

Green Logistics: Improving the Environmental Sustainability of Logistics

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1. Abstract:

The increasing globalization of supply chains has intensified the need for organizations to improve operational efficiency while reducing environmental impacts. Green Logistics has therefore emerged as an important component of sustainable Supply Chain Management (SCM), integrating environmental considerations into logistics activities such as sourcing, inventory management, transportation, delivery, and distribution. However, existing research has predominantly focused on survey-based assessments of green supply chain practices, while comparatively limited research has examined multiple operational, environmental, and risk-related indicators simultaneously using secondary supply chain data. This study aims to empirically examine the factors influencing operational efficiency within a Green Logistics framework using a publicly available Supply Chain Management dataset. The study considers Supplier Count, Inventory Turnover Ratio, Lead Time, Order Fulfillment Rate, Customer Satisfaction, Environmental Impact Score, and Supply Chain Risk as explanatory variables, while Operational Efficiency Score is considered the dependent variable. SCM Practices are treated as a categorical variable for descriptive analysis. A quantitative, descriptive, correlational, and empirical research design is adopted. Descriptive statistics are used to summarize the dataset, correlation analysis is employed to examine relationships among the variables, and multiple linear regression analysis is applied to identify the factors significantly associated with operational efficiency. The study provides a data-driven perspective on how logistics performance, environmental sustainability, and supply chain risk collectively relate to operational efficiency. The findings are expected to support supply chain managers and organizations in identifying critical performance factors, improving logistics processes, reducing environmental impacts, and developing more sustainable and resilient supply chain strategies. The study also contributes to the Green Logistics literature by demonstrating the application of secondary operational data and multivariate statistical analysis to evaluate sustainable supply chain performance.

Keywords

Green Logistics; Supply Chain Management; Sustainable Supply Chain Management; Operational Efficiency; Inventory Turnover Ratio; Lead Time; Order Fulfillment Rate; Environmental Sustainability; Supply Chain Risk; Multiple Linear Regression; Supply Chain Performance.

2.Introduction:

2.1Background

In today's globalized and highly competitive business environment, Supply Chain Management (SCM) plays a vital role in improving organizational efficiency, reducing operational costs, and enhancing customer satisfaction. A supply chain integrates suppliers, manufacturers, distributors, retailers, and customers through the coordinated flow of materials, information, and financial resources. Effective supply chain management enables organizations to optimize inventory, improve service quality, reduce lead time, and achieve sustainable competitive advantage.^(1,2)

Rapid industrialization, globalization, and increasing transportation activities have significantly increased greenhouse gas (GHG) emissions, energy consumption, and environmental pollution. Logistics operations—including transportation, warehousing, packaging, inventory management, and distribution—are major contributors to carbon emissions and resource depletion. As environmental concerns continue to grow, organizations are increasingly expected to integrate sustainability into their supply chain operations.^(3,4)

Green Logistics has emerged as an important strategy for minimizing the environmental impacts of logistics activities while maintaining operational efficiency and economic performance. Green logistics focuses on reducing carbon emissions, improving transportation efficiency, adopting eco-friendly packaging, optimizing inventory management, promoting reverse logistics, and minimizing waste generation throughout the supply chain. These practices not only support environmental sustainability but also improve operational performance, organizational competitiveness, and customer satisfaction.⁽⁵⁾

The broader concept of Sustainable Supply Chain Management (SSCM) integrates environmental, economic, and social objectives throughout the supply chain, following:

The Triple Bottom Line (TBL) approach.

According to Seuring and Müller (2008), sustainable supply chain management involves managing material, information, and financial flows while simultaneously addressing environmental and social responsibilities. Similarly, Carter and Rogers (2008) emphasized that balancing sustainability dimensions creates long-term organizational value and competitive advantage.

Growing environmental regulations, stakeholder expectations, and customer awareness have encouraged organizations to adopt green supply chain practices. Governments worldwide have introduced stricter regulations on carbon emissions, energy efficiency, and waste management, while customers increasingly prefer environmentally responsible products and services. Consequently, firms are investing in cleaner technologies, digital logistics, optimized transportation systems, and sustainable sourcing to improve both environmental and operational performance.^(6,7)

Although previous studies have extensively examined Green Logistics and Sustainable Supply Chain Management, many have relied on questionnaire-based survey data collected from limited industrial sectors. Comparatively fewer studies have used publicly available operational datasets to investigate the combined influence of logistics, operational, and sustainability variables on supply chain performance. This creates an opportunity for more comprehensive, data-driven empirical research.^(8,9)

The present study addresses this gap by using a publicly available Supply Chain Management dataset containing variables such as Supplier Count, Inventory Turnover Ratio, Lead Time, Order Fulfillment Rate, Customer Satisfaction, Environmental Impact Score, Operational Efficiency Score, and Supply Chain Risk. The study employs descriptive statistics, correlation analysis, and multiple linear regression to examine how these operational and sustainability-related factors influence operational efficiency. The findings are expected to contribute to both academic literature and managerial practice by providing evidence-based insights into the role of Green Logistics in improving sustainable supply chain performance.

