



# Customer Shopping Behavior Analysis

This project analyzes 3,900 customer purchases to uncover spending patterns, segments, product preferences, and subscription behavior. Our goal is to guide strategic business decisions.

# Dataset Summary: Key Features



## Customer Demographics

Age, Gender, Location,  
Subscription Status

## Purchase Details

Item, Category, Amount, Season,  
Size, Color

## Shopping Behavior

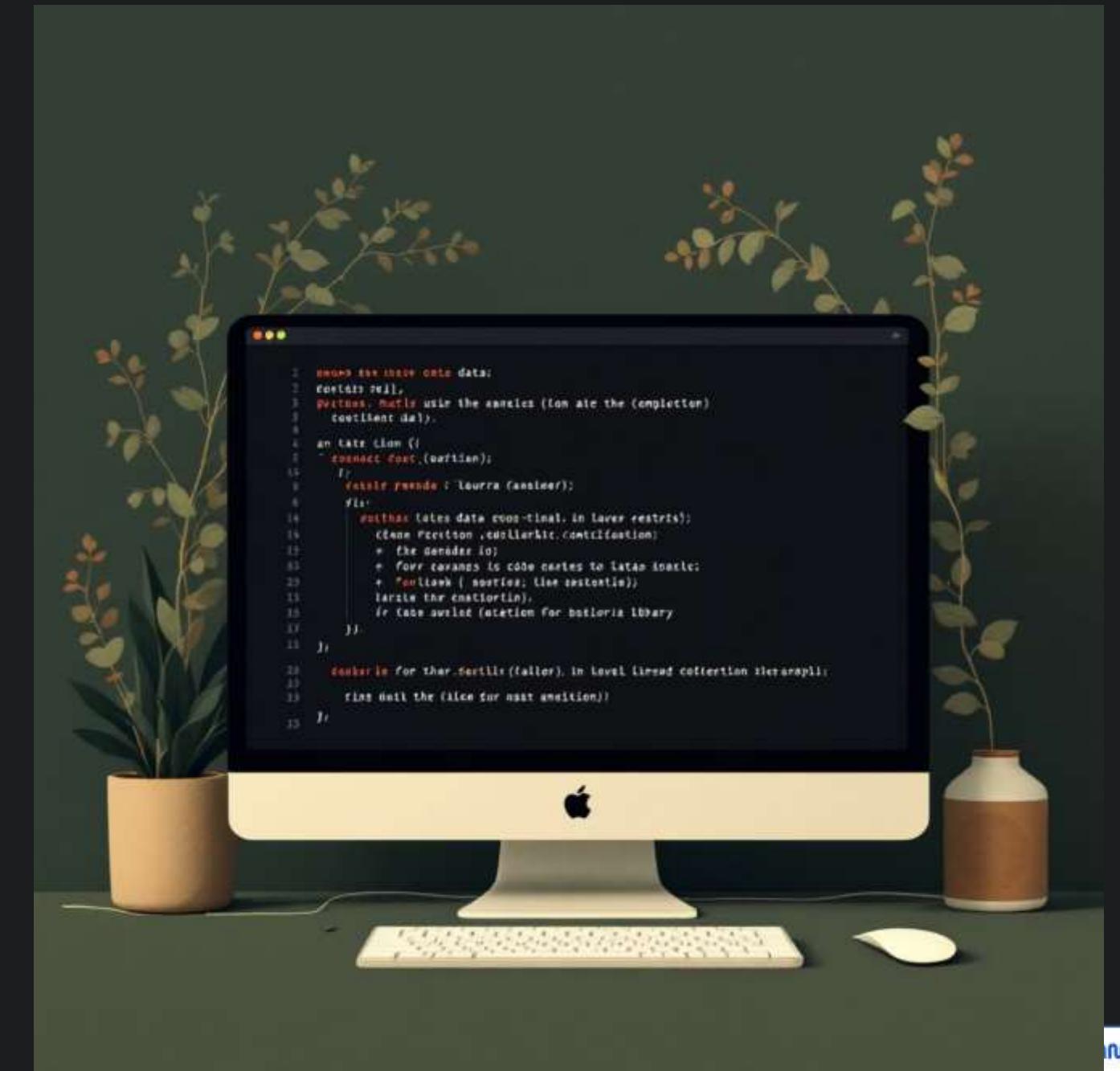
Discount, Promo Code, Previous  
Purchases, Frequency, Review  
Rating, Shipping Type

The dataset comprises 3,900 rows and 18 columns, with 37 missing values in the Review Rating column.

