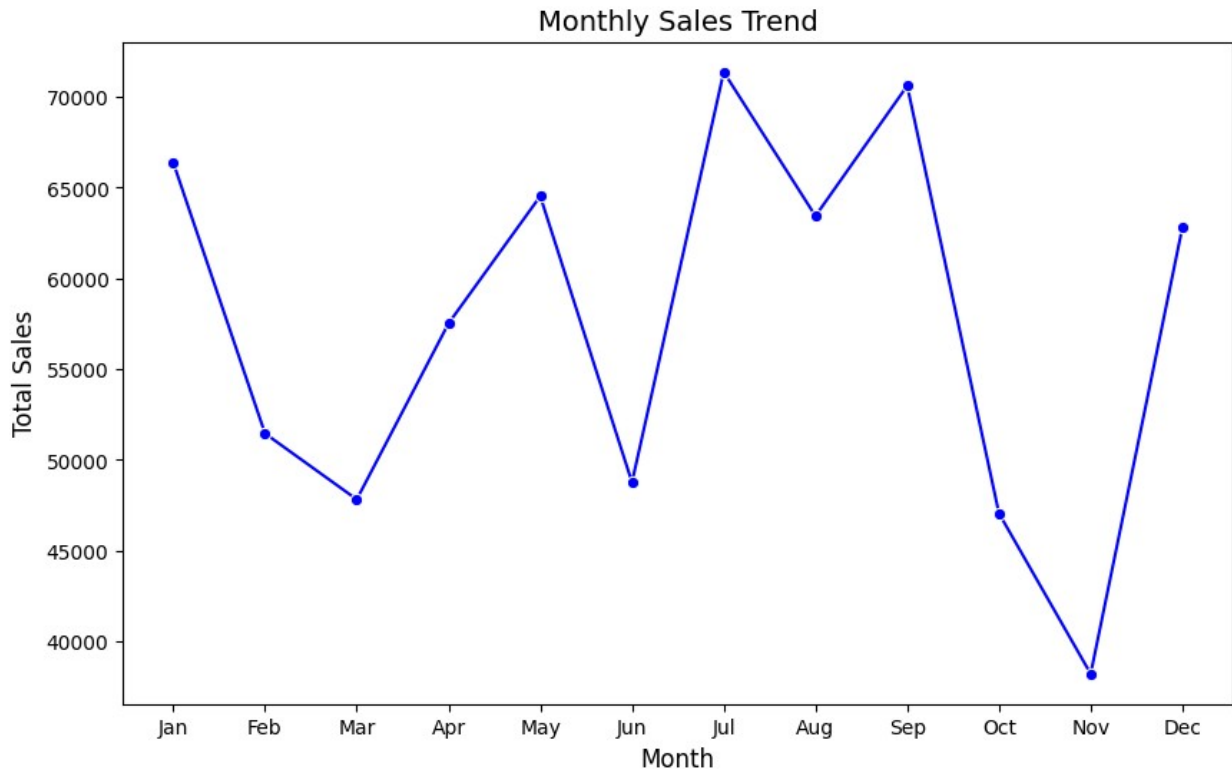


```
Merged_data["TransactionDate"] = pd.to_datetime(Merged_data["Transaction
Date"], errors="coerce")

Merged_data["TransactionMonth"] =
Merged_data["TransactionDate"].dt.month

monthly_sales = Merged_data.groupby("TransactionMonth")
["TotalValue"].sum().reset_index()

plt.figure(figsize=(10, 6))
sns.lineplot(data=monthly_sales, x="TransactionMonth", y="TotalValue",
marker="o", color="blue")
plt.title("Monthly Sales Trend", fontsize=14)
plt.xlabel("Month", fontsize=12)
plt.ylabel("Total Sales", fontsize=12)
plt.xticks(ticks=range(1, 13), labels=["Jan", "Feb", "Mar", "Apr",
