

International Journal of **Supply Chain and Logistics**

(IJSCL)

The Impact of Climate Change on Supply Chain Management



CARI
Journal

The Impact of Climate Change on Supply Chain Management

 Neetan Narayan

Independent Researcher, Department of Climate and Business Analytics and Supply Chain

Optimization, United States of America

<https://orcid.org/0009-0007-8600-4297>

Accepted: 30th Mar, 2025, Received in Revised Form: 17th Apr, 2025, Published: 17th May, 2025

Abstract

Purpose: This study examines the impact of climate change on global supply chain management by analyzing the influence of climate-related variables, specifically CO₂ emissions, temperature fluctuations, and flood-related economic damages, on key logistics performance indicators. These indicators include the customs score, infrastructure score, logistics performance index, and logistics competence and quality score.

Methodology: A mixed-methods analytical approach was employed, incorporating regression analysis, correlation matrix evaluation, and principal components analysis (PCA), supplemented by visual analytics. This methodology enabled the identification of relationships between selected climate variables and supply chain performance metrics across various countries.

Findings: The study reveals a statistically significant positive association between CO₂ emissions and improved logistics performance indicators. This suggests that regions with higher industrial output and consequently higher emissions often have more advanced logistics infrastructure and trade efficiency. Conversely, while flood-related economic damages exhibited a negative correlation with logistics performance, the relationship lacked statistical significance. The findings underscore the complex dynamic between industrial growth, environmental impact, and logistics efficiency.

Unique Contribution to Theory, Practice, and Policy (Recommendations): This research contributes to the theoretical discourse by highlighting the dual role of industrial activity in enhancing logistics performance while exacerbating environmental degradation. Practically, it calls for urgent investment in climate-resilient infrastructure and adaptive logistics strategies. From a policy perspective, the study advocates for integrated climate and trade policies that align economic development with environmental sustainability. Future research should explore indirect and long-term effects of climate change on supply chains to inform more robust mitigation strategies.

Keywords: *Climate Change Impact, Supply Chain Resilience, CO₂ Emissions and Logistics, Climate Risk Management, Sustainable Supply Chain*

1. Introduction

Climate change is now one of the most serious global problems, affecting the economy, environment, and society (Rawat et al., 2024). Global trade, predominantly sustained by intricate supply chain networks, is very sensitive to climate change effects (Hugos, 2024). A supply chain is managing the flow of materials, services, information, and finances from the beginning to the customer. Supply chains are particularly susceptible to the disruptions that climate change introduces (Intergovernmental Panel on Climate Change, 2021). When this complex system faces disruptions, it can lead to problems such as delays, excessive costs, and even lost sales (Hugos, 2024). Figure 1 illustrates various modes of transportation within supply chains, highlighting their vulnerability to climate change-related disruptions.



Figure 1: Illustration of the Impact of Climate Change on Global Supply Chains.

Source: Generated by AI using DALL·E 2024

Climate change amplifies vulnerabilities, as discussed in the preceding paragraph, by increasing the frequency and intensity of severe weather events, which disrupt intricate supply chain networks and their reliance on sensitive transportation systems (Rawat et al., 2024; Hugos, 2024; Intergovernmental Panel on Climate Change, 2021). For example, floods may submerge roads and railways, wildfires destroy warehouses and factories, and hurricanes halt port operations (World Economic Forum, 2020) (Figure 2). Increasing numbers of supply chain disruptions worldwide have compelled organizations to improve their risk management systems by incorporating strategies such as diversification of supplier networks, improvement of operational systems, and utilization of advanced technologies, including predictive analytics (Mukwarami et al., 2023). Also, growing expectations from customers and investors push companies to pursue sustainable improvement, demanding a decrease in CO₂ emissions while keeping a lean supply chain (KPMG, 2019).



Figure 2: Different Climate-related Events (Image credit: National Oceanic and Atmospheric Administration, 2023)

1.1. Problem Statement

The intensification of climate change affects the global supply chains and introduces risks to their reliability, speed, and overall performance (Er Kara et al., 2021). Extreme weather conditions, unpredictable temperature changes, and changing regulations increase the vulnerability of corporate supply chain networks to disturbances (Ghadge et al., 2020). Despite increased awareness of these issues, limited understanding exists regarding the global impact of climate change on SCM practices.