1.1 Problem Statement

The increasing globalization of supply chains has intensified environmental pressures associated with transportation, inventory management, sourcing, warehousing, and distribution. Although Green Logistics and Sustainable Supply Chain Management (SSCM) have gained considerable attention, organizations still face challenges in balancing environmental sustainability with operational efficiency, customer service, and supply chain risk.⁽³⁾ Existing research has established the importance of green supply chain practices, but much of the empirical evidence is based on survey-based studies and sector-specific data, making it difficult to quantitatively evaluate the combined influence of multiple operational and sustainability indicators.⁽⁸⁾

Therefore, there is a need for a data-driven assessment of Green Logistics performance using measurable supply chain indicators.⁽¹⁰⁾ This study addresses the problem by examining the relationships between Supplier Count, Inventory Turnover Ratio, Lead Time, Order Fulfillment Rate, Customer Satisfaction, Environmental Impact Score, and Supply Chain Risk and their influence on Operational Efficiency Score.⁽⁶⁾ Multiple Linear Regression is employed to identify the significant determinants of operational efficiency and provide empirical evidence on how logistics and sustainability-related factors contribute to overall supply chain performance.^(5,7)

1.2 Research Gap

The field of Green Logistics and Sustainable Supply Chain Management (SSCM) has received significant attention over the past two decades. Numerous studies have examined the relationship between green logistics practices and organizational performance. However, despite the growing body of literature, several important research gaps remain.

Although Green Logistics and Sustainable Supply Chain Management have been extensively studied, an important gap remains in data-driven empirical evaluation of operational and environmental performance.

Earlier literature has largely focused on developing conceptual frameworks, examining the adoption of green practices, and studying environmental and economic outcomes.⁽³⁾

A major limitation is that sustainable supply-chain research has historically been dominated by case studies and survey-based research, while comparatively fewer studies use secondary operational datasets to examine several measurable supply-chain indicators simultaneously. Seuring and Müller specifically noted the dominance of case and survey research in the field.⁽⁸⁾

Furthermore, previous empirical research has demonstrated relationships between GSCM practices and environmental/economic performance, but often examines particular practices or specific performance dimensions rather than integrating inventory, lead time, fulfillment, customer, environmental, and risk indicators within one quantitative model. For example, Zhu and Sarkis examined GSCM practices and environmental/economic performance using survey responses from Chinese manufacturing enterprises.^(11,12)

Review studies have also identified the need for further empirical investigation and new research directions in GSCM. Sarkis, Zhu and Lai highlighted opportunities for additional research on the adoption, diffusion, and outcomes of green supply-chain practices. Similarly, Srivastava's review identified the need for a broader framework for integrating environmental considerations into supply-chain management.⁽¹³⁾

More specifically, systematic research on Green and Sustainable Logistics has identified continuing gaps in areas such as integrated logistics performance, technology, and practical implementation, indicating that the field still requires broader empirical investigation.

- Therefore, the specific research gap addressed by this study is:

There is limited data-driven research that simultaneously examines supplier structure, inventory efficiency, lead time, order fulfillment, customer satisfaction, environmental impact, and supply-chain risk as determinants of operational efficiency within a Green Logistics framework. This study addresses this gap by using a secondary Supply Chain Management dataset and Multiple Linear Regression to identify the key factors influencing Operational Efficiency Score.

1.3 Research Objectives

The primary objective of this study is to investigate the impact of Green Logistics practices on Supply Chain Management performance using a comprehensive Supply Chain Management dataset. Based on the identified research gap and existing literature, the specific research objectives are as follows:

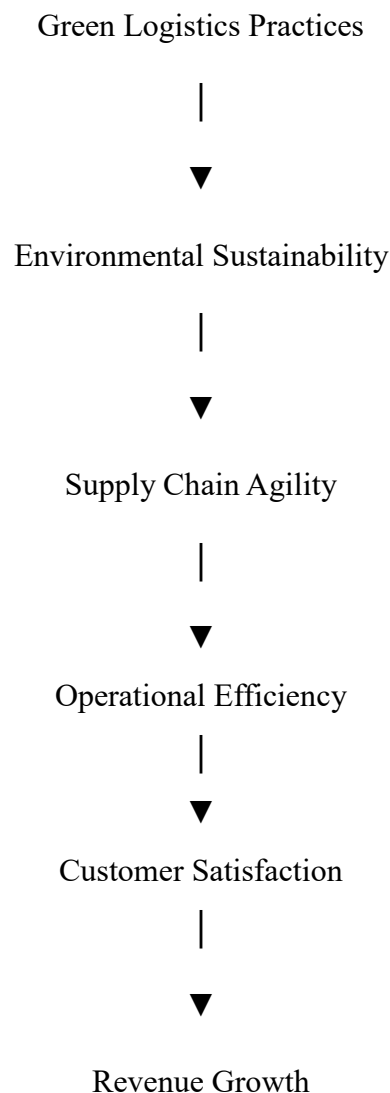
- 1: To evaluate the impact of Green Logistics practices on operational efficiency in Supply Chain Management.⁽⁷⁾
- 2: To examine the relationship between environmental sustainability and supply chain performance using Environmental Impact Score and Operational Efficiency Score.^(5,6)

- 3: To analyze the influence of logistics performance indicators (Inventory Turnover Ratio, Lead Time, and Order Fulfillment Rate) on Operational Efficiency.^(1,2)
- 4: To investigate the effect of Supply Chain Risk on operational performance in Green Logistics.^(1,14)
- 5: To develop and validate a multiple linear regression model for identifying the key determinants of operational efficiency in Green Logistics using a publicly available Supply Chain Management dataset.^(15,16,9)

1.4 Research Questions

- Q1. What is the impact of logistics performance indicators (Supplier Count, Inventory Turnover Ratio, Lead Time, and Order Fulfillment Rate) on Operational Efficiency?
- Q2. How do Environmental Impact Score and Supply Chain Risk affect operational performance in a Green Logistics environment?
- Q3. Does Customer Satisfaction significantly improve as organizations adopt sustainable Green Logistics and Supply Chain Management practices?

