



Customer Shopping Behavior Analysis

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

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

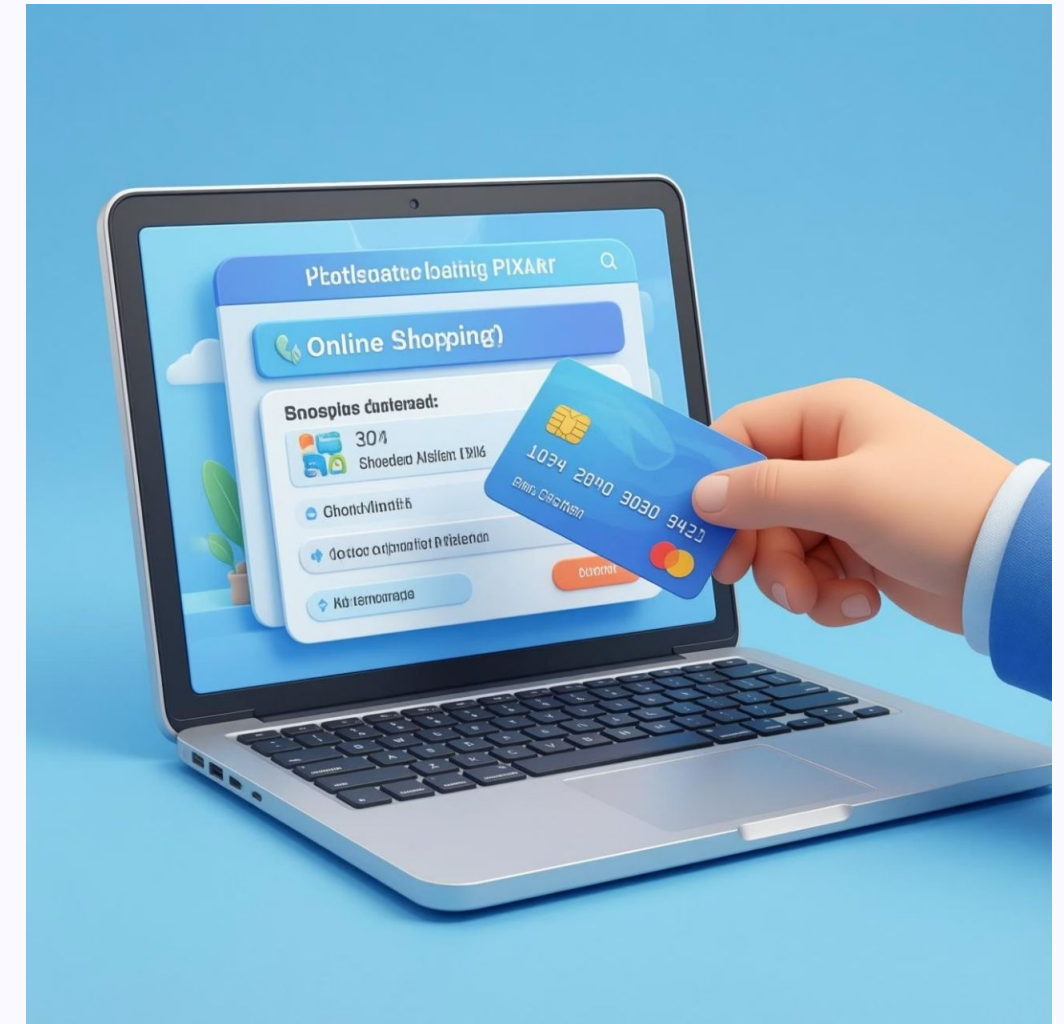
839 customers used discounts while spending above the average purchase amount of \$59.76. This segment represents savvy shoppers who seek value but maintain high spending levels.

