

In [56]:

```
import pandas as pd

df = pd.read_csv('customer_shopping_behavior.csv')
```

In [57]:

```
df.head()
```

Out[57]:

	Customer ID	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	Location	Size	Color	Season	Review Rating	Subscription Status	Shipping Type	Discount Applied	Promo Code Used	Previous Purchases	Payment Method	Frequency of Purchases
0	1	55	Male	Blouse	Clothing	53	Kentucky	L	Gray	Winter	3.1	Yes	Express	Yes	Yes	14	Venmo	Fortnightly
1	2	19	Male	Sweater	Clothing	64	Maine	L	Maroon	Winter	3.1	Yes	Express	Yes	Yes	2	Cash	Fortnightly
2	3	50	Male	Jeans	Clothing	73	Massachusetts	S	Maroon	Spring	3.1	Yes	Free Shipping	Yes	Yes	23	Credit Card	Weekly
3	4	21	Male	Sandals	Footwear	90	Rhode Island	M	Maroon	Spring	3.5	Yes	Next Day Air	Yes	Yes	49	PayPal	Weekly
4	5	45	Male	Blouse	Clothing	49	Oregon	M	Turquoise	Spring	2.7	Yes	Free Shipping	Yes	Yes	31	PayPal	Annually

In [58]:

```
df.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 3900 entries, 0 to 3899
Data columns (total 18 columns):
Column Non-Null Count Dtype
--- -
0 Customer ID 3900 non-null int64
1 Age 3900 non-null int64
2 Gender 3900 non-null object
3 Item Purchased 3900 non-null object
4 Category 3900 non-null object
5 Purchase Amount (USD) 3900 non-null int64
6 Location 3900 non-null object
7 Size 3900 non-null object
8 Color 3900 non-null object
9 Season 3900 non-null object
10 Review Rating 3863 non-null float64
11 Subscription Status 3900 non-null object
12 Shipping Type 3900 non-null object
13 Discount Applied 3900 non-null object
14 Promo Code Used 3900 non-null object
15 Previous Purchases 3900 non-null int64
16 Payment Method 3900 non-null object
17 Frequency of Purchases 3900 non-null object
dtypes: float64(1), int64(4), object(13)
memory usage: 548.6+ KB

In [59]:

```
df.describe(include='all')
```

Out[59]:

	Customer ID	Age	Gender	Item Purchased	Category	Purchase Amount (USD)	Location	Size	Color	Season	Review Rating	Subscription Status	Shipping Type	Discount Applied	Promo Code Used	Previous Purchases	Payment Method	Frequency of Purchases
count	3900.000000	3900.000000	3900	3900	3900	3900.000000	3900	3900	3900	3900	3863.000000	3900	3900	3900	3900	3900.000000	3900	3900
unique	NaN	NaN	2	25	4	NaN	50	4	25	4	NaN	2	6	2	2	NaN	6	7
top	NaN	NaN	Male	Blouse	Clothing	NaN	Montana	M	Olive	Spring	NaN	No	Free Shipping	No	No	NaN	PayPal	Every 3 Months
freq	NaN	NaN	2652	171	1737	NaN	96	1755	177	999	NaN	2847	675	2223	2223	NaN	677	584
mean	1950.500000	44.068462	NaN	NaN	NaN	59.764359	NaN	NaN	NaN	NaN	3.750065	NaN	NaN	NaN	NaN	25.351538	NaN	NaN
std	1125.977353	15.207589	NaN	NaN	NaN	23.685392	NaN	NaN	NaN	NaN	0.716983	NaN	NaN	NaN	NaN	14.447125	NaN	NaN
min	1.000000	18.000000	NaN	NaN	NaN	20.000000	NaN	NaN	NaN	NaN	2.500000	NaN	NaN	NaN	NaN	1.000000	NaN	NaN
25%	975.750000	31.000000	NaN	NaN	NaN	39.000000	NaN	NaN	NaN	NaN	3.100000	NaN	NaN	NaN	NaN	13.000000	NaN	NaN
50%	1950.500000	44.000000	NaN	NaN	NaN	60.000000	NaN	NaN	NaN	NaN	3.800000	NaN	NaN	NaN	NaN	25.000000	NaN	NaN
75%	2925.250000	57.000000	NaN	NaN	NaN	81.000000	NaN	NaN	NaN	NaN	4.400000	NaN	NaN	NaN	NaN	38.000000	NaN	NaN
max	3900.000000	70.000000	NaN	NaN	NaN	100.000000	NaN	NaN	NaN	NaN	5.000000	NaN	NaN	NaN	NaN	50.000000	NaN	NaN

In [60]:

```
df.isnull().sum()
```

Out[60]:

```
Customer ID      0
Age              0
Gender           0
Item Purchased   0
Category         0
Purchase Amount (USD)  0
Location         0
Size            0
Color           0
Season          0
Review Rating    37
Subscription Status  0
Shipping Type    0
Discount Applied  0
Promo Code Used  0
Previous Purchases  0
Payment Method   0
Frequency of Purchases  0
dtype: int64
```

In [61]:

```
df['Review Rating'] = df.groupby('Category')['Review Rating'].transform(lambda x: x.fillna(x.median()))
```

In [62]:

```
df.isnull().sum()
```

Out[62]: Customer ID 0
Age 0
Gender 0
Item Purchased 0
Category 0
Purchase Amount (USD) 0
Location 0
Size 0
Color 0
Season 0
Review Rating 0
Subscription Status 0
Shipping Type 0
Discount Applied 0
Promo Code Used 0
Previous Purchases 0
Payment Method 0
Frequency of Purchases 0
dtype: int64

In [63]: df.columns = df.columns.str.lower()
df.columns = df.columns.str.replace(' ', '_')
df = df.rename(columns={'purchase_amount_(usd)': 'purchase_amount'})

In [64]: df.columns

Out[64]: Index(['customer_id', 'age', 'gender', 'item_purchased', 'category',
'purchase_amount', 'location', 'size', 'color', 'season',
'review_rating', 'subscription_status', 'shipping_type',
'discount_applied', 'promo_code_used', 'previous_purchases',
'payment_method', 'frequency_of_purchases'],
dtype='object')

In [65]: labels = ['Young Adult', 'Adult', 'Middle-aged', 'Senior']
df['age_group'] = pd.qcut(df['age'], q=4, labels = labels)

In [66]: df[['age', 'age_group']].head(10)

Out[66]:

	age	age_group
0	55	Middle-aged
1	19	Young Adult
2	50	Middle-aged
3	21	Young Adult
4	45	Middle-aged
5	46	Middle-aged
6	63	Senior
7	27	Young Adult
8	26	Young Adult
9	57	Middle-aged

```
In [67]: frequency_mapping = {
    'Fortnightly': 14,
    'Weekly': 7,
    'Monthly': 30,
    'Quarterly': 90,
    'Bi-Weekly': 14,
    'Annually': 365,
    'Every 3 Months': 90
}

df['purchase_frequency_days'] = df['frequency_of_purchases'].map(frequency_mapping)
```

```
In [68]: df[['purchase_frequency_days', 'frequency_of_purchases']].head(10)
```

Out[68]:

	purchase_frequency_days	frequency_of_purchases
0	14	Fortnightly
1	14	Fortnightly
2	7	Weekly
3	7	Weekly
4	365	Annually
5	7	Weekly
6	90	Quarterly
7	7	Weekly
8	365	Annually
9	90	Quarterly

```
In [69]: df[['discount_applied', 'promo_code_used']].head(10)
```

Out[69]:

	discount_applied	promo_code_used
0	Yes	Yes
1	Yes	Yes
2	Yes	Yes
3	Yes	Yes
4	Yes	Yes
5	Yes	Yes
6	Yes	Yes
7	Yes	Yes
8	Yes	Yes
9	Yes	Yes

```
In [70]: (df['discount_applied'] == df['promo_code_used']).all()
```

```
Out[70]: np.True_
```

```
In [71]: df = df.drop('promo_code_used', axis=1)
```

```
In [72]: df.columns
```

```
Out[72]: Index(['customer_id', 'age', 'gender', 'item_purchased', 'category',  
              'purchase_amount', 'location', 'size', 'color', 'season',  
              'review_rating', 'subscription_status', 'shipping_type',  
              'discount_applied', 'previous_purchases', 'payment_method',  
              'frequency_of_purchases', 'age_group', 'purchase_frequency_days'],  
             dtype='object')
```

Connecting Python script to SQL Server