# Exploratory Data Analysis (Python)

## Data Preparation & Cleaning

- Data Loading: Imported dataset using pandas.
- Initial Exploration: Checked structure and summary statistics.
- Missing Data Handling: Imputed missing Review Ratings using median.



# Feature Engineering & Database Integration



## Age Group Column

Binned customer ages for segmentation.

## Purchase Frequency

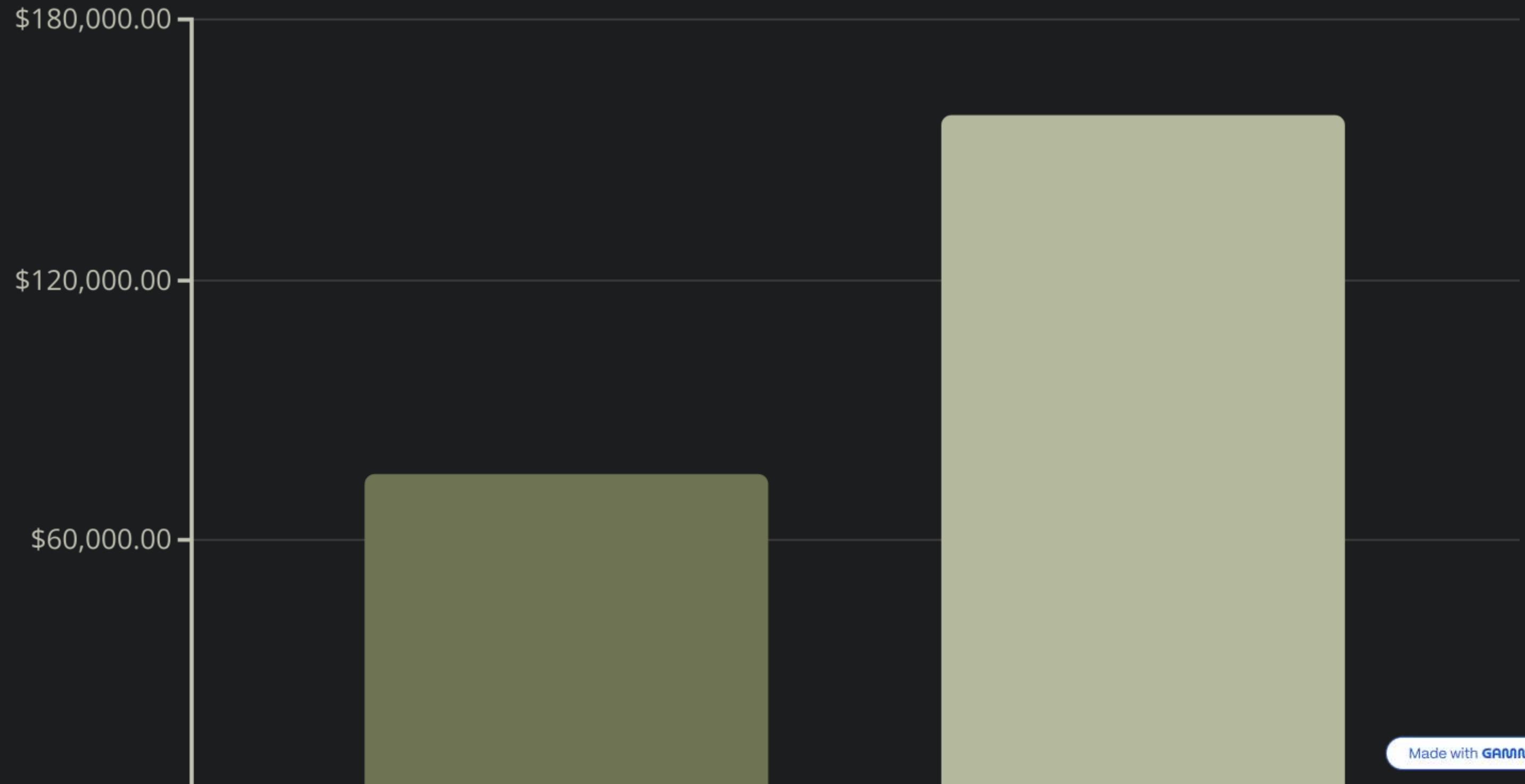
Derived from purchase data.