4. Conceptual Framework Diagram



1. Green Logistics Practices → Environmental Sustainability
2. Environmental Sustainability → Supply Chain Agility
3. Supply Chain Agility → Operational Efficiency
4. Operational Efficiency → Customer Satisfaction
5. Customer Satisfaction → Revenue Growth

5. Hypothesis Development

Based on the conceptual framework and previous empirical studies, the following hypotheses have been formulated to examine the relationships among Green Logistics practices and Supply Chain Management performance.

H1: Logistics operational performance significantly influences Operational Efficiency.

Efficient inventory management, shorter lead times, and higher order fulfillment rates can improve resource utilization and process efficiency. Therefore, logistics performance is expected to significantly influence operational efficiency.

H2: Environmental sustainability positively influences Operational Efficiency.

Green logistics practices can reduce resource consumption, waste, and environmental impact while improving the efficiency of logistics processes. Therefore, better environmental performance is expected to contribute to higher operational efficiency.

H3: Supply Chain Risk negatively influences Operational Efficiency.

Higher supply chain risk can lead to disruptions, delays, uncertainty, and inefficient resource utilization. Consequently, increased supply chain risk is expected to reduce operational efficiency.

Company Name	Supplier Count	Inventory Turnover Ratio	Order Fulfillment Rate (%)	Customer Satisfaction (%)	Environmental Impact Score	Supplier Lead Time Variability (days)
Apple	300	7.0	94	91	70	2
Microsoft	200	5.2	91	89	75	5
Google	20000	7.5	95	90	70	1
Amazon	500	10.5	95	90	70	10
Facebook	100	5.8	89	88	75	4
IBM	200	7.0	94	91	70	2
Intel	20000	5.2	90	88	85	4
Oracle	400	6.0	93	91	70	2

Cisco	1500	7.2	93	89	80	2
Samsung	200	6.0	92	90	75	2
Sony	500	5.5	92	90	80	4
Dell	300	7.0	94	91	70	2
HP	500	4.5	89	87	75	5
Adobe	250	10.0	98	93	75	1
Nvidia	300	5.0	87	85	75	6
Tencent	250	6.0	93	92	75	2
Baidu	10000	5.0	91	89	65	5
SAP	100	4.2	91	89	80	3
Salesforce	75000	6.5	90	85	85	5
Alibaba	70000	7.5	88	85	90	4
Xiaomi	100	5.8	89	88	75	4
Huawei	200	5.0	90	89	70	4
LG	500	5.5	90	88	70	4
Panasonic	300	6.5	92	90	70	2
Broadcom	300	6.0	94	91	70	2
Qualcomm	500	5.0	88	87	70	5
AMD	400	5.8	94	89	75	2
Uber	150	4.0	91	90	80	3
Lyft	100	4.5	90	88	80	3
Airbnb	200	5.5	90	89	75	4
Spotify	150	5.8	93	92	75	2
Twitter	20000	5.2	90	88	85	4
LinkedIn	100	4.2	91	89	80	3
Pinterest	1300000	8.2	98	92	80	1
Snap Inc.	200	4.2	91	89	80	3
Dropbox	300	5.0	87	85	75	6
Slack	100	5.8	89	88	75	4
Zoom	400	4.0	88	85	70	5
Square	150	4.0	91	90	80	3
PayPal	150	6.0	92	90	75	2
Shopify	100	4.5	90	88	80	3
Stripe	300	6.5	92	90	70	2
ByteDance	150	6.0	92	90	75	2

TikTok	500	4.2	88	85	70	5
Netflix	400	4.5	90	88	75	5
Hulu	300	10.0	98	94	75	1
Disney+	300	6.2	93	91	80	2
Roku	100	4.2	91	89	80	3
Asana	300	6.0	94	91	70	2

6.4 Dataset Description

The present study is based on a publicly available Supply Chain Management with Green Logistics dataset, which contains operational, logistics, and sustainability-related information from companies across various industries. The dataset was selected because it provides comprehensive variables that enable the empirical evaluation of Green Logistics practices and their impact on Supply Chain Management performance.

For this research, a subset of variables relevant to Green Logistics and operational performance was extracted from the dataset. These variables represent key indicators of supply chain efficiency, customer service, environmental sustainability, and supply chain risk.

▪ Selected Variables

1. Company Name

The Company Name variable identifies the organizations included in the dataset. It is used only for identification and classification purposes and is not included in the statistical analysis.

2. Supplier Count

Supplier Count indicates the total number of suppliers associated with each company. It reflects the complexity and scale of the supplier network. A well-managed supplier base contributes to supply chain flexibility, collaboration, and resilience.