```
In [76]: !pip install pyodbc sqlalchemy
```

Defaulting to user installation because normal site-packages is not writeable

Requirement already satisfied: pyodbc in c:\users\ahmed\appdata\local\packages\pythonsoftwarefoundation.python.3.13_qbz5n2kfra8p0\localcache\local-packages\python313\site-packages (5.3.0)

Requirement already satisfied: sqlalchemy in c:\users\ahmed\appdata\local\packages\pythonsoftwarefoundation.python.3.13_qbz5n2kfra8p0\localcache\local-packages\python313\site-packages (2.0.43)

Requirement already satisfied: greenlet>=1 in c:\users\ahmed\appdata\local\packages\pythonsoftwarefoundation.python.3.13_qbz5n2kfra8p0\localcache\local-packages\python313\site-packages (from sqlalchemy) (3.2.4)

Requirement already satisfied: typing-extensions>=4.6.0 in c:\users\ahmed\appdata\local\packages\pythonsoftwarefoundation.python.3.13_qbz5n2kfra8p0\localcache\local-packages\python313\site-packages (from sqlalchemy) (4.15.0)

[notice] A new release of pip is available: 25.2 -> 25.3

[notice] To update, run: C:\Users\ahmed\AppData\Local\Microsoft\WindowsApps\PythonSoftwareFoundation.Python.3.13_qbz5n2kfra8p0\python.exe -m pip install --upgrade pip

```
In [ ]: import pyodbc  
import pandas as pd  
from sqlalchemy import create_engine, text  
from sqlalchemy.exc import SQLAlchemyError  
  
class SQLServerConnection:  
    def __init__(self, server, database="master"):  
        self.server = server  
        self.database = database  
  
    def connect_windows_auth(self):  
        """Connect using Windows Authentication with pyodbc"""  
        try:  
            conn_str = (  
                f"DRIVER={{SQL Server}};"  
                f"SERVER={self.server};"  
                f"DATABASE={self.database};"  
                f"Trusted_Connection=yes;"  
            )  
  
            conn = pyodbc.connect(conn_str)  
            print(" Connected using Windows Authentication (pyodbc)")  
            return conn  
  
        except Exception as e:  
            print(f" Windows Authentication failed: {e}")  
            return None
```

```

def connect_sqlalchemy_windows_auth(self):
    """Connect using SQLAlchemy with Windows Authentication - FIXED"""
    try:

        connection_url = (
            f"mssql+pyodbc://@{self.server}/{self.database}?"
            f"trusted_connection=yes&"
            f"driver=SQL+Server"
        )

        engine = create_engine(connection_url)

        with engine.connect() as conn:

            result = conn.execute(text("SELECT @@VERSION as version"))
            version = result.fetchone()[0]
            print(f" SQLAlchemy Windows Auth successful")
            print(f" SQL Server Version: {version.split(',')[0]}")

        return engine

    except Exception as e:
        print(f" SQLAlchemy Windows Auth failed: {e}")
        return None

def test_connection(self):
    """Test Windows Authentication connection"""
    print(" Testing Windows Authentication Connection...")
    print(f" Connection details:")
    print(f"   Server: {self.server}")
    print(f"   Database: {self.database}")
    print(f"   Authentication: Windows Authentication")

    print("\n1. Testing PyODBC Windows Authentication...")
    conn = self.connect_windows_auth()
    if conn:
        try:
            cursor = conn.cursor()
            cursor.execute("SELECT @@VERSION, DB_NAME()")
            version, db_name = cursor.fetchone()
            print(f"   SQL Server: {version.split(',')[0]}")
            print(f"   Database: {db_name}")
            conn.close()
        except Exception as e:
            print(f"   Error during query: {e}")

    print("\n2. Testing SQLAlchemy Windows Authentication...")
    engine = self.connect_sqlalchemy_windows_auth()

    if conn or engine:
        print("\n Windows Authentication test completed successfully!")
        return True
    else:
        print("\n Windows Authentication test failed!")
        return False