Shipping Preferences

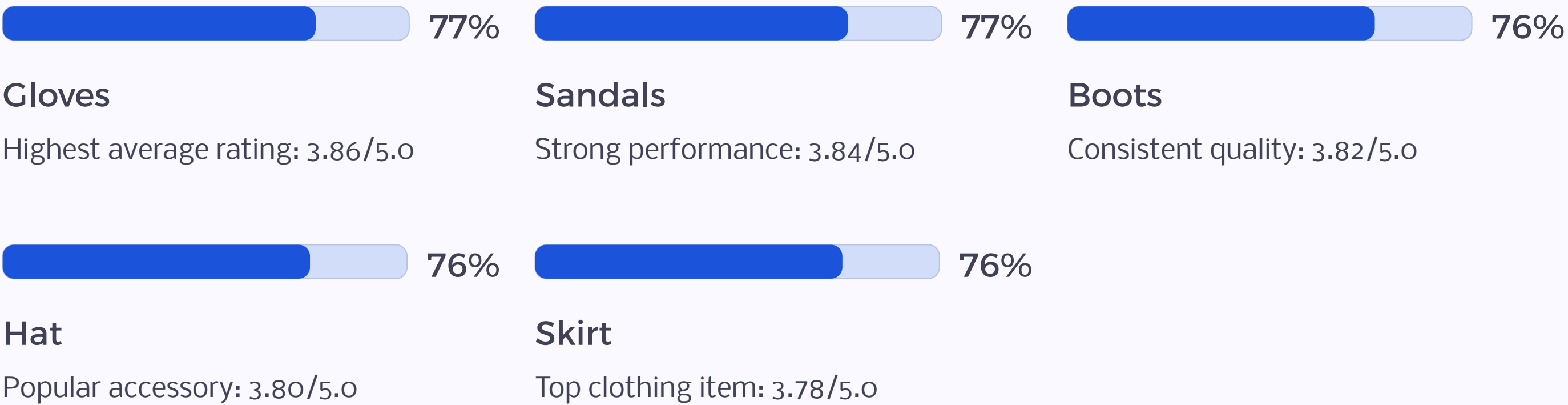
Express Shipping: \$60.48 average spend

Standard Shipping: \$58.46 average spend

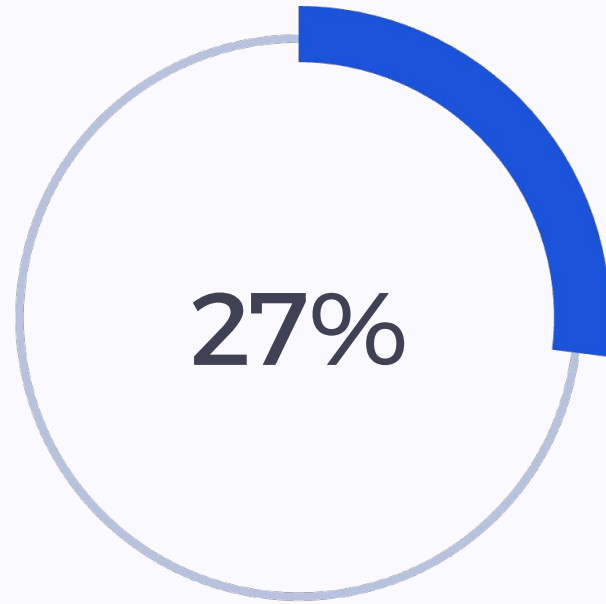
Express shipping users spend 3.5% more on average, indicating willingness to pay for convenience.