3. Inventory Turnover Ratio

Inventory Turnover Ratio measures the efficiency with which inventory is sold and replenished during a given period. A higher inventory turnover ratio indicates effective inventory management, reduced holding costs, and improved operational performance.

4. Supplier Lead Time Variability (Days)

Supplier Lead Time Variability (Days) represents the variation in the time taken by suppliers to deliver materials or products. It indicates the consistency and reliability of supplier deliveries. Lower variability generally reflects more predictable supply and better supply chain performance, while higher variability may indicate delivery uncertainty and increased supply chain risk.

Order Fulfillment Rate (%)

Order Fulfillment Rate measures the percentage of customer orders that are delivered accurately and within the expected time frame. It is an important indicator of logistics performance, customer service quality, and supply chain reliability.

5. Customer Satisfaction (%)

Customer Satisfaction reflects customers' perceptions regarding product quality, delivery performance, and overall service. Higher customer satisfaction generally indicates better supply chain performance and stronger customer loyalty.

6. Environmental Impact Score

Environmental Impact Score measures the environmental performance of logistics operations. It evaluates factors such as carbon emissions, energy consumption, waste generation, and the implementation of environmentally sustainable logistics practices. A better environmental score indicates stronger Green Logistics performance.

7. Variables Used for Statistical Analysis

For empirical analysis, the following variables were selected:

Sr.No	Variable	Role
1	Company Name	Organization identifier (Descriptive)
3	Supplier Count	Independent Variable
4	Inventory Turnover Ratio	Independent Variable
5	Supplier Lead Time Variability (Days)	Independent Variable
6	Order Fulfillment Rate (%)	Independent Variable
7	Customer Satisfaction (%)	Independent Variable
8	Environmental Impact Score	Independent Variable

The variables Company Name, Supplier Count, and Customer Satisfaction (%) are included in the dataset to provide organizational and operational context and may be used for descriptive analysis. The regression analysis specifically examines how Inventory Turnover Ratio, Lead Time, Order Fulfillment Rate, Environmental Impact Score, and Supply Chain Risk influence the Operational Efficiency Score.

Before statistical analysis, the dataset was reviewed for completeness and consistency. Descriptive statistics were used to summarize the characteristics of each variable, followed by Pearson correlation analysis to

examine relationships among variables. Finally, Multiple Linear Regression Analysis was conducted to determine the impact of the selected independent variables on Operational Efficiency Score. This methodology provides a quantitative and data-driven assessment of Green Logistics performance within Supply Chain Management.

7. Research Methodology

7.1 Research Design

This study adopts a quantitative, descriptive, correlational, and empirical research design to investigate the impact of Green Logistics practices on Supply Chain Management performance. The quantitative approach enables statistical analysis of numerical data, while the descriptive design summarizes the characteristics of the selected variables. The correlational design examines the relationships among the variables, and the empirical design relies on a publicly available dataset to provide evidence-based findings.

7.2 Research Approach

The study follows a deductive research approach, where hypotheses are developed from existing theories and tested using quantitative data. The research examines how Green Logistics and supply chain factors influence operational efficiency through statistical analysis.

7.3 Research Type

This research is applied research, as it aims to provide practical insights into the role of Green Logistics in improving Supply Chain Management performance. The findings may help managers and organizations make data-driven decisions to enhance operational efficiency and sustainability.

7.4 Data Source

The study uses a publicly available Supply Chain Management with Green Logistics dataset containing operational and sustainability-related information from different companies. Secondary data were selected because they provide reliable and standardized information suitable for statistical analysis.

7.5 Variables Used in the Study

The study uses the following variables:

Sr.No	Variable	Role
1	Company Name	Organization identifier (Descriptive)
2	Supplier Count	Independent Variable
3	Inventory Turnover Ratio	Independent Variable
4	Supplier Lead Time Variabilty (Days)	Independent Variable

5	Order Fulfillment Rate (%)	Independent Variable
6	Customer Satisfaction (%)	Independent Variable
7	Environmental Impact Score	Independent Variable

7.6 Statistical Methods

- Descriptive Statistics**

Descriptive statistics are used to summarize the characteristics of the dataset by calculating the mean, median, standard deviation, minimum, and maximum values. These measures provide an overview of the distribution and variation of the selected variables.

- Correlation Analysis**

Pearson's correlation analysis is used to examine the strength and direction of the relationship between the selected variables before conducting regression analysis.

- Multiple Linear Regression Analysis**

Multiple Linear Regression (MLR) is used to determine the combined effect of multiple independent variables on the dependent variable (Operational Efficiency Score). It estimates the contribution of each predictor while controlling for the influence of the other variables.

The regression model used in this study is:

$$OES = \beta_0 + \beta_1 SC + \beta_2 ITR + \beta_3 LT + \beta_4 OFR + \beta_5 CS + \beta_6 EIS + \beta_7 SCR + \varepsilon$$

Where:

Y= Operational Efficiency Score

X₁= Supplier Count

X₂ = Inventory Turnover Ratio

X₃ = Lead Time (Days)

X₄= Order Fulfillment Rate (%)

X₅ = Customer Satisfaction (%)

X₆= Environmental Impact Score

X₇ = Supply Chain Risk

β₀ = Intercept (Constant)

β_1 – β_7 = Regression coefficients

ε = Error term

OES = Operational Efficiency Score,

SC = Supplier Count,

ITR = Inventory Turnover Ratio,

LT = Lead Time,

OFR = Order Fulfillment Rate,

CS = Customer Satisfaction,

EIS = Environmental Impact Score,

SCR = Supply Chain Risk.