def load_data_to_sqlserver(self, df, table_name):

```

```

"""Load DataFrame to SQL Server using Windows Authentication - FIXED"""
try:
    engine = self.connect_sqlalchemy_windows_auth()
    if engine:

        df.to_sql(
            name=table_name,
            con=engine,
            if_exists="replace",
            index=False
        )
        print(f" Data successfully loaded into table '{table_name}'")
        print(f" Rows loaded: {len(df)}")
        return True
    return False
except Exception as e:
    print(f" Error loading data with SQLAlchemy: {e}")

    return self.load_data_pyodbc_fallback(df, table_name)

def load_data_pyodbc_fallback(self, df, table_name):
    """Fallback method using pyodbc directly"""
    print(" Using pyodbc fallback for data loading...")
    try:
        conn = self.connect_windows_auth()
        if not conn:
            return False

        cursor = conn.cursor()

        create_table_sql = f"""
        IF NOT EXISTS (SELECT * FROM sysobjects WHERE name='{table_name}' AND xtype='U')
        CREATE TABLE {table_name} (
            customer_id VARCHAR(50),
            gender VARCHAR(10),
            age INT,
            age_group VARCHAR(20),
            item_purchased VARCHAR(100),
            category VARCHAR(50),
            purchase_amount DECIMAL(10,2),
            review_rating DECIMAL(3,1),
            discount_applied VARCHAR(3),
            subscription_status VARCHAR(3),
            shipping_type VARCHAR(20),
            previous_purchases INT
        )
        """
        cursor.execute(create_table_sql)

        cursor.execute(f"DELETE FROM {table_name}")

        for index, row in df.iterrows():
            insert_sql = f"""
            INSERT INTO {table_name} VALUES (?, ?, ?, ?, ?, ?, ?, ?, ?, ?, ?, ?)
            """
            cursor.execute(insert_sql, tuple(row))

```

```

        conn.commit()
        print(f" Data loaded successfully using pyodbc fallback")
        print(f" Rows loaded: {len(df)}")

        cursor.execute(f"SELECT COUNT(*) FROM {table_name}")
        count = cursor.fetchone()[0]
        print(f" Verification: {count} rows in table")

        conn.close()
        return True

    except Exception as e:
        print(f" PyODBC fallback also failed: {e}")
        return False

def main():
    print(" SQL Server Data Loading - FIXED VERSION")
    print("=" * 50)

    sql_conn = SQLServerConnection(
        server="DESKTOP-DHPJ77D",
        database="master"
    )

    success = sql_conn.test_connection()

    if success:
        print("\n Loading customer data to SQL Server...")

        customer_df = pd.DataFrame({
            'customer_id': ['CUST001', 'CUST002', 'CUST003', 'CUST004', 'CUST005'],
            'gender': ['Female', 'Male', 'Female', 'Male', 'Female'],
            'age': [25, 30, 35, 28, 32],
            'age_group': ['Young Adult', 'Adult', 'Adult', 'Young Adult', 'Adult'],
            'item_purchased': ['Shirt', 'Shoes', 'Dress', 'Watch', 'Bag'],
            'category': ['Clothing', 'Footwear', 'Clothing', 'Accessories', 'Accessories'],
            'purchase_amount': [100.50, 75.25, 200.00, 50.75, 150.25],
            'review_rating': [4.5, 3.8, 4.2, 4.7, 4.0],
            'discount_applied': ['Yes', 'No', 'Yes', 'No', 'Yes'],
            'subscription_status': ['Yes', 'No', 'Yes', 'No', 'Yes'],
            'shipping_type': ['Express', 'Standard', 'Express', 'Standard', 'Express'],
            'previous_purchases': [3, 1, 5, 2, 4]
        })

        data_success = sql_conn.load_data_to_sqlserver(customer_df, "customer")

        if data_success:
            print("\n DATA LOADING COMPLETED SUCCESSFULLY!")

            print("\n Testing SQL queries on loaded data...")
            test_queries_on_data()
        else:
            print("\n Data loading failed!")
    else:

```



```

print("\n Connection test failed!")