"May", "Jun", "Jul", "Aug", "Sep", "Oct", "Nov", "Dec"])
plt.show()
```



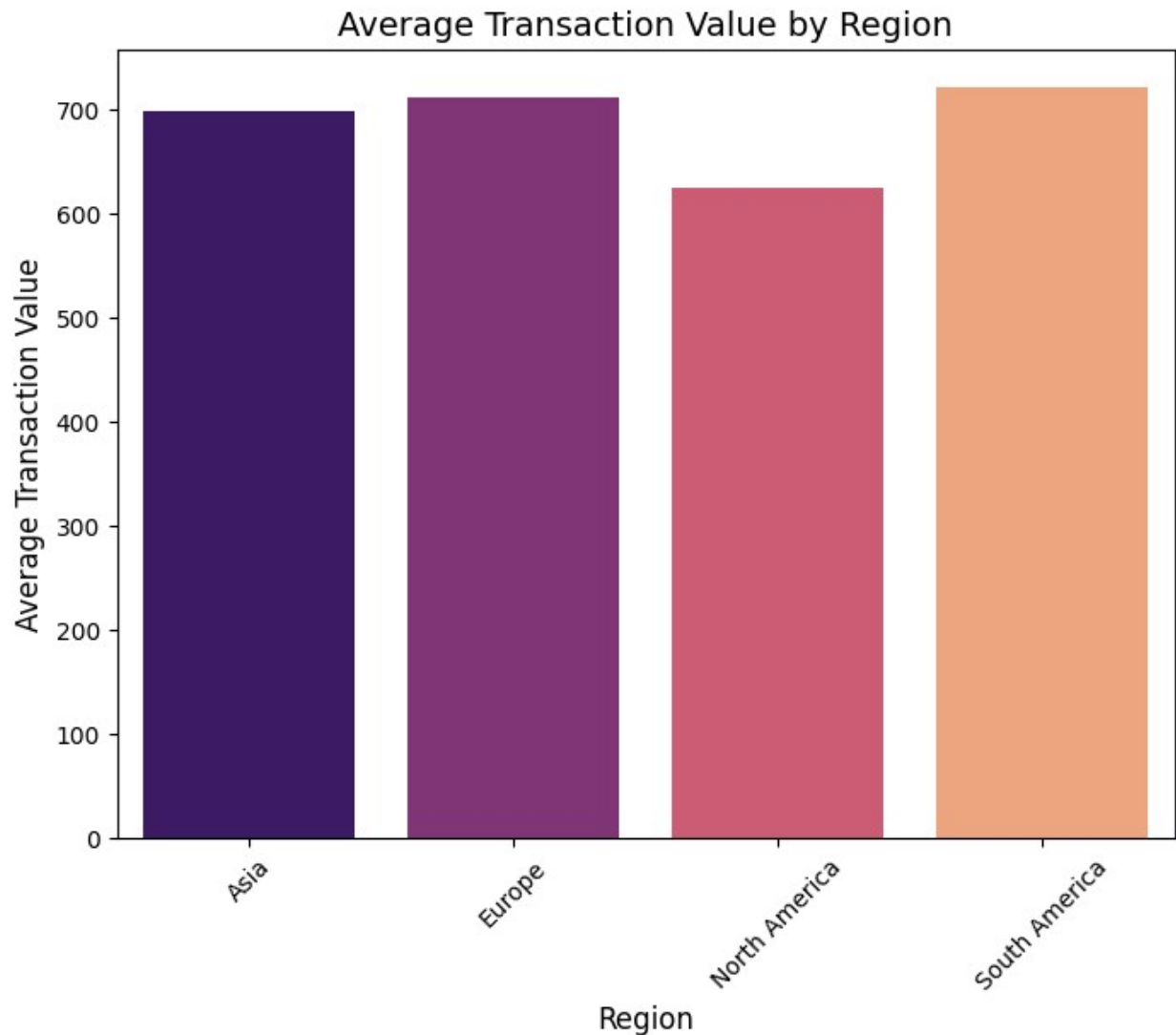
```
avg_transaction_by_region = Merged_data.groupby("Region")
["TotalValue"].mean().reset_index()

plt.figure(figsize=(8, 6))
sns.barplot(data=avg_transaction_by_region, x="Region",
y="TotalValue", palette="magma")
plt.title("Average Transaction Value by Region", fontsize=14)
plt.xlabel("Region", fontsize=12)
plt.ylabel("Average Transaction Value", fontsize=12)
plt.xticks(rotation=45)
plt.show()
```

C:\Users\hp\AppData\Local\Temp\ipykernel_4788\369699262.py:4:
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.