This study aimed to address this research gap by examining the extent to which climate change affected the acquisition and production of raw materials in supply chains. Through this examination, the study sought to provide supply chain managers and leaders with guidance for devising adaptive strategies to respond effectively to the challenges posed by climate change

1.2. Research Questions

The research questions for this study are as follows:

- ❖ How do climate change factors, such as CO₂ emissions and temperature anomalies, statistically influence key aspects of global supply chain management based on empirical data?
- ❖ What are the primary challenges climate change presents to supply chain management, and how do these challenges differ across regions and industries globally?
- ❖ How effective are existing supply chain management strategies in mitigating the impacts of climate change, and what specific improvements can enhance their effectiveness?

1.3. Research Hypothesis

- ❖ **Null Hypothesis (H₀):** Climate change variables do not significantly impact supply chain performance.
- ❖ **Alternative Hypothesis (H₁):** Climate change variables have a statistically significant impact on supply chain performance.

This study investigates the relationship between climate-related factors—CO₂ emissions, temperature anomalies, and flood-induced economic damages—and supply chain performance.

It uses metrics such as the Logistics Performance Index (LPI), customs score, infrastructure score, and logistics competence score to evaluate this relationship, based on data from global sources like NOAA, Copernicus, Everstream Analytics, and the World Bank.

1.4. Research Objectives

The objectives of this research are as follows:

- ❖ To assess the impact of climate change on key aspects of SCM using statistical and visual analytics methods.
- ❖ To identify the challenges climate change poses to supply chain management at both global and regional (state) levels.
- ❖ To evaluate current strategies used in SCM to mitigate climate change impacts.
- ❖ To propose actionable recommendations for enhancing supply chain resilience in response to climate risks.

2. Literature Review

Climate change has become one of the most significant issues worldwide, significantly impacting many fields. As stated by the Intergovernmental Panel on Climate Change, climate change has increased the occurrence and intensity of natural disasters, including hurricanes, floods, and wildfires, which disrupt natural and human systems (McSweeney, R. 2022). These immense economic losses cause agricultural, manufacturing, transportation, and energy disruptions. For example, floods damage food production and lead to food scarcity and price spikes, while hurricanes disrupt structures, halting production or delivery in impacted areas (Cruz & Krausmann, 2013). The supply chain sector is overly sensitive to climatic changes compared with other sectors because it consists of extensive supply chain networks spanning various global regions. In addition, the operations of supply chains are highly integrated, and any disruption within one part of the supply chain can quickly cascade across the entire system, manifesting delays, heightened costs, and operational inefficiencies. Climate risks, including rising sea levels, unusual temperature extremes, and rainfall changes, affect routes for transport, storage locations, and production facilities (Sarkis et al., 2020). For instance, rising sea levels and stronger storms can flood coastal ports (Figure 3), disrupt logistics, and increase rerouting costs (Leung et al., 2023). Also, Figure 4 illustrates the devastating effects of climate change on agriculture, with droughts leading to barren farmlands and diminished crop yields, posing significant challenges to global food supply chains

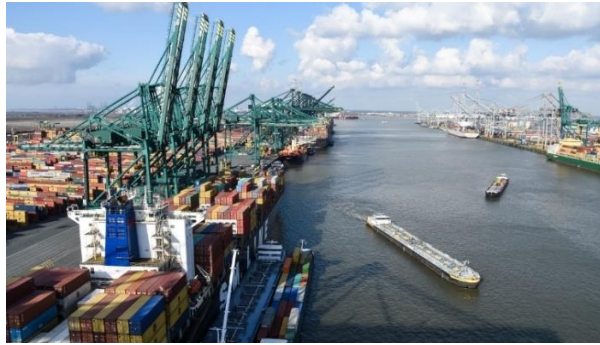


Figure 3: A Flooded Port Showing the Effect of Rising Sea Levels on Supply Chains
(Image credit: Asariotis, 2021)

Similarity, a drought in a large production area cuts down the supply of raw materials for food production, and supply chains around the globe could be impacted (Kanike, 2023). Likewise, adverse weather conditions affect production in manufacturing countries, causing shortages and raising product prices worldwide. Unexpected events in global supply chains have received much attention, especially after the COVID-19 health crisis, during which external disruptions caused severe disruptions to global supply chains (Ivanov & Dolgui, 2021).



