Data-Driven Insights to Boost OTA Sales & Profitability

Problem Statement: Our objective is to analyze **6 months of booking data** from an **Online Travel Agency (OTA)** to identify key trends and potential areas of improvement in sales and profitability. The dataset includes various fields like **buyer_id** (unique customers), **supplier_id** (flight suppliers), **selling price**, **refund status**, and more.

Data Overview:

- Buyer Information: Unique customer identification through buyer id
- Supplier Information: Unique identification of suppliers through supplier_id
- Booking Dates: Data spread across six months, allowing monthly and weekly trend analysis.
- Payment Methods: Different payment channels used by customers.
- Refund Status: Insights into refund behavior and the financial impact.
- Sales Channels: Platforms such as Android, iOS, and Web.

Analysis Approach: Using **Python** and libraries like **Pandas**, and **Matplotlib**, we've processed, cleaned, and analyzed the data to extract meaningful insights. Python has allowed us to efficiently:

- Aggregate data to observe trends in payment methods, refund behavior, and sales channels.
- Generate visualizations to highlight trends and areas of concern.
- Quantify metrics like revenue, refund amounts, customer loyalty, and performance across channels.

Goal:

- Identify actionable insights to increase sales and profitability.
- Provide strategic recommendations to improve customer experience and channel efficiency.



Data Insights and Analysis

Revenue, Profit and Refunds

Observation: Negative Profit Despite Positive Sales

• **Total Revenue:** ₹24,153,728

• **Profit:** ₹-5,474,931

• While the selling price exceeds the cost price, refunds totaling ₹10,354,492 have turned the business loss-making.

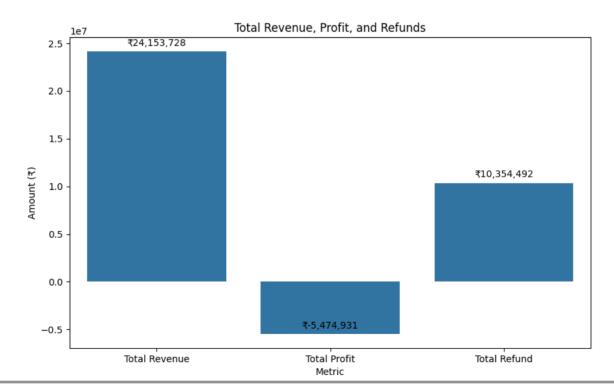
Analysis:

• High refund amounts are eroding profitability.

• The business is generating sales but losing revenue through excessive refunds.

Recommendations:

- Reduce refund rates by enhancing customer experience.
- Implement stricter **refund policies** for non-critical issues.
- Analyze **refund trends** to identify and mitigate root causes.



Payment Method Sales Distribution

Data: Average sales volume across payment methods is approximately ₹604,000. However, PayPal dominates the total sales volume. **Observation**:

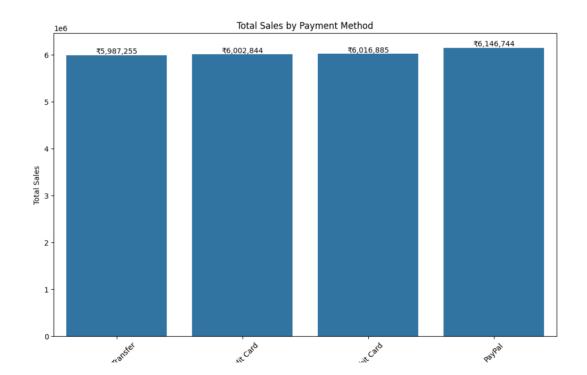
• No significant variation in sales across different payment methods, but PayPal shows higher sales volume.

Analysis:

• This indicates customer preferences may lean towards PayPal, potentially influenced by promotions or ease of use.

Recommendation:

- Short-Term: Focus marketing campaigns around PayPal to leverage its dominant position.
- Long-Term: Offer incentives (e.g., cashback or discounts) to promote lesser-used payment methods, helping diversify sales channels and reduce dependency on PayPal.



High Refund Count

Data: Refunds - Yes: 22,429; No: 9,811

Observation:

• Refunds are 70% higher in 'Yes' status than 'No', potentially affecting immediate profitability.

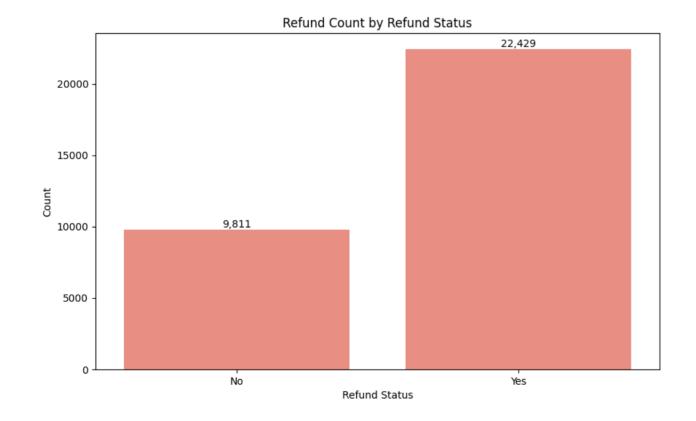
Analysis:

• Likely due to customer dissatisfaction or operational issues during fulfillment.

• Average refund amount is ~₹461

Recommendation:

• Conduct a **root cause analysis** of refund triggers and develop a **refund prevention plan** (e.g., clearer refund policies, better customer support).



