Customer Segmentation Report using RFM Analysis

1. Objective

The purpose of this project was to analyze customer purchasing behavior using **RFM** analysis (Recency, Frequency, Monetary) and segment customers into actionable groups. This segmentation allows the business to better target marketing strategies and improve customer retention.

2. Dataset

• Source: Kaggle – Online Retail dataset

Transactions: Dec 2010 - Dec 2011

• Total records after cleaning: 166,363

• Unique customers: 2,997

 Fields used: InvoiceNo, Quantity, InvoiceDate, UnitPrice, CustomerID, Country

3. Data Preparation

Steps taken:

- Converted <u>InvoiceDate</u> from text into proper datetime format.
- Removed missing CustomerIDs and cancelled orders.
- Filtered out records with negative or zero Quantity/UnitPrice.
- Created TotalPrice = Quantity × UnitPrice.

4. RFM Metrics

For each customer:

- Recency (R): Days since last purchase (lower = better).
- Frequency (F): Number of unique invoices (purchases).
- Monetary (M): Total money spent.

Summary:

• Recency: 1 – 698 days

• Frequency: 1 – 106 purchases

Monetary: £6 – £168,469

5. RFM Scoring

- Scores assigned from 1 (worst) to 5 (best).
- Recency: most recent → higher score.
- Frequency & Monetary: higher values → higher score.
- Final RFM Score: combination of R, F, M (e.g., 555 is the best).

Example: Customers with score **555** are top **spenders**, **frequent**, **and recent buyers**.

6. Customer Segmentation

Based on the RFM scores, customers were grouped into five segments:

- Champions (607 customers): most valuable customers they purchased recently, buy often, and spend the most.
- Loyal (693 customers): These customers buy frequently and consistently, but may not spend as much as Champions.
- Potential (821 customers): This is the largest segment. They show positive signals either spending decently, buying a few times, or recently engaged but are not yet Loyal.
- At Risk (616 customers): Customers who used to buy but haven't purchased recently. Their engagement is dropping, and they risk becoming Lost.
- Lost (260 customers): These customers have not purchased for a very long time and show minimal activity.

7. Visualizations (Seaborn)

- Bar Chart: Distribution of customers across segments.
- **Heatmap:** Average Recency, Frequency, Monetary per segment.
- Scatter Plot: Recency vs Frequency, colored by segment.

These clearly show that:

- Champions are recent, frequent, and high-spending.
- Potential customers form the largest group (opportunity for conversion).
- At Risk + Lost segments together are sizable → require reactivation efforts.

8. Marketing Recommendations

Champions (607 customers)

VIP treatment, exclusive offers, referral incentives.

Loyal (693 customers)

• Cross-sell and upsell, subscription bundles, loyalty programs.

Potential (821 customers)

Convert with discounts, product recommendations, reminders.

At Risk (616 customers)

Win-back campaigns, surveys, urgent offers.

Lost (260 customers)

• Reactivation campaigns, big discounts, or reduce effort if unresponsive.

9. Conclusion

The RFM analysis provided actionable segmentation of the customer base. The business should **invest in retaining Champions and Loyal customers**, while **re-engaging At Risk and Lost customers**. Converting **Potential customers** into Loyal ones represents the biggest growth opportunity. By applying these insights, marketing campaigns can be more targeted and cost-effective, improving overall customer lifetime value.