



# 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

# Understanding Our Data

**3,900**

**Total Purchases**

Transactions analyzed  
across all categories

**18**

**Data Features**

Comprehensive customer  
and purchase attributes

**50**

**Locations**

Geographic diversity in  
customer base

**25**

**Product Types**

Items across multiple  
categories

Dataset includes customer demographics, purchase details, shopping behavior metrics, and product information across Clothing, Footwear, Accessories, and Outerwear categories.

# Data Preparation & Cleaning

0

## 1 Data Loading

Imported dataset using pandas and explored structure with df.info() and .describe()

0

## 2 Missing Data

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

0

## 3 Standardization

Renamed columns to snake\_case for consistency and documentation

0

## 1 Feature Engineering

Created age\_group and purchase\_frequency\_days columns for deeper analysis

0

## 2 Data Consistency

Verified redundancy between discount\_applied and promo\_code\_used; dropped duplicate

0

## 3 Database Integration

Connected to PostgreSQL and loaded cleaned data for SQL analysis



SQL ANALYSIS

## Revenue Insights by Gender

Male Customers

**\$157,890**

67.7% of total revenue

Female Customers

**\$75,191**

32.3% of total revenue

Male customers generate more than double the revenue of female customers, representing a significant opportunity for targeted marketing strategies.

# Customer Spending Patterns

## High-Value Discount Users

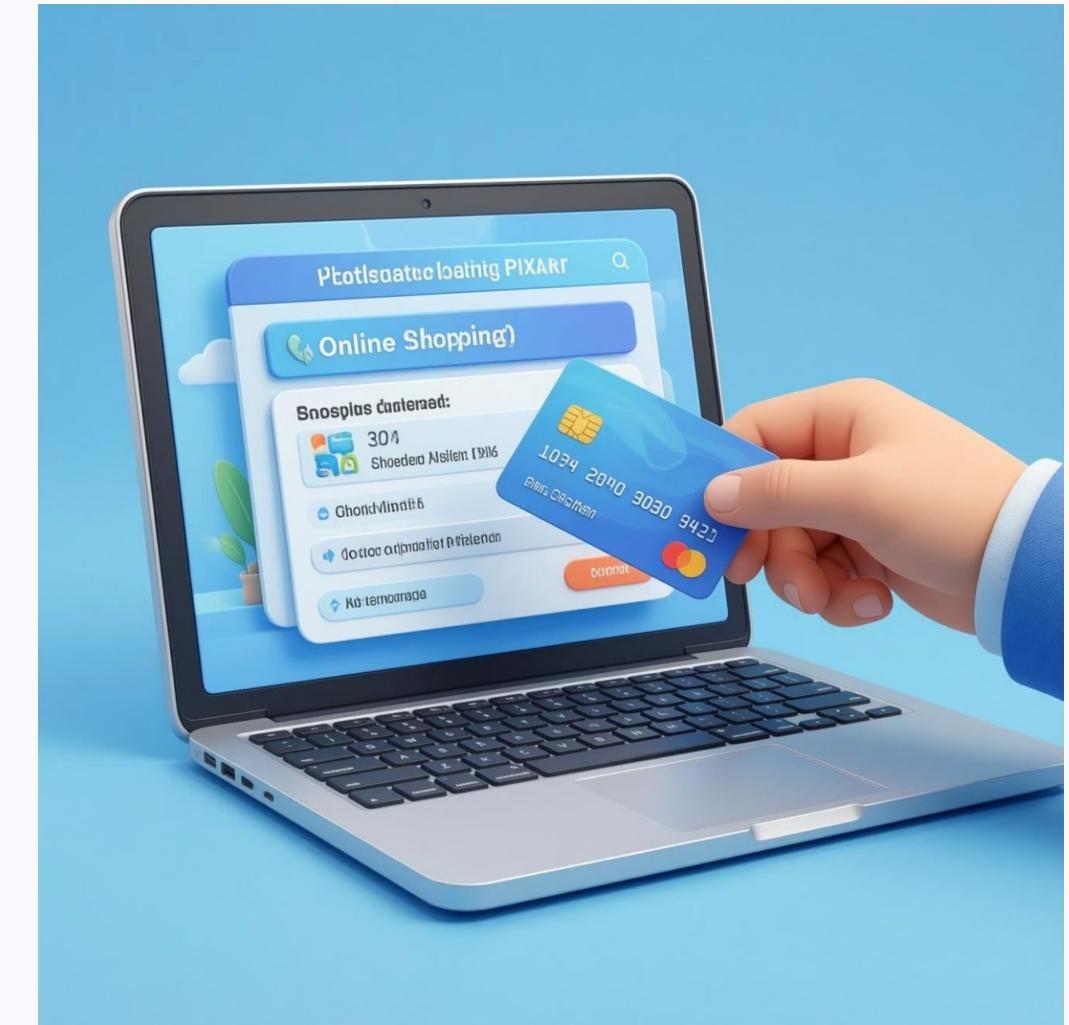
839 customers used discounts while spending above the average purchase amount of \$59.76. This segment represents savvy shoppers who seek value but maintain high spending levels.