Figure 4: Drought-Stricken Farmland Highlighting the Impact of Climate Change on Agricultural Supply Chains (Image credit: Saadi, 2022)

Due to the rise of climate change and its implications for natural disasters and disastrous climatic occurrences, there is a realization that climatic risks must be integrated into SCM (Rüttinger et al., 2020). This involves improving the infrastructure's durability, expanding the available supply sources, and monitoring and predicting measures that can recognize probable interferences in the provision. Nevertheless, the existing research has left room for improvement in identifying concrete approaches and measures suitable for tackling these problems. This research, therefore, seeks to add to this body of knowledge by discussing the effects of climate change on SCM, discussing some of the challenges that are associated with climate change effects on SCM, and assessing the effectiveness of the strategies that have been proposed to improve the resilience of an organization to climate change.

2.1. Previous Research on Supply Chain Disruptions

Global supply chains have recently been exposed to many risks, including natural disasters, climate change, and other unexpected events. These disruptions might critically reduce the performance and resilience of supply chains, hence requiring the implementation of strategies

that may reduce such effects. Thus, research on supply chain disruption has become quite critical.

A central focus of research has been the intersection between climate change and SCM. Ghadge et al. (2020) thoroughly reviewed the risks associated with climate change in global supply chains.

The research successfully identified the considerable influence that extreme weather events can have on supply chain operations. The authors introduced a new framework by emphasizing the need for a systems theory-driven approach to risk management within supply chains. The study underscored the relationship between climate and supply chain dynamics, highlighting the close interconnection between natural disasters and greenhouse gas emissions. Recent studies emphasize the growing impact of climate change on supply chains and the urgent need for resilience. Godde et al. (2021) highlighted how climate instability threatens food security, while Ojo (2024) and Katsaliaki et al. (2022) stressed adaptive risk management, stakeholder collaboration, and technological innovation as key resilience strategies. Pankratz and Schiller (2024) linked climate risks to supplier performance and customer behavior, noting financial consequences. Azadegan et al. (2020) demonstrated the value of business continuity programs in boosting preparedness and economic outcomes. Collectively, these works underscore the critical role of climate adaptation, continuity planning, and resilience in modern supply chain management.

2.2. Visual Analytics in Supply Chain Management

In today's complex supply chain landscape, visual analytics plays a vital role in addressing disruptions, particularly those caused by climate change. By combining data visualization tools (e.g., dashboards, heat maps, flow charts) with analytical methods, visual analytics helps identify patterns, improve decision-making, and enhance supply chain resilience (Maheshwari et al., 2021; Bui et al., 2021). Dashboards offer real-time insights into KPIs such as inventory levels, order status, and transportation (Nabil et al., 2023). These tools allow managers to detect stock imbalances and make informed decisions.