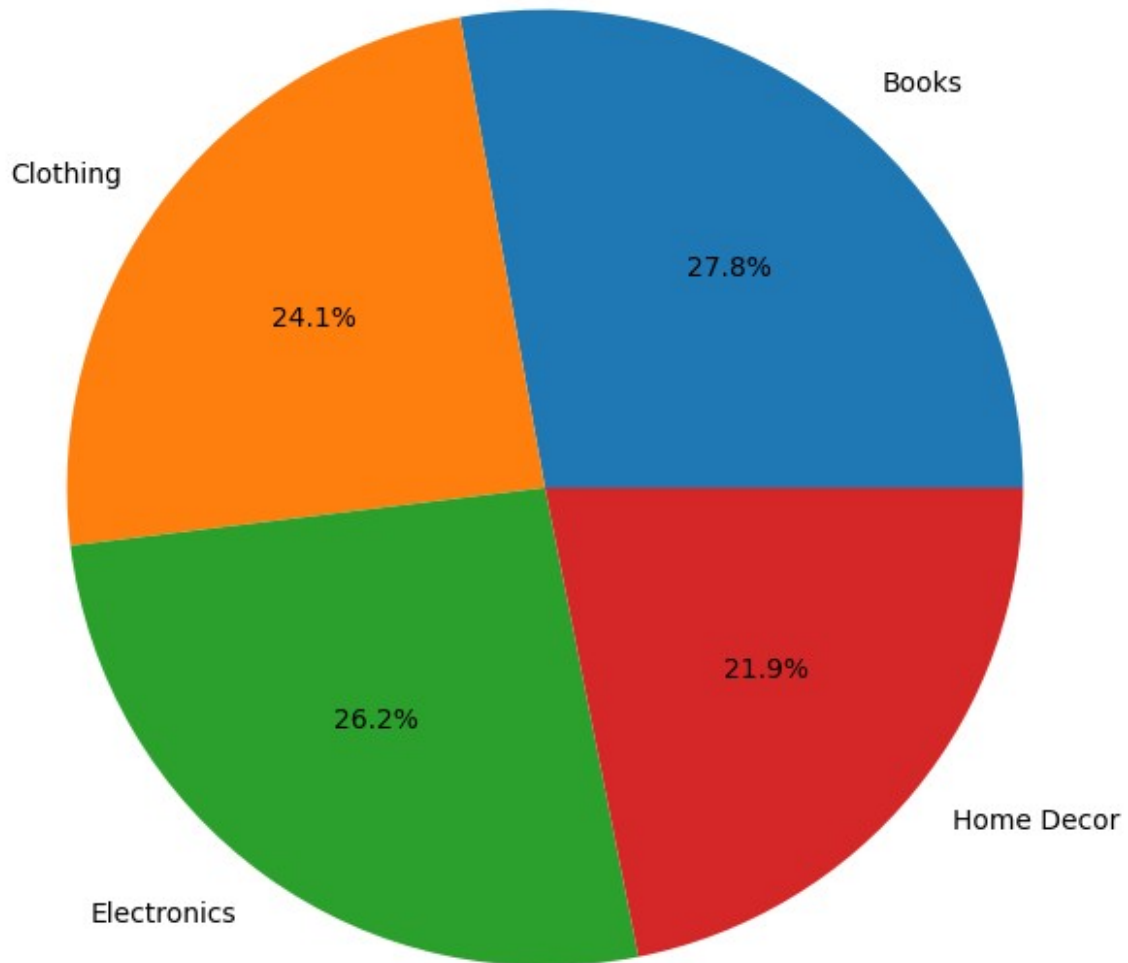
```
sns.barplot(data=avg_transaction_by_region, x="Region",
y="TotalValue", palette="magma")
```



```
sales_by_category = Merged_data.groupby("Category")
["TotalValue"].sum().reset_index()

plt.figure(figsize=(8, 8))
plt.pie(sales_by_category["TotalValue"],
labels=sales_by_category["Category"], autopct='%1.1f%%',
colors=sns.color_palette("tab10"))
plt.title("Product Category Contribution to Total Sales", fontsize=14)
plt.show()
```

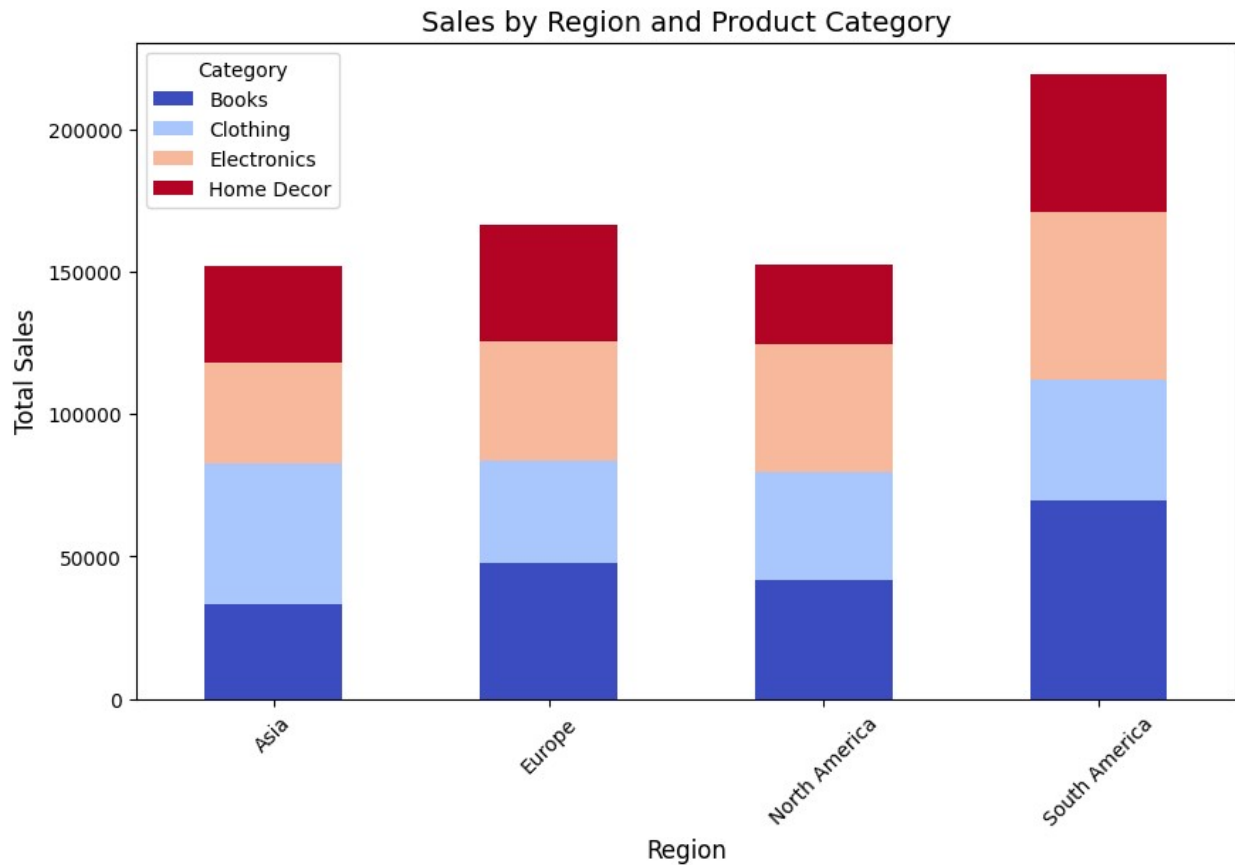
Product Category Contribution to Total Sales



```
category_region_sales = Merged_data.pivot_table(values="TotalValue",
index="Region", columns="Category", aggfunc="sum", fill_value=0)