Web Channel Dominance

Data: Web contributes **49.91**% of total sales (₹12.05M out of ₹24.15M).

Observation:

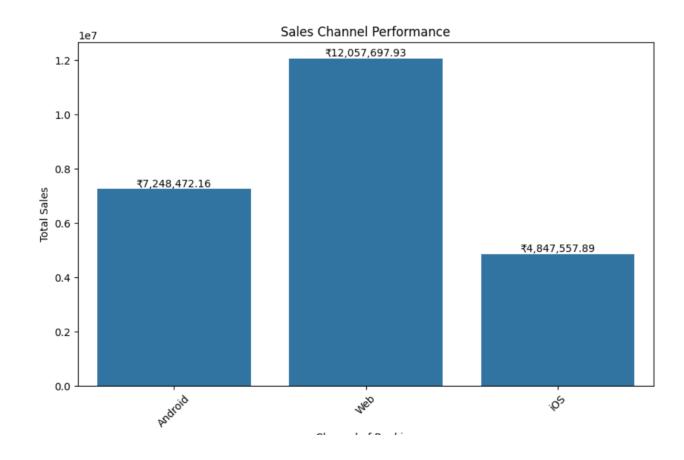
• Web is the dominant sales channel, contributing **nearly half** of total revenue.

Analysis:

• Shows the Web platform as a strong customer acquisition tool, with Android and iOS trailing behind.

Recommendation:

• Invest in optimizing and expanding Web marketing efforts to retain its top status. Prioritize **cross-channel promotion** to reduce over-reliance on a single channel.



Monthly Revenue Stability

Observation:

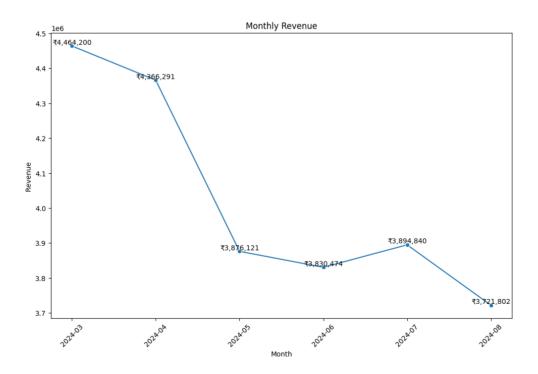
- The monthly revenue has seen a gradual decline from ₹4,464,200 in March to ₹3,721,802 in August.
- Although there was a dip in May and June, the revenue shows slight recovery in July, but still remains below March's peak.

Analysis:

- This decline could be attributed to seasonal trends, changes in customer demand, or external factors affecting bookings (e.g., fewer travel deals or promotions).
- Another potential cause might be competition or economic factors impacting customer spending during the later months.

Recommendation:

- **Short-Term**: Launch targeted promotions or discounts in the months with lower revenue (May to August) to re-engage customers and boost bookings. A loyalty program or referral discounts might help bring back customers.
- **Long-Term**: Analyze seasonal trends and customer booking patterns to anticipate revenue dips and proactively introduce campaigns (e.g., early-bird discounts or bundle offers) during these periods to maintain revenue stability.



Weekly Revenue Stability

Observation: Decline in Weekly Revenue

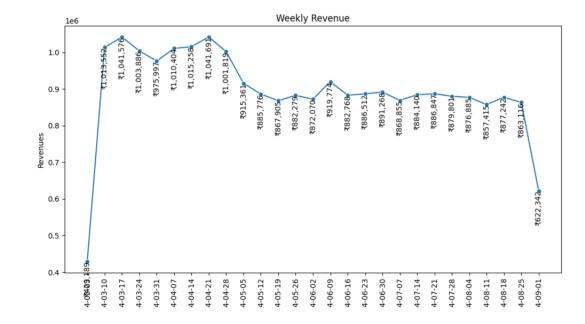
- 13% decline observed from Week 9 (₹1,001,819) to Week 12 (₹867,905).
- Revenue in Week 15 showed improvement but did not recover fully.
- Continuous drops in later weeks could become irrecoverable without intervention.

Analysis:

- Seasonal fluctuations and end of holiday periods.
- **Increased competition** with better offers.
- **High refund rates** contributing to revenue drops.

Recommendation:

- Targeted promotions for underperforming weeks.
- **Dynamic pricing** to stay competitive.
- Loyalty programs to drive repeat business.



Analysis of Customer Loyalty vs. Selling Price

Box Plot Overview:

• Median Selling Price: ~₹750

• Interquartile Range (IQR):

○ Lower Quartile (25th percentile): $\sim ₹400$

• Upper Quartile (75th percentile): ~₹1100

• Outliers: A few values significantly outside the IQR

Analysis:

Median Price: The typical selling price for loyal customers is around ₹750, indicating a central tendency in spending.

• Price Range: 50% of loyal customers' transactions fall between ₹400 and ₹1100, showing diverse spending behavior.

• Outliers: High and low outliers suggest variability in transaction values, potentially due to special offers or premium products.

Recommendations

1. Optimize Pricing Strategies: Tailor pricing and promotions to different spending segments to maximize profitability.

2. Enhance Loyalty Programs: Design rewards and incentives that cater to various spending levels among loyal customers.

3. Monitor Trends: Regularly track purchasing patterns to adjust strategies and improve customer engagement.