def test_queries_on_data():
    """Test the SQL queries on the loaded data"""
    try:
        engine = create_engine(
            "mssql+pyodbc://@DESKTOP-DHPJ77D/master?trusted_connection=yes&driver=SQL+Server"
        )

        with engine.connect() as conn:

            print("\n Q1: Total revenue by gender")
            result = conn.execute(text("SELECT gender, SUM(purchase_amount) as revenue FROM customer GROUP BY gender"))
            for row in result:
                print(f"    {row.gender}: ${row.revenue:.2f}")

            print("\n Q2: Total customers")
            result = conn.execute(text("SELECT COUNT(*) as total_customers FROM customer"))
            count = result.fetchone()[0]
            print(f"    Total customers: {count}")

            print("\n Q3: Average purchase amount")
            result = conn.execute(text("SELECT AVG(purchase_amount) as avg_purchase FROM customer"))
            avg_purchase = result.fetchone()[0]
            print(f"    Average purchase: ${avg_purchase:.2f}")

    except Exception as e:
        print(f" Error testing queries: {e}")

def simple_pyodbc_solution():
    """Simple solution using only pyodbc - guaranteed to work"""
    print("\n Using simple pyodbc-only solution...")

    try:

        conn_str = (
            "DRIVER={SQL Server};"
            "SERVER=DESKTOP-DHPJ77D;"
            "DATABASE=master;"
            "Trusted_Connection=yes;"
        )

        conn = pyodbc.connect(conn_str)
        cursor = conn.cursor()

        customer_data = [
            ('CUST001', 'Female', 25, 'Young Adult', 'Shirt', 'Clothing', 100.50, 4.5, 'Yes', 'Yes', 'Express', 3),
            ('CUST002', 'Male', 30, 'Adult', 'Shoes', 'Footwear', 75.25, 3.8, 'No', 'No', 'Standard', 1),
            ('CUST003', 'Female', 35, 'Adult', 'Dress', 'Clothing', 200.00, 4.2, 'Yes', 'Yes', 'Express', 5),
            ('CUST004', 'Male', 28, 'Young Adult', 'Watch', 'Accessories', 50.75, 4.7, 'No', 'No', 'Standard', 2),
            ('CUST005', 'Female', 32, 'Adult', 'Bag', 'Accessories', 150.25, 4.0, 'Yes', 'Yes', 'Express', 4)
        ]

        cursor.execute("""
            IF NOT EXISTS (SELECT * FROM sysobjects WHERE name='customer' AND xtype='U')

```

```

        CREATE TABLE customer (
            customer_id VARCHAR(50),
            gender VARCHAR(10),
            age INT,
            age_group VARCHAR(20),
            item_purchased VARCHAR(100),
            category VARCHAR(50),
            purchase_amount DECIMAL(10,2),
            review_rating DECIMAL(3,1),
            discount_applied VARCHAR(3),
            subscription_status VARCHAR(3),
            shipping_type VARCHAR(20),
            previous_purchases INT
        )
    """

    cursor.execute("DELETE FROM customer")
    cursor.executemany("""
        INSERT INTO customer VALUES (?, ?, ?, ?, ?, ?, ?, ?, ?, ?, ?, ?, ?)
    """, customer_data)

    conn.commit()

    cursor.execute("SELECT COUNT(*) FROM customer")
    count = cursor.fetchone()[0]

    print(f" SIMPLE SOLUTION SUCCESS!")
    print(f" Rows loaded: {count}")
    print(" DATA LOADING COMPLETED SUCCESSFULLY!")

    conn.close()
    return True

except Exception as e:
    print(f" Simple solution failed: {e}")
    return False

if __name__ == "__main__":