## Shipping Preferences

**Express Shipping:** \$60.48 average spend

**Standard Shipping:** \$58.46 average spend

Express shipping users spend 3.5% more on average, indicating willingness to pay for convenience.



PRODUCT PERFORMANCE

# Top-Rated Products



Gloves

Highest average rating: 3.86/5.0



Sandals

Strong performance: 3.84/5.0



Boots

Consistent quality: 3.82/5.0



Hat

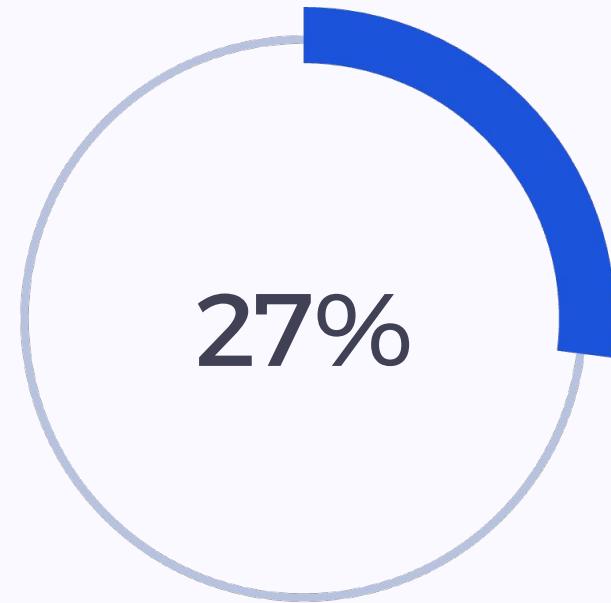
Popular accessory: 3.80/5.0



Skirt

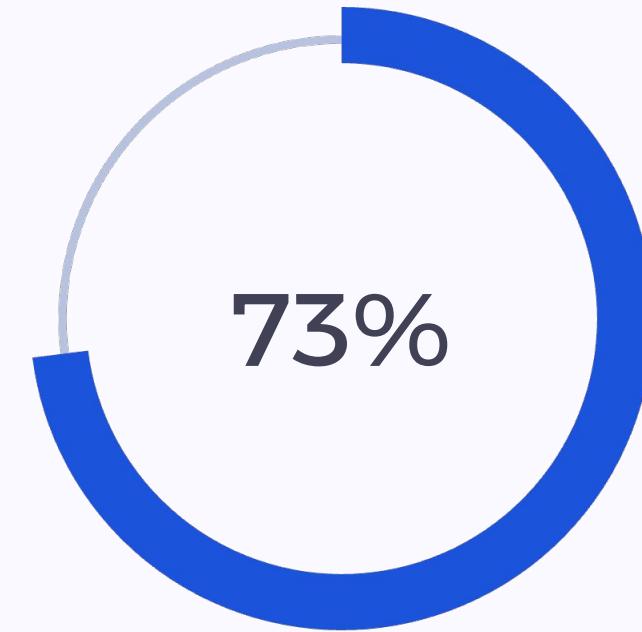
Top clothing item: 3.78/5.0

# Subscription Analysis



**Subscribers**

1,053 customers with \$59.49 avg spend



**Non-Subscribers**

2,847 customers with \$59.87 avg spend

## Key Finding

Despite similar average spending, non-subscribers generate **\$170,436** in total revenue versus **\$62,645** from subscribers due to volume.