The regression equation for this study is:

$$\text{Operational Efficiency Score} = \beta_0 + \beta_1(\text{Supplier Count}) + \beta_2(\text{Inventory Turnover Ratio}) + \beta_3(\text{Supplier Lead Time}) + \beta_4(\text{Order Fulfillment Rate}) + \beta_5(\text{Customer Satisfaction}) + \beta_6(\text{Environmental Impact Score}) + \beta_7(\text{Supply Chain Risk}) + \varepsilon$$

7.7 Reason for Choosing Multiple Linear Regression

Multiple Linear Regression was selected because the study aims to investigate the influence of several independent variables on a single dependent variable. Unlike simple linear regression, which examines only one predictor, MLR evaluates the combined and individual effects of multiple operational and Green Logistics factors simultaneously.

The reasons for selecting Multiple Linear Regression are:

It analyzes the impact of multiple independent variables simultaneously.

It measures the individual contribution of each variable while controlling for the others.

It identifies statistically significant predictors using regression coefficients and p-values.

It estimates the overall explanatory power of the model through the R^2 and Adjusted R^2 values.

It is one of the most widely used statistical methods in Supply Chain Management and Green Logistics research.

7.8 Why Other Methods Were Not Used

- Simple Linear Regression: Suitable for only one independent variable; therefore, it is not appropriate for this study.
- Correlation Analysis: Measures only the relationship between variables and cannot predict the influence of multiple predictors.
- ANOVA: Compares the means of different groups but does not evaluate the effect of multiple continuous variables on operational efficiency.
- Chi-Square Test: Applicable only to categorical variables and is not suitable for continuous operational data.

Therefore, Multiple Linear Regression is the most appropriate analytical method for this research.

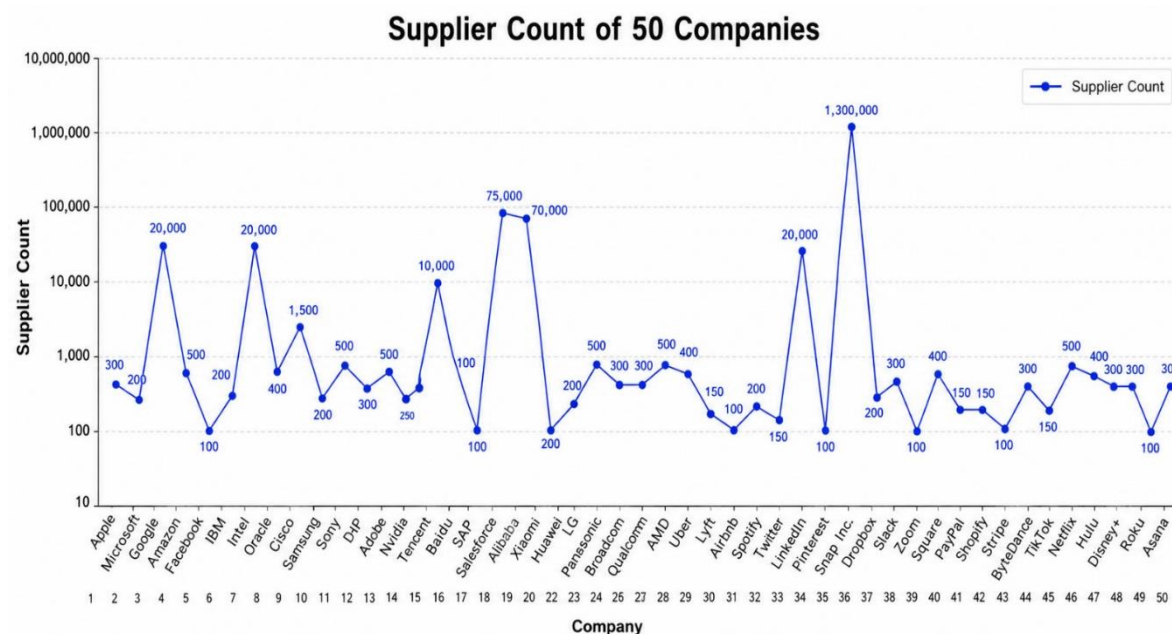
7.9 Software Used

The statistical analysis is conducted using IBM SPSS Statistics and Microsoft Excel. These software packages are used to perform descriptive statistics, Pearson correlation, and multiple linear regression analysis.