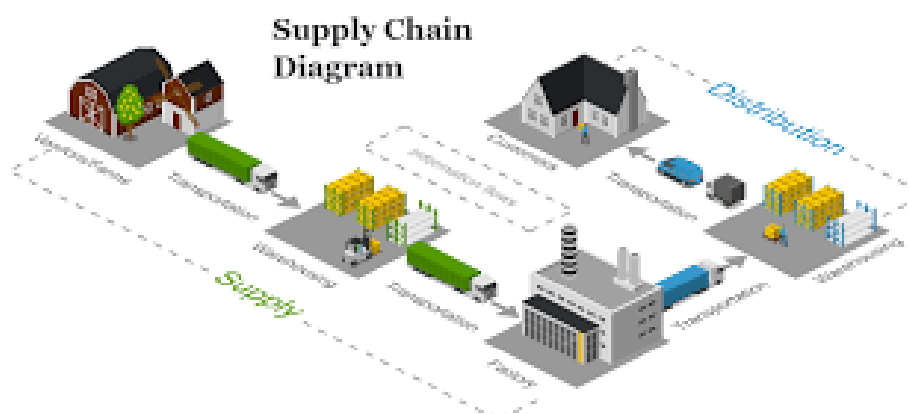


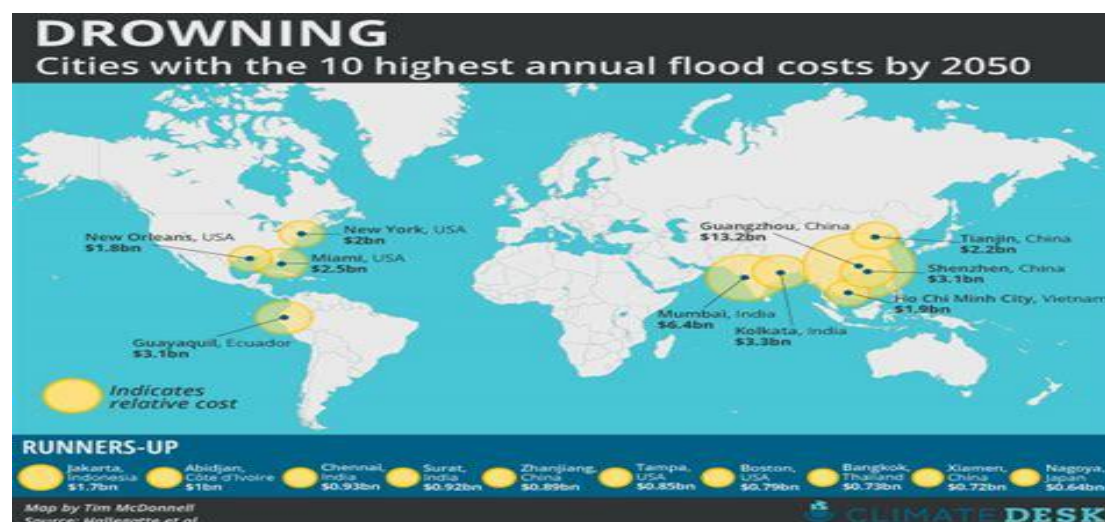
Figure 5: Supply Chain Flow Diagram (Icograms, 2024)

Key applications include:

- ❖ **Inventory Flow Disruption:** Climate events (e.g., floods, wildfires) impact storage and transport, causing fluctuations in product availability.
- ❖ **Cost Implications:** Dashboards highlight financial impacts like emergency sourcing and shipment delays.
- ❖ **ABC Classification:** Prioritizes critical inventory to manage supply risks linked to environmental events.
- ❖ **Gross Inventory & Revenue:** Tracks turnover and profitability under climate pressure (e.g., overstocking to hedge against shortages).
- ❖ **Sustainability:** Visual analytics supports identifying greener practices for long-term resilience.
- ❖ **Strategic Planning:** Enables data-driven actions such as supplier diversification, warehouse relocation, and infrastructure investments.
- ❖ Overall, visual analytics empowers supply chains to remain agile, efficient, and sustainable amid climate challenges.

Beyond dashboards, **heat maps** help visualize demand density, warehouse locations, and transport routes—enabling managers to reroute or reschedule operations to avoid delays (Bellini et al., 2024). **Flow charts** illustrate the movement of goods and information, highlighting inefficiencies and opportunities for process optimization (MacCarthy et al., 2022).

Predictive analytics uses visual tools like line graphs and trend charts to forecast demand, detect supply risks, and prepare for disruptions (Pawar & Paluri, 2022). Scenario analysis, via decision trees or simulation models, helps managers evaluate alternatives and select the most resilient supply chain strategy (Shokouhyar et al., 2021).



Visual analytics supports effective supply chain risk management by identifying areas vulnerable to supplier failure, transportation disruptions, or natural disasters (Mehdizadeh, 2021). Geospatial analysis provides regional insights into risks like natural hazards and geopolitical instability (Scott, 2023), while visualization helps organizations plan for localized

disruptions. Tools such as Tableau enable real-time, interactive dashboards for monitoring KPIs and supplier performance (Leal, 2019). Additionally, the Supply Chain Risk-Value Matrix categorizes suppliers by risk and value, aiding in strategic decision-making and resource allocation. By integrating such tools, organizations enhance resilience, optimize operations, and gain a competitive edge in complex supply chain environments.

2.3. Research Gap

While prior research has explored climate change impacts on supply chains, it often lacks robust, data-driven analysis and overlooks regional and industrial differences. Existing studies tend to generalize climate risks and rarely apply advanced analytics or technologies to assess supply chain resilience. This study addresses these gaps by using statistical and visual methods to analyze the effects of CO₂ emissions, temperature anomalies, and flood-related damages on supply chain performance. Drawing from reputable data sources like NOAA, the World Bank, and Everstream Analytics, the study leverages PCA and visual analytics to provide actionable, region-specific insights and recommend strategies for improving supply chain resilience amid climate change.