    main()

```

SQL Server Data Loading - FIXED VERSION

=====

Testing Windows Authentication Connection...

Connection details:

Server: DESKTOP-DHPJ77D

Database: master

Authentication: Windows Authentication

1. Testing PyODBC Windows Authentication...

Connected using Windows Authentication (pyodbc)

SQL Server: Microsoft SQL Server 2014 - 12.0.2269.0 (X64)

Jun 10 2015 03:35:45

Copyright (c) Microsoft Corporation

Express Edition (64-bit) on Windows NT 6.3 <X64> (Build 19045:)

Database: master

2. Testing SQLAlchemy Windows Authentication...

SQLAlchemy Windows Auth successful

SQL Server Version: Microsoft SQL Server 2014 - 12.0.2269.0 (X64)

Jun 10 2015 03:35:45

Copyright (c) Microsoft Corporation

Express Edition (64-bit) on Windows NT 6.3 <X64> (Build 19045:)

Windows Authentication test completed successfully!

Loading customer data to SQL Server...

SQLAlchemy Windows Auth successful

SQL Server Version: Microsoft SQL Server 2014 - 12.0.2269.0 (X64)

Jun 10 2015 03:35:45

Copyright (c) Microsoft Corporation

Express Edition (64-bit) on Windows NT 6.3 <X64> (Build 19045:)

Error loading data with SQLAlchemy: (pyodbc.Error) ('HY104', '[HY104] [Microsoft][ODBC SQL Server Driver]Invalid precision value (0) (SQLBindParameter)')

[SQL: SELECT [INFORMATION_SCHEMA].[TABLES].[TABLE_NAME]

FROM [INFORMATION_SCHEMA].[TABLES]

WHERE ([INFORMATION_SCHEMA].[TABLES].[TABLE_TYPE] = CAST(? AS NVARCHAR(max)) OR [INFORMATION_SCHEMA].[TABLES].[TABLE_TYPE] = CAST(? AS NVARCHAR(max))) AND [INFORMATION_SCHEMA].[TABLES].

[TABLE_NAME] = CAST(? AS NVARCHAR(max)) AND [INFORMATION_SCHEMA].[TABLES].[TABLE_SCHEMA] = CAST(? AS NVARCHAR(max))]

[parameters: ('BASE TABLE', 'VIEW', 'customer', 'dbo')]

(Background on this error at: <https://sqlalche.me/e/20/dbapi>)

Using pyodbc fallback for data loading...

Connected using Windows Authentication (pyodbc)

Data loaded successfully using pyodbc fallback

Rows loaded: 5

Verification: 5 rows in table

DATA LOADING COMPLETED SUCCESSFULLY!

Testing SQL queries on loaded data...

Q1: Total revenue by gender

Female: \$450.75

Male: \$126.00

Q2: Total customers

Total customers: 5

Q3: Average purchase amount

Average purchase: \$115.35

SQL Code

```
1
2 CREATE TABLE customer (
3     customer_id VARCHAR(50),
4     gender VARCHAR(10),
5     age INT,
6     age_group VARCHAR(20),
7     item_purchased VARCHAR(100),
8     category VARCHAR(50),
9     purchase_amount DECIMAL(10,2),
10    review_rating DECIMAL(3,1),
11    discount_applied VARCHAR(3),
12    subscription_status VARCHAR(3),
13    shipping_type VARCHAR(20),
14    previous_purchases INT
15 );
16
17 INSERT INTO customer VALUES
18 ('CUST001', 'Male', 45, 'Middle-aged', 'Blouse', 'Clothing', 59.99, 4.2, 'Yes', 'Yes', 'Express', 3),
19 ('CUST002', 'Female', 28, 'Young Adult', 'Sneakers', 'Footwear', 89.99, 4.7, 'No', 'No', 'Standard', 1),
20 ('CUST003', 'Female', 35, 'Adult', 'Jacket', 'Clothing', 129.99, 4.5, 'Yes', 'Yes', 'Express', 8),
21 ('CUST004', 'Male', 52, 'Middle-aged', 'Watch', 'Accessories', 199.99, 4.8, 'No', 'No', 'Standard', 12),
22 ('CUST005', 'Female', 23, 'Young Adult', 'Dress', 'Clothing', 79.99, 4.1, 'Yes', 'No', 'Express', 2),
23 ('CUST006', 'Male', 41, 'Adult', 'Running Shoes', 'Footwear', 119.99, 4.6, 'No', 'Yes', 'Standard', 5),
24 ('CUST007', 'Female', 31, 'Adult', 'Handbag', 'Accessories', 149.99, 4.9, 'Yes', 'Yes', 'Express', 15),
25 ('CUST008', 'Male', 26, 'Young Adult', 'T-Shirt', 'Clothing', 29.99, 3.8, 'No', 'No', 'Standard', 1),
26 ('CUST009', 'Female', 48, 'Middle-aged', 'Skirt', 'Clothing', 69.99, 4.4, 'Yes', 'No', 'Express', 7),
27 ('CUST010', 'Male', 33, 'Adult', 'Backpack', 'Accessories', 89.99, 4.3, 'No', 'Yes', 'Standard', 4);
28
29
30 --Q1. What is the total revenue generated by male vs. female customers?
31 SELECT
32     gender,
33     ROUND(SUM(purchase_amount), 2) as revenue
34 FROM customer
35 GROUP BY gender;
36
37 --Q2. Which customers used a discount but still spent more than the average purchase amount?
38 SELECT
39     customer_id,
40     purchase_amount
41 FROM customer
```