## MySQL Integration

Loaded cleaned data for SQL analysis.

We also verified and dropped redundant columns like 'promo\_code\_used' for data consistency.

# Revenue by Gender



# Top Products & Shipping Insights

## Top 5 Products by Rating

- Gloves: 3.86
- Sandals: 3.84
- Boots: 3.82
- Hat: 3.80
- Skirt: 3.78



## Shipping Type Comparison

Average purchase amounts:

- Standard Shipping: \$58.46
- Express Shipping: \$60.48



# Subscription & Discount Analysis



## Subscribers vs. Non-Subscribers

Subscribers (1053) have a slightly lower average spend (\$59.49) than non-subscribers (2847) (\$59.87), but contribute significantly to total revenue.

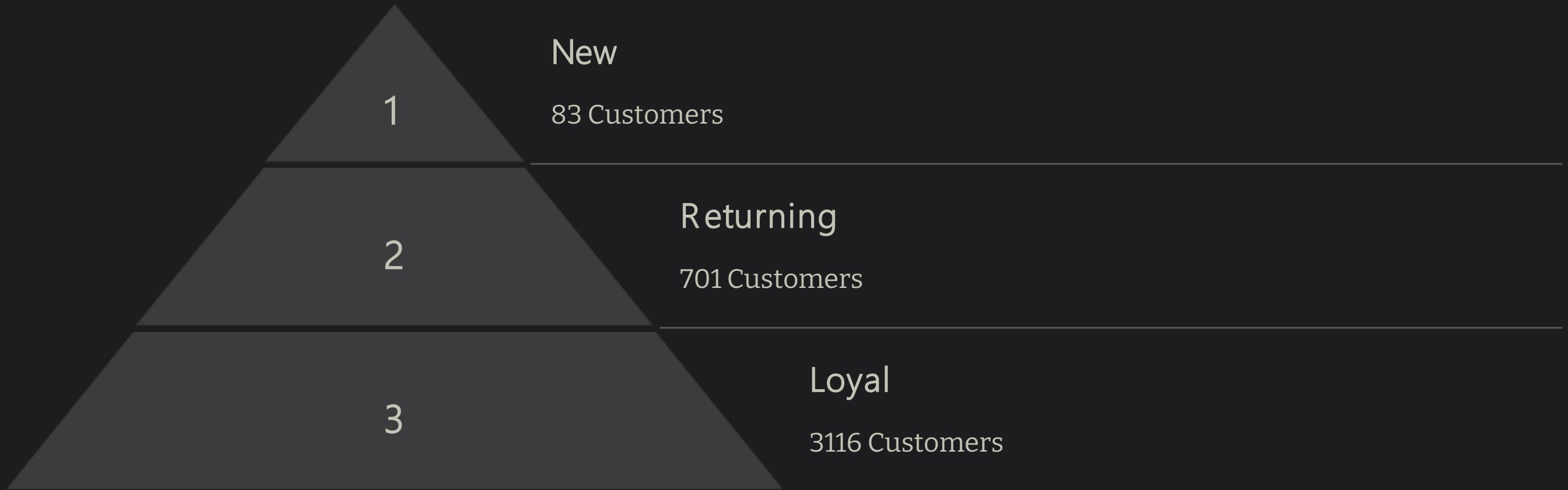


## Discount-Dependent Products

Top 5 products with highest percentage of discounted purchases: Hat (50%), Sneakers (49.66%), Coat (49.07%), Sweater (48.17%), Pants (47.37%).

This highlights the impact of discounts on specific product sales and subscriber engagement.

# Customer Segmentation & Loyalty



The majority of our customer base falls into the 'Loyal' segment, indicating strong retention. Repeat buyers (those with >5 purchases) are more likely to subscribe (958 subscribers vs. 2518 non-subscribers).

# Revenue by Age Group





# Business Recommendations

## Boost Subscriptions

Promote exclusive benefits to increase subscriber base.

## Customer Loyalty Programs

Reward repeat buyers to foster loyalty and retention.

## Targeted Marketing

Focus efforts on high-revenue age groups and express-shipping users.

## Product Positioning

Highlight top-rated and best-selling products in campaigns.