## Repeat Buyer Insight

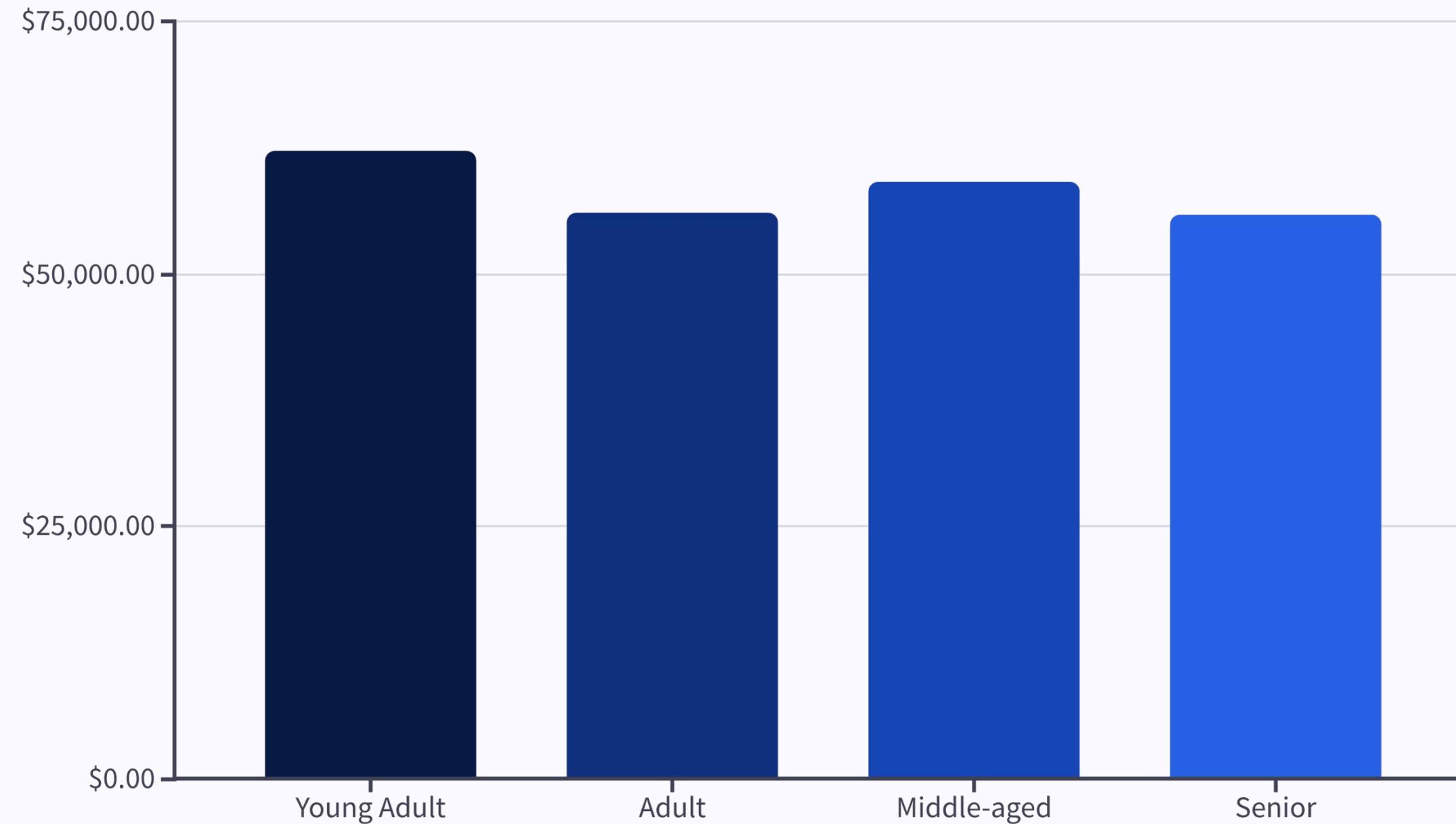
Among customers with 5+ purchases: **958 are subscribers** while **2,518 are not**, revealing untapped subscription potential.

# Understanding Customer Loyalty



Strong loyalty base presents opportunity to convert returning customers into loyal segment through targeted engagement programs.

# Revenue by Age Demographics



Young adults lead revenue generation at \$62,143, followed closely by middle-aged customers at \$59,197. Revenue distribution is relatively balanced across age groups, suggesting broad market appeal.

# Business Action Plan

## Boost Subscriptions

Promote exclusive benefits to convert the 2,518 repeat buyers who aren't yet subscribers. Focus on loyalty rewards and convenience.

## Customer Loyalty Programs

Reward repeat buyers to accelerate movement from Returning (701) to Loyal (3,116) segment through points and personalized offers.

## Review Discount Policy

Balance sales boosts with margin control. 839 high-spenders use discounts—optimize discount thresholds to maintain profitability.

## Product Positioning

Highlight top-rated products (Gloves, Sandals, Boots) in marketing campaigns to drive conversion and build brand trust.

## Targeted Marketing

Focus on high-revenue young adults (\$62K) and express-shipping users who demonstrate higher spending and urgency.