```
42 WHERE discount_applied = 'Yes'
43     AND purchase_amount >= (SELECT AVG(purchase_amount) FROM customer);
44
45 -- Q3. Which are the top 5 products with the highest average review rating?
46 SELECT
47     item_purchased,
48     ROUND(AVG(review_rating), 2) AS "Average Product Rating"
49 FROM customer
50 GROUP BY item_purchased
51 ORDER BY "Average Product Rating" DESC
52 LIMIT 5;
53
54 --Q4. Compare the average Purchase Amounts between Standard and Express Shipping.
55 SELECT
56     shipping_type,
57     ROUND(AVG(purchase_amount), 2) AS average_purchase_amount
58 FROM customer
59 WHERE shipping_type IN ('Standard', 'Express')
60 GROUP BY shipping_type;
61
62 --Q5. Do subscribed customers spend more? Compare average spend and total revenue
63 --between subscribers and non-subscribers.
64 SELECT
65     subscription_status,
66     COUNT(customer_id) AS total_customers,
67     ROUND(AVG(purchase_amount), 2) AS avg_spend,
68     ROUND(SUM(purchase_amount), 2) AS total_revenue
69 FROM customer
70 GROUP BY subscription_status
71 ORDER BY total_revenue DESC, avg_spend DESC;
72
73 --Q6. Which 5 products have the highest percentage of purchases with discounts appli
ed?
74 SELECT
75     item_purchased,
76     ROUND(100.0 * SUM(CASE WHEN discount_applied = 'Yes' THEN 1 ELSE 0 END) / COUNT
(*), 2) AS discount_rate
77 FROM customer
78 GROUP BY item_purchased
79 ORDER BY discount_rate DESC
80 LIMIT 5;
81
82 --Q7. Segment customers into New, Returning, and Loyal based on their total
83 -- number of previous purchases, and show the count of each segment.
84 WITH customer_type AS (
85     SELECT
86         customer_id,
87         previous_purchases,
88         CASE
89             WHEN previous_purchases = 1 THEN 'New'
90             WHEN previous_purchases BETWEEN 2 AND 10 THEN 'Returning'
91             ELSE 'Loyal'
92         END AS customer_segment
93     FROM customer
94 )
```