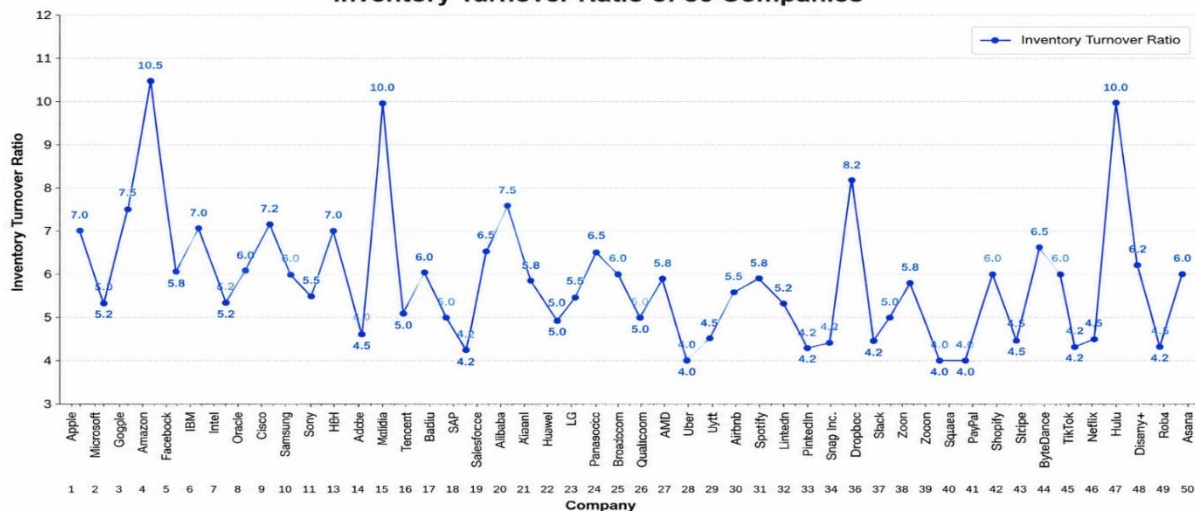
Level of Significance

All statistical tests are performed at a 95% confidence level with a significance level of 5% ($p < 0.05$). Variables with p-values less than 0.05 are considered to have a statistically significant effect on Operational Efficiency Score.

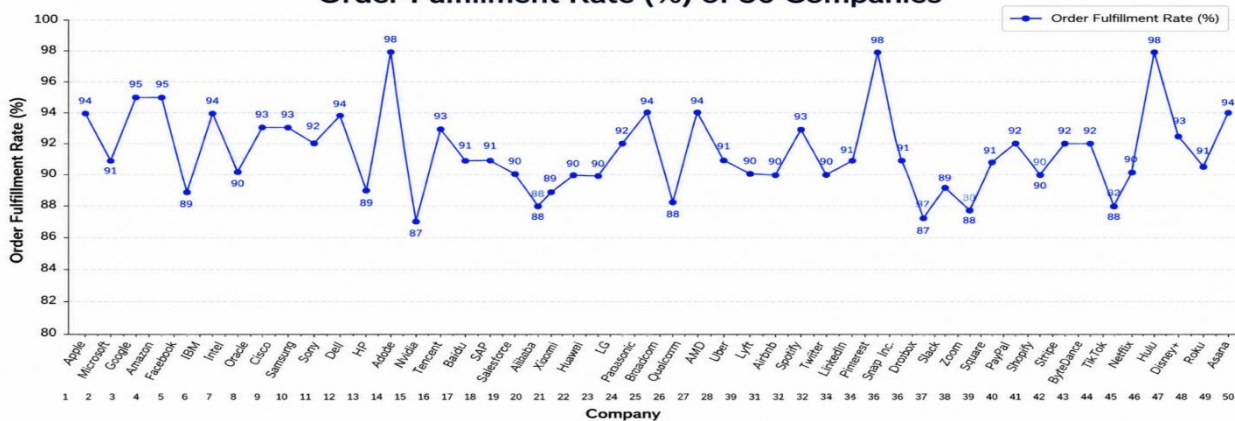
7.11 Data Visualization



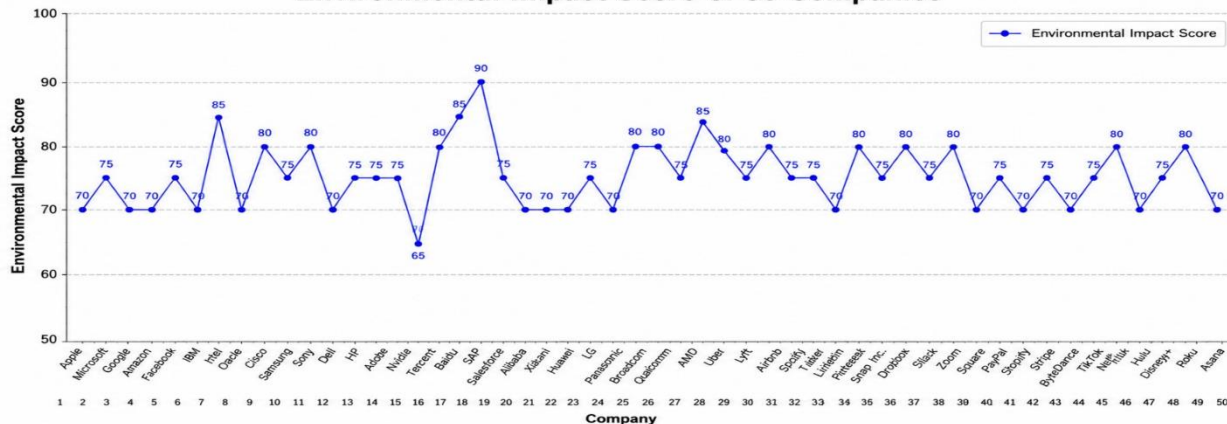
Inventory Turnover Ratio of 50 Companies