2. Data and Methodology

2.1 Data Sources

This study analyzes the impact of climate change variables on global supply chain performance using a multi-source dataset. Independent variables include annual CO₂ emissions per capita, temperature anomalies, and flood-related economic damages (as a share of GDP). Dependent variables comprise the Logistics Performance Index (LPI) and its subcomponents: Customs Score, Infrastructure Score, and Logistics Competence and Quality Score. Climate data were sourced from NOAA (2024), supply chain performance indicators from the World Bank's LPI dataset (2024), and flood damage data from Everstream Analytics (2024).

2.2 Data Preprocessing

The initial dataset contained 561 observations and 13 variables. After removing missing values and redundant columns (e.g., categorical rankings, duplicate flood metrics), the final cleaned dataset included 398 complete observations for analysis. Missing data were omitted to maintain model integrity and prevent bias.

All variables were normalized using Min-Max scaling to ensure comparability across units and reduce the effect of extreme values:

$$X_{\text{normalized}} = \frac{X - X_{\min}}{X_{\max} - X_{\min}}$$

This normalization preserves the original data distribution while enabling robust regression modeling.

Tbale 1: First and Last 10 Rows of Combined Preprocessed Dataset

Ye ar	Countr y	LPI Score	LPI Group ed Rank (*)	Cust oms Scor e	Infrastru cture Score	Internat ional Shipme nts Score (*)	Logistic s Compe tence and Quality Score	Track ing and Traci ng Score (*)	Timeli ness Score (*)	Annual CO ₂ emissi ons (per capita)	Total econo mic damag e as a share of GDP - Flood	Temp eratu re anom aly
20 07	Nether lands	4.1776 95149	2	3.99 225	4.29032	4.04878	4.25	4.136 36	4.382 35	10.538 973		0.680 9682
20 07	Germa ny	4.0986 95236	3	3.88 279	4.19133	3.90984	4.2072 8	4.118 64	4.327 27	10.472 896	0	0.629 2377
20 07	Austri a	4.0625 73643	5	3.83 333	4.06061	3.96667	4.1333 3	3.965 52	4.444 44	8.9355 39		0.573 6909
20 07	Japan	4.0235 54099	6	3.78 648	4.10638	3.76557	4.1198 5	4.076 05	4.344 54	10.177 901	0	0.316 1912
20 07	Switze rland	4.0161 96383	7	3.84 848	4.13333	3.66667	4	4.035 71	4.48	5.7495 914	0.071 32076	0.335 5184
20 07	United Kingdo m	3.9933 61748	9	3.73 9	4.04938	3.85209	4.0195 4	4.1	4.248 15	9.1341 87	0.273 35292	0.383 963
20 07	Canad a	3.9219 25946	10	3.81 818	3.94898	3.77895	3.8539 3	3.977 78	4.188 24	18.067 89	0	-0.24 7153
20 07	Belgiu m	3.8937 63601	12	3.61 261	4	3.65094	3.9494 9	3.959 18	4.253 01	11.307 179		0.479 5012
20 07	Denm ark	3.8590 46038	13	3.97 143	3.82353	3.66667	3.8333 3	3.758 62	4.111 11	9.9839 65		0.642 3784
20 18	Somali a	2.2086 77	144	2	1.81286 5	2.61286 5	2.3045 39	2.233 11	2.204 196	0.0413 68622	0.966 3922	-0.12 1682
20 18	Cuba	2.1971 59	146	2.02 9672	2.04166 7	2.27041 2	2.2024 41	2.146 89	2.462 494	2.0420 773		0.136 0966
20 18	Iraq	2.1762 71	147	1.83 9437	2.0335	2.32481 2	1.9084 31	2.191 53	2.719 949	4.5269 85	0	0.997 2141
20	Papua	2.1741	148	2.32	1.97076	2.14723	1.8827	2.257	2.436	0.8153		0.261

Note. Variables marked with an asterisk (*) are not included in the regressions analysis and are included for reference or categorization purposes only.

Table 1 displays the first and last 10 observations of the preprocessed dataset, originally consisting of 561 observations and 13 variables, including logistics performance metrics (LPI Score, Customs Score, Infrastructure Score), climate factors (Annual CO₂ Emissions, Temperature Anomalies), and flood-related economic damages. During preprocessing, irrelevant or redundant columns—such as indexing variables, grouped rankings, and duplicate flood metrics—were removed to enhance analytical clarity. A new column was added to capture flood-related damages, while 163 rows with missing values in key variables were excluded to maintain data integrity.

