Online Retail Data Analysis: Executive Summary

1. Objective

- Analyze online retail transactions to uncover sales trends, customer segments, and actionable business insights.

2. Methodology

Data Cleaning

- Removed administrative/non-sale transactions (e.g., StockCode: 'AMAZONFEE', 'BANK CHARGES', and others).
- Excluded rows with missing or blank CustomerID.
- Filtered out transactions with UnitPrice = 0.

Feature Engineering

- Split InvoiceDate into Date and Time columns.
- Created TotalCost = UnitPrice \times Quantity for each transaction.

Descriptive Analysis & Visualization

- Identified top products by quantity and revenue.
- Analyzed sales trends by month and by country.
- Visualized purchase patterns (e.g., UnitPrice vs Quantity scatter plot).

Customer Segmentation (RFM Analysis)

- Calculated Recency, Frequency, and Monetary values for each customer.
- Standardized RFM features and applied KMeans clustering.
- Labeled clusters: High-value, Loyal, At-risk, Low-value.
- Visualized clusters using pair plots and PCA.

3. Key Findings

- Top Products: Most sales volume and revenue are concentrated in a few products.
- Sales Trends: Clear seasonality and monthly fluctuations in sales.
- Geographic Insights: The UK dominates sales, but other countries contribute significant revenue.
- Customer Segments:
- High-value: Recent, frequent, high-spending customers.
- Loyal: Frequent buyers, moderate spend.
- At-risk: Previously valuable, now inactive.
- Low-value: Infrequent, low-spending customers.

4. Recommendations

- High-value: Retain with loyalty programs, exclusive offers.
- Loyal: Encourage referrals, maintain engagement.
- At-risk: Target with re-engagement campaigns and special offers.
- Low-value: Use introductory offers and education to increase engagement.
- **Product Strategy**: Focus on best-sellers for promotions and inventory.
- Geographic Expansion: Explore growth opportunities in high-revenue non-UK countries.

5. Visual Highlights

- Bar charts: Top products and countries.
- Line plot: Monthly sales trend.
- **Scatter plot**: UnitPrice vs Quantity.
- RFM cluster visualizations: Pair plot and PCA.