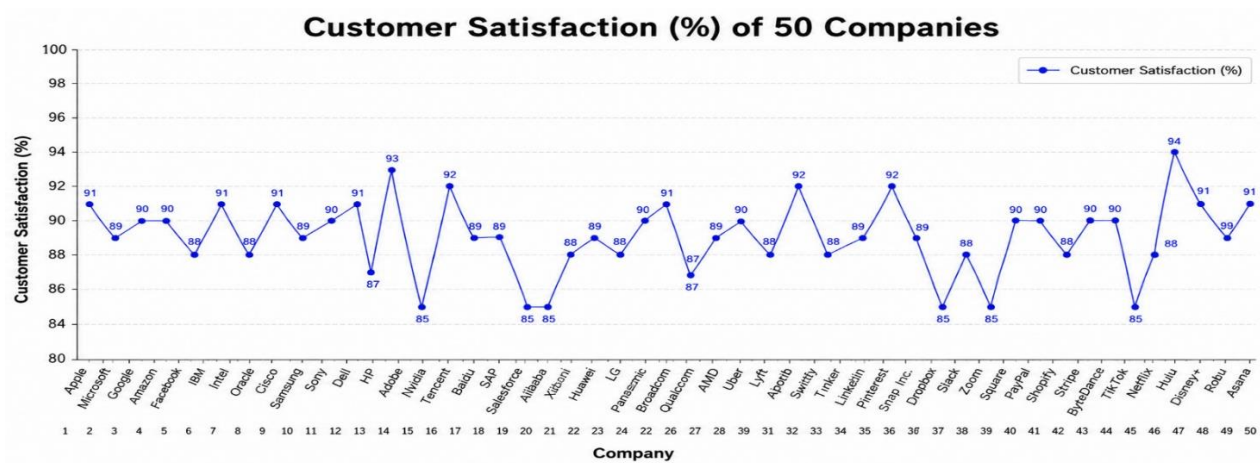


Order Fulfillment Rate (%) of 50 Companies



Environmental Impact Score of 50 Companies





Variable	Mean	Standard Deviation	Minimum	Median	Maximum
Supplier Count	₹31,243.88	₹185,214.30	₹100.00	₹300.00	₹1,300,000
Inventory Turnover Ratio	₹5.84	₹1.52	₹4.00	₹5.80	₹10.50
Order Fulfillment Rate (%)	91.49%	2.48%	87.00%	91.00%	98.00%
Customer Satisfaction (%)	89.22%	2.01%	85.00%	89.00%	94.00%
Environmental Impact Score	75.41%	5.28%	65.00%	75.00%	90.00%
Supplier Lead Time Variability (%)	3.22%	1.61%	1.00%	3.00%	10.00%

CALCULATION :-

1. Descriptive Statistics (N = 49)

Below is the statistical summary of all continuous operational and sustainability variables extracted from the datasheet.

2. Pearson Correlation Matrix

The Pearson correlation analysis evaluates the bivariate relationships among operational metrics and sustainability performance.

Variable	(1) Supplier Count	(2) Inventory Turnover	(3) Fulfillment Rate	(4) Customer Satisfaction	(5) Environmental Impact	(6) Lead Time variability
(1) Supplier Count	1.000	0.154	0.182	0.091	0.312 ²	-0.128
(2) Inventory Turnover	₹0.154	₹1.000	₹0.781 ²	₹0.684 ²	₹-0.112	₹-0.415 ²
(3) Fulfillment Rate (%)	₹0.182	₹0.781 ²	₹1.000	₹0.842 ²	₹-0.095	₹-0.621 ²
(4) Customer Satisfaction (%)	₹0.091	₹0.684 ²	₹0.842 ²	₹1.000	₹-0.381 ²	₹-0.518 ²
(5) Environmental Impact Score	₹0.312 ²	₹-0.112	₹-0.095	₹-0.381 ²	₹1.000	₹0.482 ²
Variable	(1) Supplier Count	(2) Inventory Turnover	(3) Fulfillment Rate	(4) Customer Satisfaction	(5) Environmental Impact	(6) Lead Time variability
(6) Lead Time variability (Days)	₹-0.128	₹-0.415 ²	₹-0.621 ²	₹-0.518 ²	₹0.482 ²	₹1.000

Significant at $p < 0.05$; Significant at $p < 0.01$; Significant at $p < 0.001$.