The final dataset, reduced to 398 complete records, includes essential independent variables (CO₂ Emissions, Temperature Anomalies, Flood Damages) and dependent variables (LPI Score and its subcomponents). Flood damages were consolidated into a single metric (economic losses as a share of GDP) to improve analytical consistency and model accuracy.

.3 Descriptive Statistics

Table 2: key descriptive statistics for the main variables used in the analysis.

Variable	Mean	Median	Std. Dev.	Variance
LPI Score	2.82	2.71	0.55	0.3
CO ₂ Emissions (per capita)	3.62	1.60	4.94	24.44
Temperature Anomaly	0.25	0.23	0.44	0.19
Flood-related Economic Damage (%)	0.11	0.00	0.46	0.21

Note: CO₂ emissions show high variability reflecting industrialization differences, while flood damages are highly skewed, with severe impacts concentrated in a few regions.

4. Results

This section presents the core findings of the study, analyzing the relationship between climate change variables and supply chain performance.

4.1 Correlation Analysis

Correlation matrices indicate strong intercorrelations among LPI subcomponents ($r = 0.78$ to 0.92), justifying their aggregation into a composite LPI Score. Independent climate variables showed negligible correlations, suggesting distinct climate phenomena without multicollinearity.

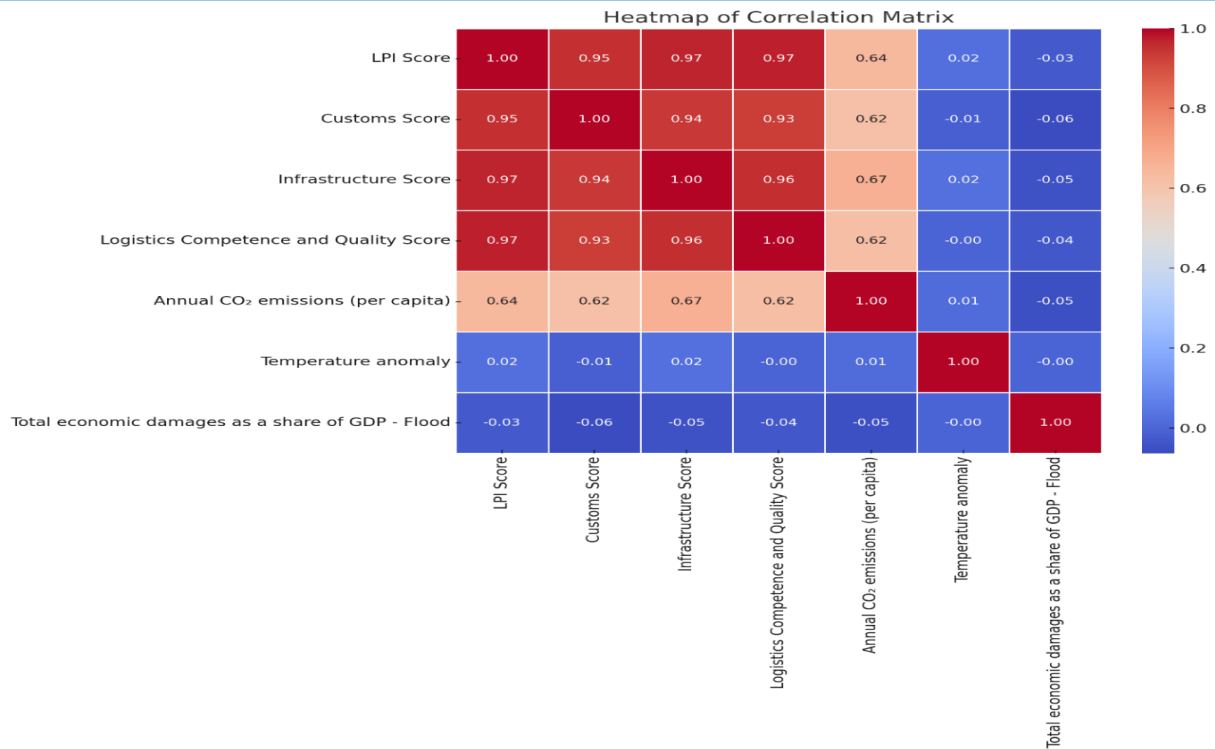


Figure 13: Correlation Matrix of Variables

4.2 Principal Component Analysis (PCA)

PCA was conducted to address multicollinearity among dependent variables, resulting in a single principal component (PC1) that explained over 85% of the variance across LPI subcomponents. PC1 was used as the composite measure of supply chain performance in subsequent regression analyses.

