

CAPSTONE PROJECT REPORT

Title: An Analytical Study of Retail Profitability Drivers Using Transaction-Level Data

Sector: Retail & Commerce

Team Details:

- Guru Manohar Gupta
- Dadi Dinesh
- Mouli Srivastava
- Ravleen Singh
- Aarsh Bhatnagar
- Vidit Sachan

Institute: Newton School Technology

1. EXECUTIVE SUMMARY

Problem

Retail businesses often achieve strong sales volumes but struggle with consistent profitability. Analysis of 9,994 transactions (2014–2017) shows an overall profit margin of 12.47%, yet 18.72% of transactions are loss-making. A significant portion of these losses remain hidden within aggregated revenue figures, making it difficult for management to identify profit leakage drivers related to discounting, category performance, and regional variation.

Approach

This project analyzes transaction-level retail data using Google Sheets as the primary analytics platform.

The workflow included:

- Data cleaning and standardization
- Creation of derived KPIs such as Profit Margin and Loss Flag
- Pivot table analysis across Category, Region, Segment, and Discount levels
- Development of an interactive dashboard for performance monitoring

The objective was to identify where profits are generated versus where margins are eroded and to build a structured decision-support framework.

Key Insights

- 18.72% of transactions generate negative profit.
- 60.93% of loss-making transactions occur when discounts exceed 30%, identifying discounting as the primary profit leakage driver.
- Furniture operates at a low profit margin of 2.49%, significantly below Technology (17.40%) and Office Supplies (17.04%).
- Profit contribution is uneven across categories and regions, indicating performance concentration rather than balanced growth.

Key Recommendations

- Implement discount control thresholds, particularly above the 30% range.
- Re-evaluate pricing and promotional strategies for the Furniture category.
- Prioritize investment and promotion in higher-margin categories.
- Use the dashboard for continuous monitoring of margin risk and category performance.

2. Sector and Business Context

Sector Overview

The Retail & Commerce sector operates on high-volume transactional sales across multiple product categories and regions. Profitability depends not only on revenue generation but also on effective pricing, discount control, and category performance management.

Current Challenges

Retail businesses often face margin pressure due to excessive discounting and uneven category contribution. In the analyzed dataset (2014–2017), 18.72% of transactions are loss-making, indicating hidden profit leakage despite overall positive sales performance.

Why This Problem Was Chosen

The dataset shows clear variation in profitability across discount levels and product categories, with a significant concentration of losses in high-discount transactions. This highlights the need for KPI-driven analysis and dashboard monitoring to improve profitability stability and decision-making.

3. Problem Statement

Retail businesses often experience a mismatch between revenue growth and profitability. High sales volumes may coexist with declining margins due to excessive discounting, inefficient product mixes, or region-specific performance issues. Without transaction-level analysis, these profit leakages remain hidden.

Core Problem Statement:

How can retail management improve profitability and ensure sustainable revenue growth by analyzing transaction-level sales data, discount behavior, and regional performance?

The objective is to identify where profits are generated versus where they are eroded and to support strategic decision-making using data-driven insights.

4. Project Objectives

The key objectives of this capstone project are:

- Analyze overall sales and profit performance across products, regions, and customer segments
- Evaluate the impact of discounting strategies on profitability
- Identify loss-making transactions and underperforming categories
- Compare regional and category-level performance to detect inefficiencies
- Generate actionable insights to support managerial decision-making

5. Dataset Description

The analysis uses the **Superstore Sales Dataset**, which contains detailed transaction-level data from a U.S. retail chain.

Dataset Characteristics:

- **Nature:** Retail / Commerce transactional data
- **Granularity:** Row-level (each row represents a product sold within an order)
- **Size:** ~10,000 rows (approximately)
- **Time Period:** 2014–2017

Key Columns:

- Order details: Order ID, Order Date, Ship Date, Ship Mode
- Customer details: Customer ID, Customer Name, Segment
- Location details: City, State, Region
- Product details: Category, Sub-Category, Product Name
- Financial metrics: Sales, Quantity, Discount, Profit

6. Data Cleaning and Preparation

The raw dataset contained inconsistencies and required structured cleaning. All preparations were performed in **Google Sheets**.

Cleaning Steps Performed:

- Removed duplicate records using Order ID validation
- Standardized text fields (Category, Sub-Category, Product Names, Customer Names)
- Converted Order Date and Ship Date into consistent date formats
- Rounded Sales and Profit values to two decimal places
- Ensured consistent numeric formatting across financial fields

Derived Columns Created:

- Order Year and Order Month from Order Date
- Shipping Delay calculated as Ship Date minus Order Date
- Discount Percentage derived from discount values
- Loss Flag to identify negative-profit transactions

These steps ensure analytical accuracy and dashboard readiness.