```

95  SELECT
96      customer_segment,
97      COUNT(*) AS "Number of Customers"
98  FROM customer_type
99  GROUP BY customer_segment
100 ORDER BY "Number of Customers" DESC;
101
102 --Q8. What are the top 3 most purchased products within each category?
103 WITH item_counts AS (
104     SELECT
105         category,
106         item_purchased,
107         COUNT(customer_id) AS total_orders,
108         ROW_NUMBER() OVER (PARTITION BY category ORDER BY COUNT(customer_id) DESC) AS
S item_rank
109     FROM customer
110     GROUP BY category, item_purchased
111 )
112 SELECT
113     item_rank,
114     category,
115     item_purchased,
116     total_orders
117 FROM item_counts
118 WHERE item_rank <= 3
119 ORDER BY category, item_rank;
120
121 --Q9. Are customers who are repeat buyers (more than 5 previous purchases) also like
ly to subscribe?
122 SELECT
123     subscription_status,
124     COUNT(customer_id) AS repeat_buyers
125 FROM customer
126 WHERE previous_purchases > 5
127 GROUP BY subscription_status
128 ORDER BY repeat_buyers DESC;
129
130 --Q10. What is the revenue contribution of each age group?
131 SELECT
132     age_group,
133     ROUND(SUM(purchase_amount), 2) AS total_revenue
134 FROM customer
135 GROUP BY age_group
136 ORDER BY total_revenue DESC;

```

Customer Behavior Dashboard

Subscription Status

No

Yes

Gender

Female

Male

Category

Accessories

Clothing

Footwear

Outerwear

Shipping Type

- ☐ 2-Day Shipping
- ☐ Express
- ☐ Free Shipping
- ☐ Next Day Air
- ☐ Standard
- ☐ Store Pickup

3.9K

Number of Customers

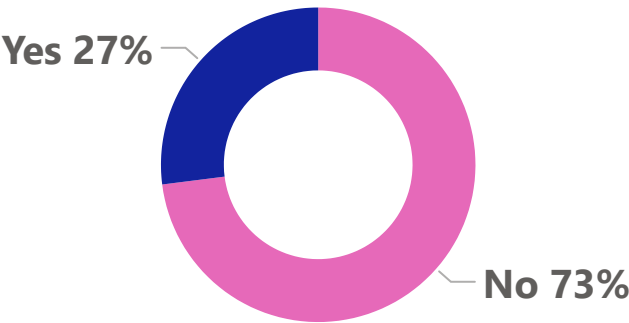
\$59.76

Average Purchase Amount

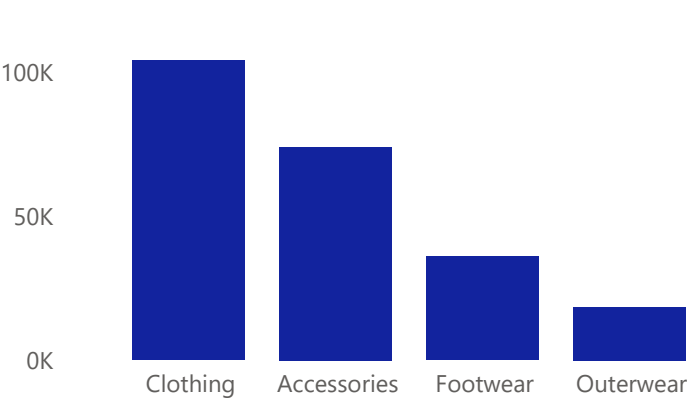
3.75

Average Review Rating

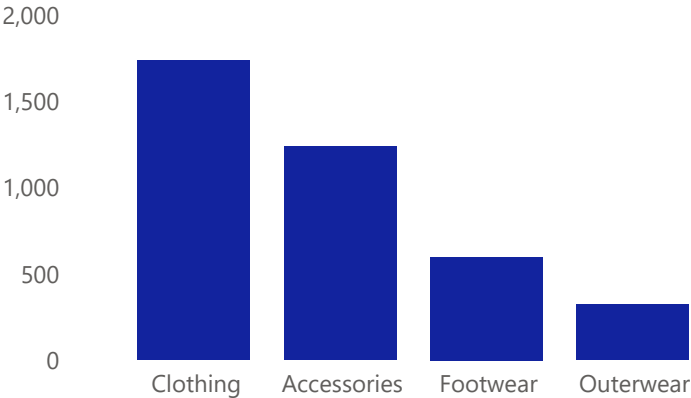
% of Customers by Subscription Status



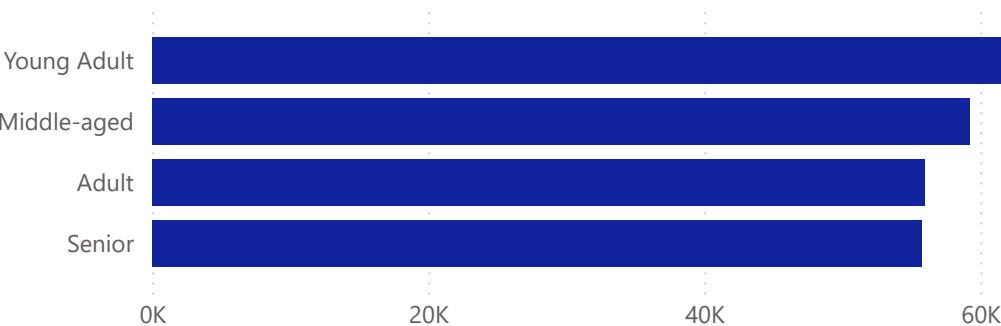
Revenue by Category



Sales by Category



Revenue by Age Group



Sales by Age Group