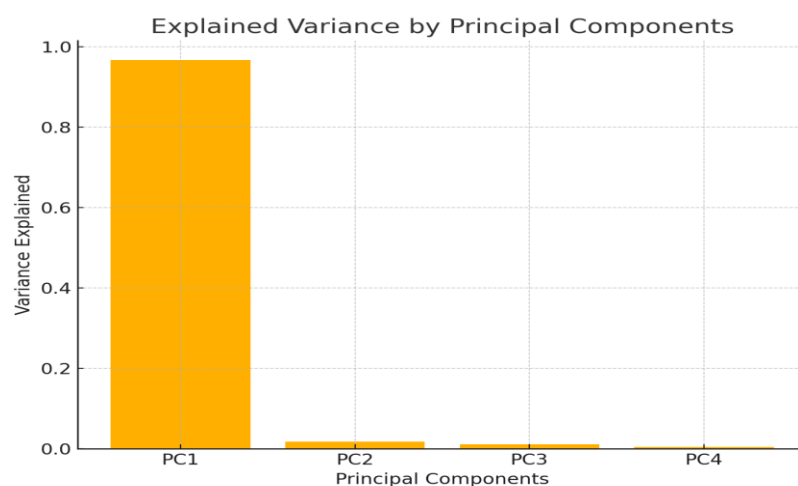


Figure 14: Explained Variance by Principal Components

4.3 Regression Analysis

A multiple linear regression model assessed the impact of CO₂ emissions, temperature anomalies, and flood-related economic damages on the LPI Score. Key model statistics are summarized in Table 3.

Metric	Value
F-Value	90.67
R-Squared	0.408
Adjusted R-Squared	0.404
p-Value	<0.001

CO₂ emissions showed a significant positive relationship with LPI (coefficient = 0.35, $p < 0.001$), indicating that industrialization enhances logistics infrastructure. Temperature anomalies and flood damages were not statistically significant ($p > 0.05$).

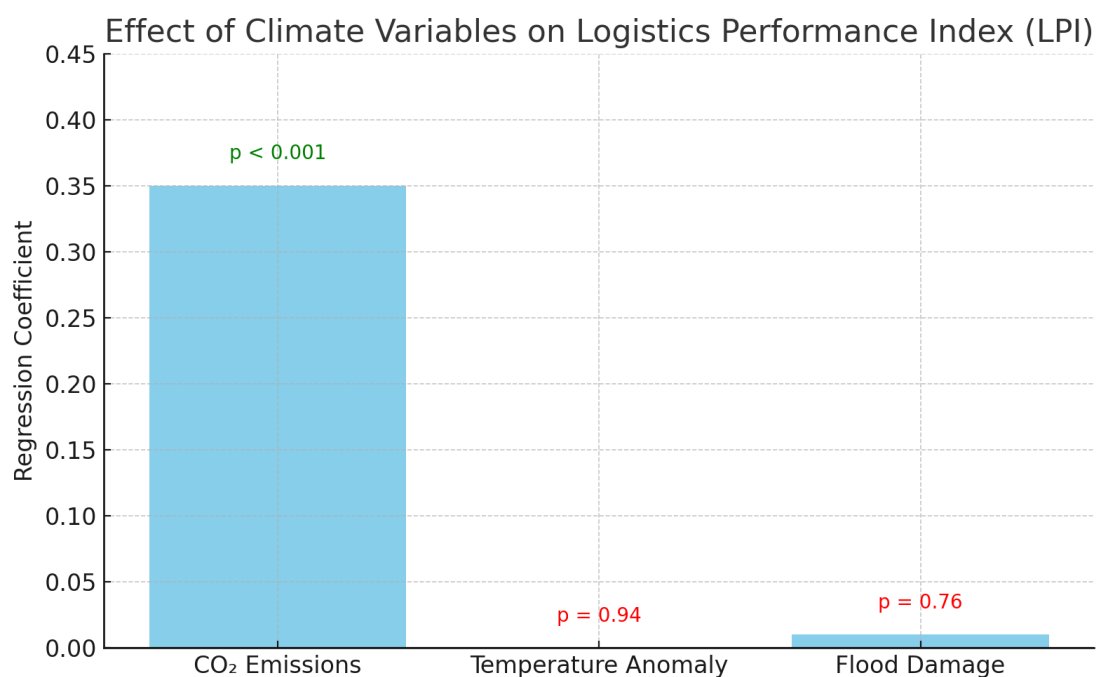


Figure 3: Regression model summary: Effect of climate variables on Logistics Performance Index (LPI).