category_region_sales.plot(kind="bar", stacked=True, figsize=(10, 6),
colormap="coolwarm")
plt.title("Sales by Region and Product Category", fontsize=14)
plt.xlabel("Region", fontsize=12)
plt.ylabel("Total Sales", fontsize=12)
plt.xticks(rotation=45)
```

```
plt.legend(title="Category")
plt.show()
```



```
Merged_data["TransactionDay"] =
Merged_data["TransactionDate"].dt.day_name()

transactions_by_day =
Merged_data["TransactionDay"].value_counts().reset_index()
transactions_by_day.columns = ["Day", "Transactions"]

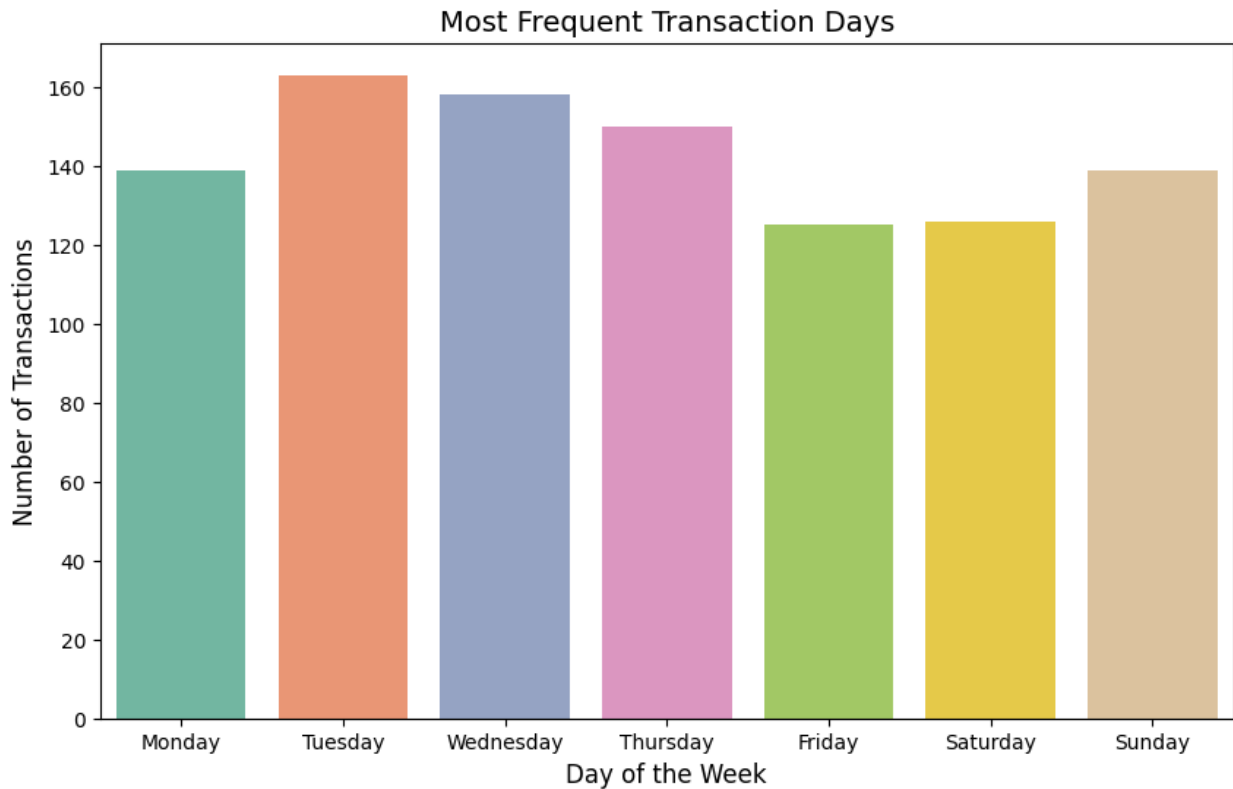
plt.figure(figsize=(10, 6))
sns.barplot(data=transactions_by_day, x="Day", y="Transactions",
palette="Set2", order=["Monday", "Tuesday", "Wednesday", "Thursday",
"Friday", "Saturday", "Sunday"])
