



Customer Shopping Behavior Analysis

Analyzing 3,900 purchases to uncover insights into spending patterns, customer segments, and product preferences that drive strategic business decisions.

Dataset Overview

3,900

Total Purchases

Transactions analyzed
across all categories

18

Data Columns

Features covering
demographics and behavior

50

Locations

Geographic distribution of
customers

25

Products

Unique items purchased

Key features include customer demographics, purchase details, shopping behavior patterns, and review ratings. Only 37 missing values found in Review Rating column.

Data Preparation Process

01

Data Loading & Exploration

Imported dataset using pandas and analyzed structure with `df.info()` and summary statistics

02

Missing Data Handling

Imputed 37 missing Review Rating values using median rating by product category

03

Feature Engineering

Created `age_group` bins and `purchase_frequency_days` columns for deeper analysis

04

Database Integration

Connected to PostgreSQL and loaded cleaned data for SQL business analysis

Revenue by Gender



Male Customers Drive Revenue

Male customers generated \$157,890 in total revenue compared to \$75,191 from female customers—representing 68% of total sales.

This significant gap suggests opportunities for targeted marketing to female demographics.



Customer Spending Insights

High-Value Discount Users

839 customers used discounts but still spent above average (\$59.76), indicating price-conscious yet high-spending segments.

Shipping Preferences

Express shipping customers spend \$60.48 on average vs. \$58.46 for Standard—a 3.5% premium for faster delivery.

Subscription Impact

Subscribers and non-subscribers show similar average spend (\$59.49 vs. \$59.87), but non-subscribers drive 73% of total revenue.

Top-Rated Products



77%

Gloves

Highest average rating at 3.86 out of 5.0



77%

Sandals

Strong performance with 3.84 rating



76%

Boots

Solid customer satisfaction at 3.82



76%

Hat

Consistent quality with 3.80 rating



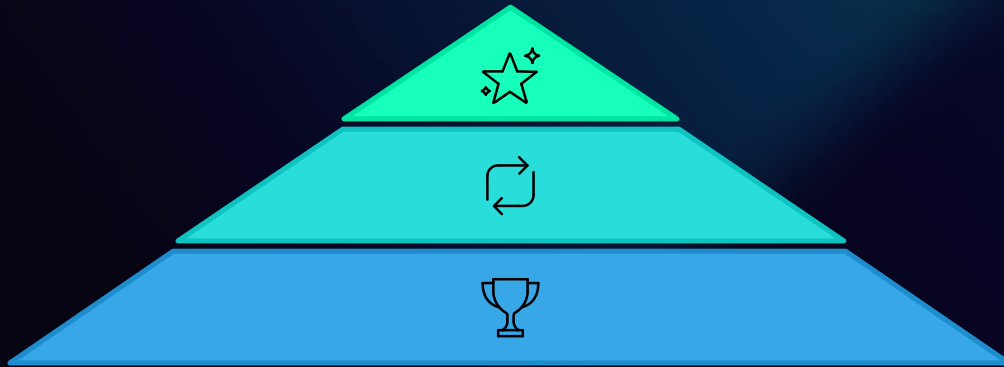
76%

Skirt

Rounds out top 5 at 3.78 rating

These products demonstrate consistent quality and customer satisfaction, making them ideal for promotional campaigns and inventory prioritization.

Customer Segmentation Analysis



New

83 customers



Returning

701 customers



Loyal

3,116 customers

Loyalty Dominates

80% of customers are classified as Loyal based on purchase history, indicating strong retention.

Among repeat buyers (5+ purchases), 958 are subscribers while 2,518 are not—suggesting untapped subscription potential.

Discount-Dependent Products

1

Hat

50% of purchases used discounts

2

Sneakers

49.66% discount rate

3

Coat

49.07% discount rate

4

Sweater

48.17% discount rate

5

Pants

47.37% discount rate

These products rely heavily on discounts to drive sales. Review pricing strategy to balance volume with profit margins.

Revenue by Age Group



Young Adults lead revenue generation at \$62,143, followed closely by Middle-aged customers. Revenue distribution is relatively balanced across age groups, suggesting broad market appeal.

Strategic Recommendations



Boost Subscriptions

Promote exclusive benefits to convert the 2,518 repeat buyers who aren't yet subscribers.



Loyalty Programs

Reward repeat buyers to strengthen the 80% loyal customer base and increase lifetime value.



Review Discount Policy

Balance promotional discounts with margin control, especially for the 5 discount-dependent products.



Targeted Marketing

Focus campaigns on Young Adults, express-shipping users, and top-rated products like Gloves and Sandals.