7. Key Performance Indicators (KPIs)

The following KPIs were designed and maintained:

- **Total Sales** – Overall revenue generated
- **Total Profit** – Net profitability
- **Profit Margin** – Profit as a percentage of sales
- **Count of Orders** – Computed total orders in the dataset (cleaned)

8. Advanced Analysis

The analysis followed a structured exploratory workflow:

- Pivot tables summarize sales and profit by Category, Region, Segment, and Year, delay of orders, Profit.
- Trend analysis examined changes in sales and profit over time
- Comparative analysis evaluated category-wise and region-wise performance
- Discount-to-profit analysis assessed pricing effectiveness
- Filters and slicers enabled interactive drill-down analysis

9. Dashboard Design

A comprehensive dashboard was built in **Google Sheets**.

Dashboard Components:

- KPI summary cards (Sales, Profit, Profit Margin, Orders Count)
- Category-wise and Sub-Category wise comparison charts
- Sales and profit trend charts
- Discount vs Profit analysis visuals
- Most selling category per region
- Interactive filters for Region, Category, and Segment, Shipping speed, sub-category, loss-severity.



10. Insights Summary

- Profit margin erosion strongly linked to high discount bands (>30%)
- Furniture contributes high revenue but low profitability ratio
- Technology provides highest profit efficiency
- West region is the most stable profit contributor
- Central region shows higher concentration of loss transactions
- Consumer segment drives majority of total sales

- Corporate segment shows better margin stability
- Loss-making transactions cluster within specific sub-categories
- Shipping delay shows minimal correlation with profit decline
- Discount control could significantly improve overall margin performance

11. Recommendations

- Introduce discount caps to prevent margin erosion
- Focus investments on high-margin categories
- Reevaluate pricing strategies for Furniture
- Replicate best practices from high-performing regions
- Use dashboards for continuous performance monitoring

12. Impact Estimation

The analysis of 9,994 transactions shows an overall profit margin of 12.47%, with 18.72% of transactions generating negative profit.

Cost Savings

60.93% of all loss-making transactions occur when discounts exceed 30%.

Controlling high-discount transactions could reduce nearly half of current loss exposure and improve overall profit margin by an estimated **3–5 percentage points**, depending on implementation discipline.

Profitability Optimization

Furniture generates only 2.49% profit margin compared to:

- Office Supplies – 17.04%
- Technology – 17.40%

Improving Furniture pricing or discount structure could significantly increase overall profitability without increasing sales volume.

Risk Reduction

With nearly 1 in 5 transactions being loss-making, implementing margin thresholds and discount monitoring can materially reduce profit volatility and protect earnings stability.

12. Limitations

Dataset includes only final Profit values; no detailed cost breakdown is available for deeper margin analysis.

- No return or refund data is provided, so post-sale profitability adjustments cannot be evaluated.
- Data is limited to the period 2014–2017 and may not reflect current market conditions.
- No inventory or supply chain variables are available; operational analysis is limited to Shipping Delay only.
- Customer data is limited to segments; no repeat purchase or lifetime value information is available.
- External factors such as competition, economic changes, or promotional campaigns are not captured in the dataset.

13. Future Scope

- Incorporate detailed cost components to perform deeper margin and cost-driver analysis.
- Integrate return and refund data to evaluate true net profitability.

- Develop predictive models to forecast sales and profit trends based on discount and category patterns.
- Perform customer-level analysis such as repeat purchase behavior and lifetime value estimation.
- Expand the dashboard into a real-time monitoring system for continuous profitability tracking.

14. Conclusion

This project analyzed 9,994 retail transactions (2014–2017) using structured data cleaning, KPI computation, pivot analysis, and a Google Sheets dashboard.

The findings show an overall profit margin of 12.47%, with 18.72% of transactions generating losses. Notably, 60.93% of loss-making transactions occur when discounts exceed 30%, highlighting discount control as a key profitability lever. Category analysis further revealed that Furniture operates at a significantly lower margin (2.49%) compared to Technology (17.40%) and Office Supplies (17.04%).

The dashboard provides a practical decision-support framework to monitor discount risk, optimize category performance, and improve profitability stability.

15. Team Contribution Details

Team Member	Dataset & Sourcing	Cleaning	KPI & Analysis	Dashboard	Report Writing	PPT	Overall Role
-------------	--------------------	----------	----------------	-----------	----------------	-----	--------------

Guru Manohar Gupta	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Team Lead
Dadi Dinesh	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>			Data Analys t
Mouli Srivasthav a		<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>		<input checked="" type="checkbox"/>	Data Analys t
Ravleen Singh	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>			<input checked="" type="checkbox"/>	Data Analys t
Aarsh Bhatnagar	<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>			<input checked="" type="checkbox"/>	<input checked="" type="checkbox"/>	Data Analys t

Vidit Sachan						<input checked="" type="checkbox"/>	Data Analyst

Declaration

We declare that this project is our original work and has been completed in accordance with academic integrity guidelines.

Signatures:

Guru Manohar Gupta :



Dadi Dinesh :



Aarsh Bhatnagar :



Vidit Sachan :



Ravleen Singh :



Mouli Srivastava :



Date: 18-02-2026