plt.title("Most Frequent Transaction Days", fontsize=14)
plt.xlabel("Day of the Week", fontsize=12)
plt.ylabel("Number of Transactions", fontsize=12)
plt.show()
```

C:\Users\hp\AppData\Local\Temp\ipykernel_4788\1105637299.py:7:
FutureWarning:

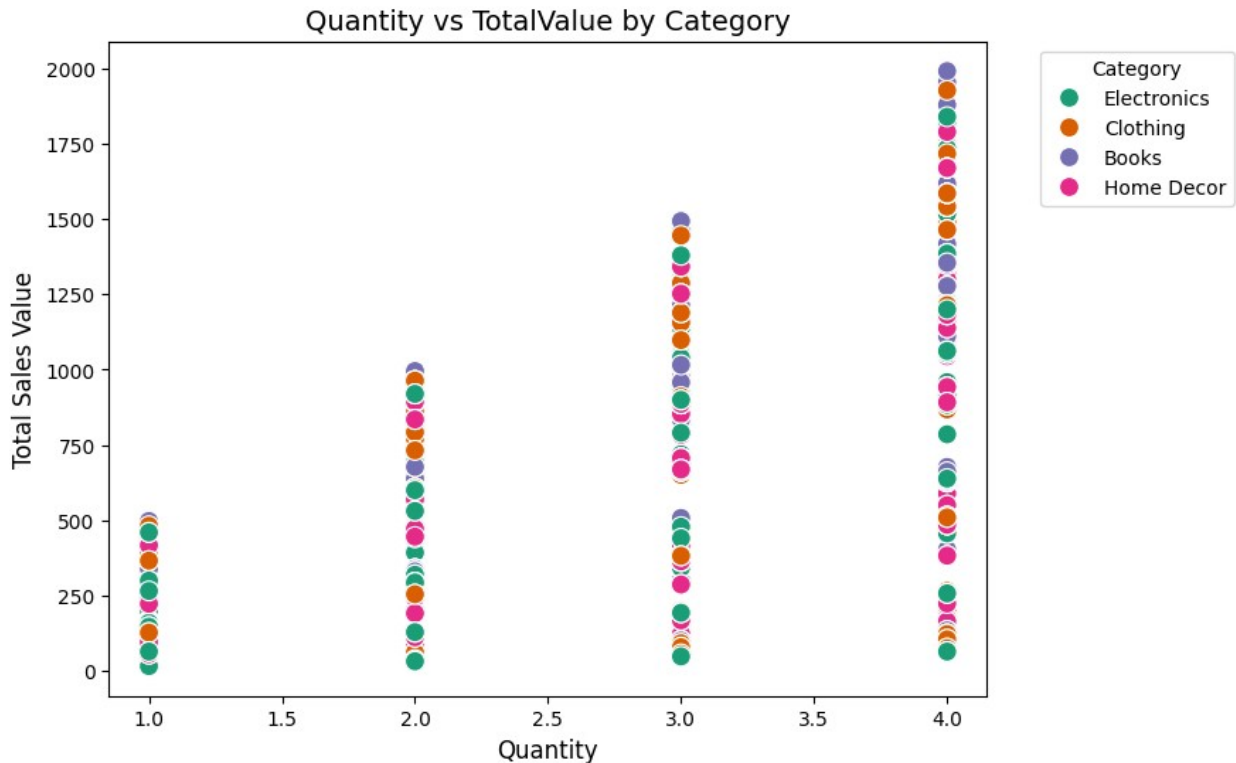
Passing `palette` without assigning `hue` is deprecated and will be

removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

```
sns.barplot(data=transactions_by_day, x="Day", y="Transactions",  
palette="Set2", order=["Monday", "Tuesday", "Wednesday", "Thursday",  
"Friday", "Saturday", "Sunday"])
```



```
plt.figure(figsize=(8, 6))  
sns.scatterplot(data=Merged_data, x="Quantity", y="TotalValue",  
hue="Category", palette="Dark2", s=100)  