Top-Rated Products

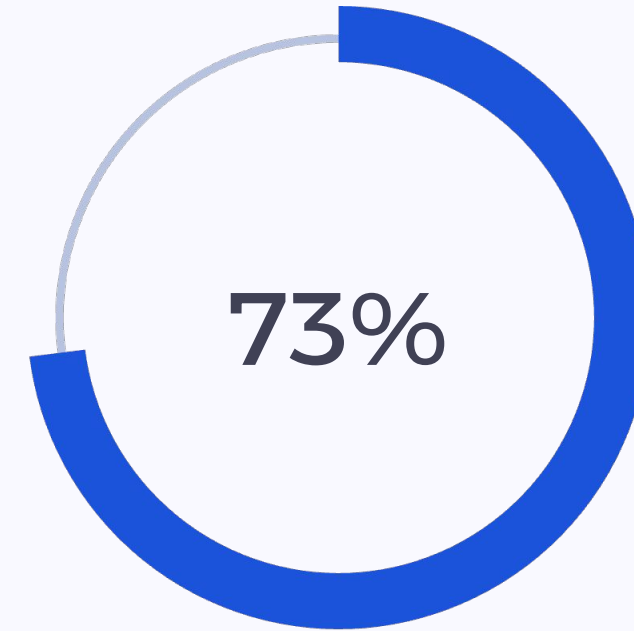


Subscription Analysis



Subscribers

1,053 customers with \$59.49 avg spend



Non-Subscribers

2,847 customers with \$59.87 avg spend

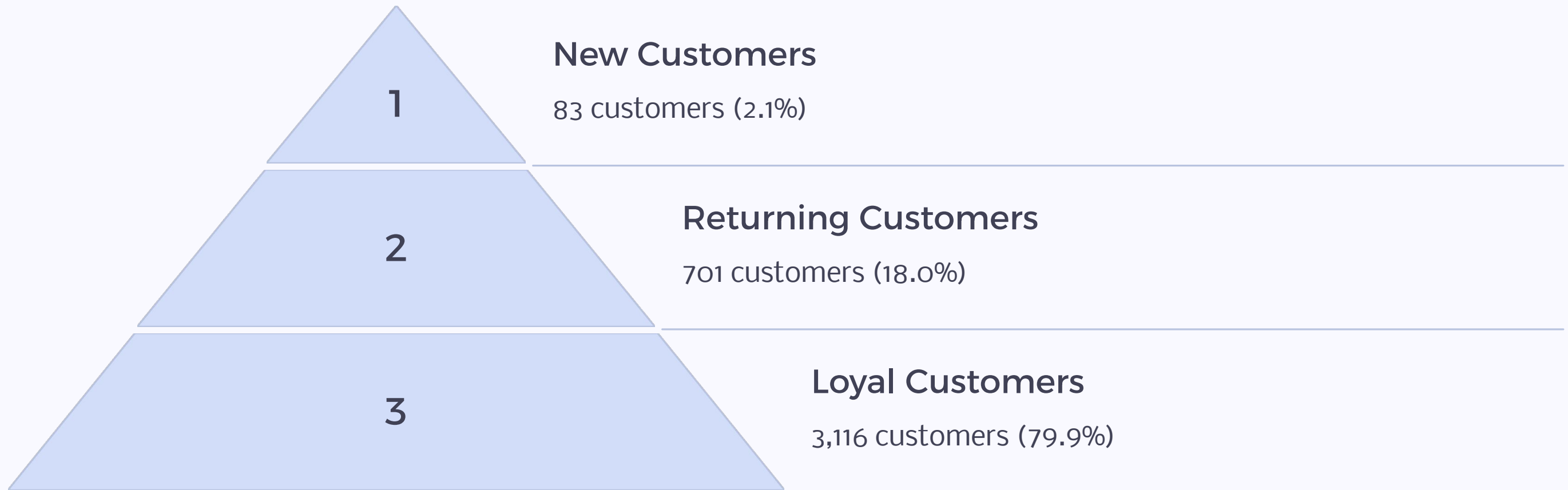
Key Finding

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

Repeat Buyer Insight

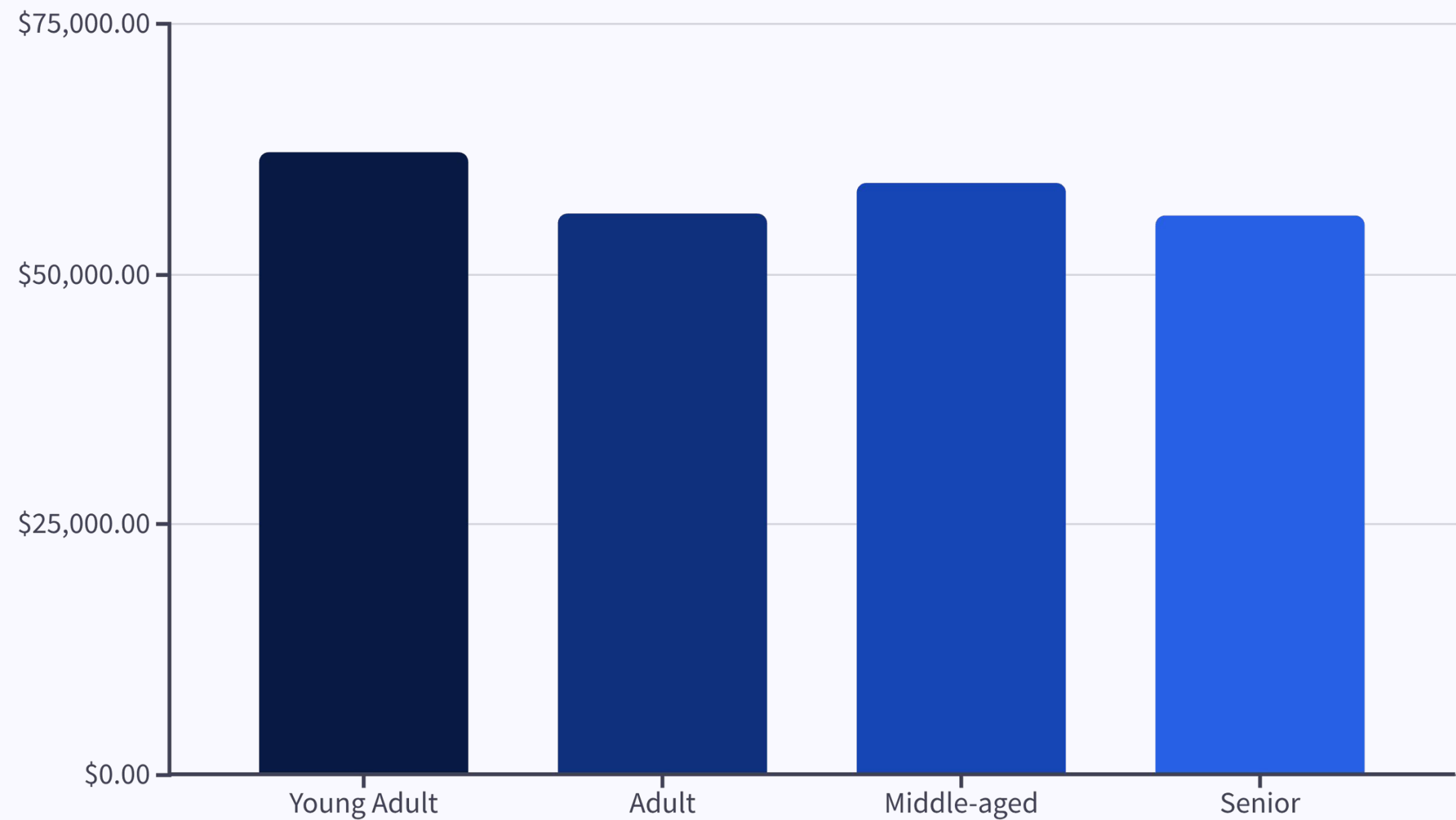
Among customers with 5+ purchases: **958 are subscribers** while **2,518 are not**, revealing untapped subscription potential.

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.