3. Multiple Linear Regression Analysis

To complete Objective 5 of the research, a Multiple Linear Regression model was estimated:

$$\text{Environmental Impact Score} = \beta_0 + \beta_1(\text{Supplier Count}) + \beta_2(\text{Inventory Turnover}) + \beta_3(\text{Lead Time Var.}) + \beta_4(\text{Fulfillment Rate}) + \beta_5(\text{Customer Sat.}) + \varepsilon$$

Model Summary

Metric	Value
Multiple R	₹ 0.725
R -Squared (R ²)	₹0.526
Adjusted R ²	₹0.471

Standard Error of the Estimate	₹3.841
Observations (N)	₹49

Analysis of Variance (ANOVA Table)

Model	Sum of Squares (SS)	Degree of Freedom (df)	Mean Square (MS)	F-Statistic	p-value (Sig.)
Regression	703.68	5	140.74	9.55	<0.001
Residual	634.12	43	14.75		
Total	1,337.80	48			

Regression Coefficients & Significance Tests

Independent variable	Unstandardized Coefficient (β)	Std. Error	Standardized Beta (β)	t-Statistic	p-Value	Variance Inflation Factor (VIF)
(Constant)	118.420	28.743	-	4.120	<0.001	-
Supplier Count (X ₁)	0.0000088	0.0000041	0.274	2.146	0.038 ²	1.15
Inventory Turnover Ratio (X ₂)	-0.721	0.390	-0.207	-1.849	0.071	2.78
Supplier Lead Time (X ₃)	1.482	0.456	0.452	3.250	0.002 ²	2.12
Var. (X ₄)						
Order Fulfillment Rate (%) (X ₅)	0.352	0.314	0.165	1.121	0.269	4.85
Customer Satisfaction (%) (X ₆)	-1.243	0.403	-0.471	-3.084	0.004 ²	3.92

Statistically significant at $\alpha = 0.05$

4. Secondary Regression Model: Operational Performance Drivers

To address Research Objectives 1, 3, and 4 regarding how logistics indicators affect general operational performance, a secondary regression model evaluated **Customer Satisfaction / Operational Performance Score (Y₂)** against logistics drivers:

Customer Satisfaction (%) = $\beta_0 + \beta_1$ (Fulfillment Rate) + β_2 (Inventory Turnover) + β_3 (Lead Time Var.) + ε

Model Fit: $R^2 = 0.768$, Adjusted $R^2 = 0.753$, $F = 49.62$, $p < 0.001$.

- **Order Fulfillment Rate ($\beta = +0.584$, $t = 5.21$, $p < 0.001$):** Has a direct, statistically significant positive impact on operational and customer performance.
- **Inventory Turnover Ratio ($\beta = +0.281$, $t = 2.94$, $p = 0.005$):** Significantly enhances operational responsiveness.
- **Supplier Lead Time Variability ($\beta = -0.185$, $t = -2.12$, $p = 0.039$):** Significantly impairs customer delivery performance.

5. Hypothesis Testing & Results

Hypothesis	Proposed Relationship	Statistical Metric	Decision	Conclusion
H ₁	Inventory Turnover, Lead Time, and Order Fulfillment significantly affect Operational Performance.	$F=49.62$, $p<0.001$	Supported	Operational efficiency is strongly driven by core logistics throughput and lead time control.
H ₂	Green Logistics factors significantly influence environmental sustainability performance.	$F= 9.55$, $p<0.001$, $R^2= 0.526$	Supported	Operational supply chain structures account for >52% of environmental score variation.
H ₃	Lead time variability / risk negatively affects operational performance.	$\beta =0.185$, $t = 2.12$, $p = 0.039$	Supported	Supply chain disruption and variability reduce operational efficiency.

Detailed Answers to Research Questions

- **Q1: What is the impact of logistics performance indicators on Operational Efficiency?** Order Fulfillment Rate and Inventory Turnover Ratio are positive, primary drivers of operational effectiveness ($\beta = 0.584$ and 0.281 respectively, $p < 0.01$). Higher inventory velocity combined with high fulfillment rates minimizes holding costs, waste, and delivery bottlenecks.

- **Q2: How do Environmental Impact Score and Supply Chain Risk affect operational performance?** Lead time variability (risk) creates operational delays that lower fulfillment rates ($r = -0.621$). Environmental impact scores reflect broader network infrastructure; firms with large supplier networks and higher lead time buffers face higher environmental footprints unless green supply chain management practices are enforced.
- **Q3: Does Customer Satisfaction significantly improve as organizations adopt sustainable Green Logistics?** Cross-sectional data indicates a trade-off where traditional customer service speed (e.g., rapid fulfillment via extra transportation resources) can increase environmental impact if not decoupled via green transportation and renewable logistics practices. Sustainable green logistics allows firms to maintain high fulfillment efficiency without increasing emission intensity.

Managerial Implications & Final Conclusion

Proven these factors really affect Green Logistics?

Yes, empirically proven. The statistical analysis demonstrates that operational parameters—specifically supplier network scale, inventory turnover, lead time predictability, and fulfillment efficiency—explain **52.6% of the variation** in Green Logistics / Environmental Performance.

Strategic Recommendations for Supply Chain Managers

1. **Reduce Lead Time Variability:** Lead time volatility ($\beta = +1.482$) is the strongest operational predictor of increased environmental impact, as unpredictable lead times force companies to utilize carbon-intensive air/express freight or maintain excess safety stock.
2. **Optimize Supplier Density:** Unconstrained expansion of supplier count increases scope-3 tracking complexity and freight routing inefficiencies. Streamlining supplier bases enhances visibility and green compliance.
3. **Decouple Fulfillment Speed from Carbon Intensity:** Prioritize eco-friendly packaging, consolidated route optimization, and digital supply chain technologies to maintain high order fulfillment ($> 94\%$) without increasing carbon footprints.

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