plt.title("Quantity vs TotalValue by Category", fontsize=14)  
plt.xlabel("Quantity", fontsize=12)  
plt.ylabel("Total Sales Value", fontsize=12)  
plt.legend(title="Category", bbox_to_anchor=(1.05, 1), loc='upper  
left')  
plt.show()
```



```
Merged_data["SignupMonth"] = Merged_data["SignupDate"].dt.month
```

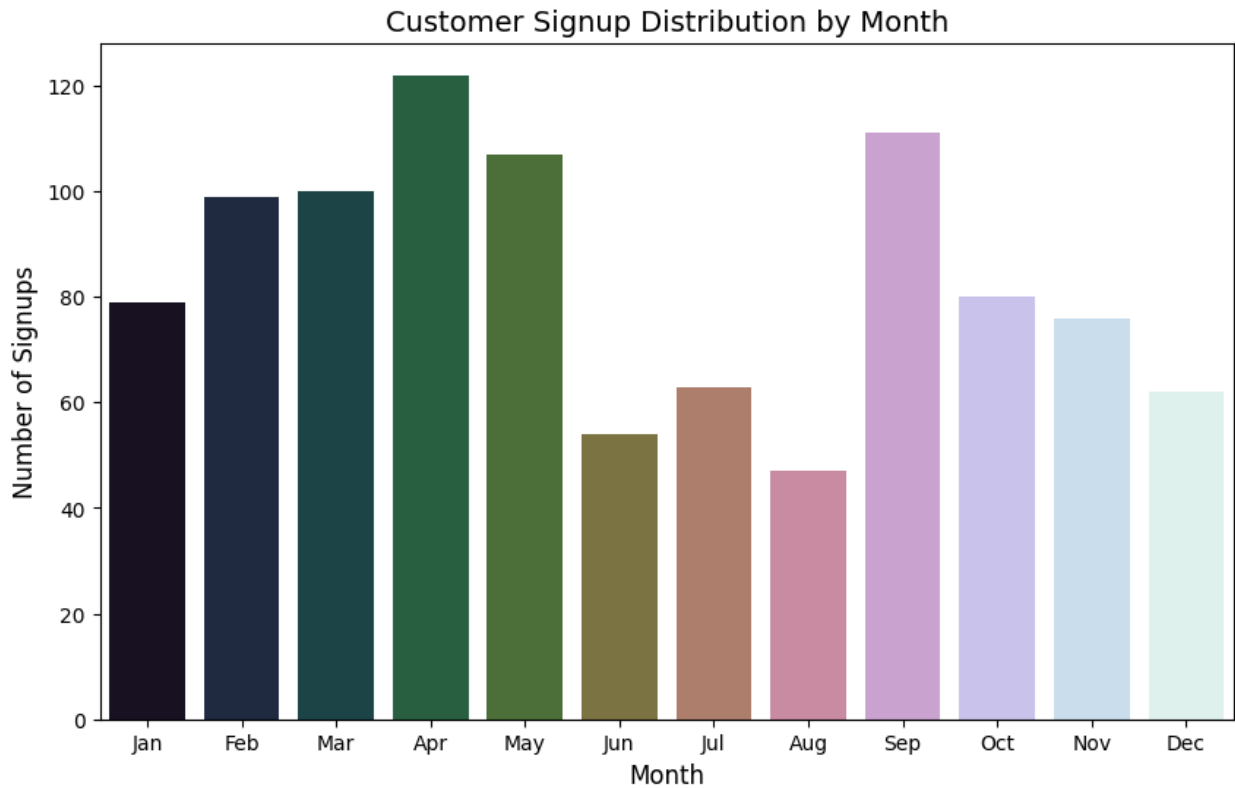
```
signups_by_month =
Merged_data["SignupMonth"].value_counts().sort_index().reset_index()
signups_by_month.columns = ["Month", "Signups"]
```

```
plt.figure(figsize=(10, 6))
sns.barplot(data=signups_by_month, x="Month", y="Signups",
palette="cubehelix")
plt.title("Customer Signup Distribution by Month", fontsize=14)
plt.xlabel("Month", fontsize=12)
plt.ylabel("Number of Signups", fontsize=12)
plt.xticks(ticks=range(12), labels=["Jan", "Feb", "Mar", "Apr", "May",
"Jun", "Jul", "Aug", "Sep", "Oct", "Nov", "Dec"])
plt.show()
```

C:\Users\hp\AppData\Local\Temp\ipykernel_4788\3026397383.py:7:
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(data=signups_by_month, x="Month", y="Signups",
palette="cubehelix")
```



```
heatmap_data = Merged_data.pivot_table(values="TotalValue",
index="Region", columns="Category", aggfunc="sum", fill_value=0)

plt.figure(figsize=(10, 6))
sns.heatmap(heatmap_data, annot=True, fmt=".2f", cmap="Blues")
plt.title("Heatmap of Sales by Region and Category", fontsize=14)
plt.xlabel("Product Category", fontsize=12)
plt.ylabel("Region", fontsize=12)
plt.show()
```