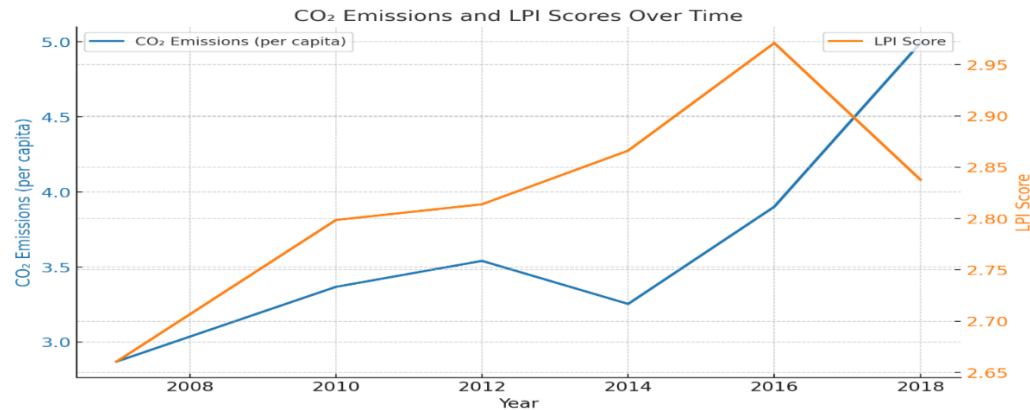


Figure 16: CO₂ Emissions and LPI Scores Over Time

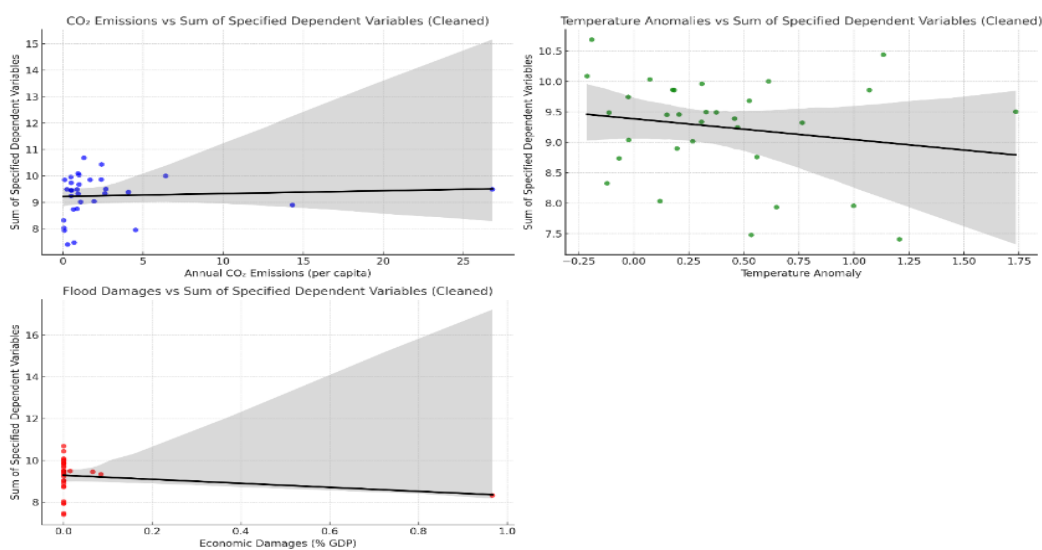


Figure 17: Scatterplots Illustrating the Relationships Between Climate Variables and Supply Chain Performance

4.4 Summary of Findings

- ❖ **CO₂ Emissions** positively impact supply chain performance, likely due to concurrent industrial and infrastructure development.
- ❖ **Temperature Anomalies and Flood Damages** showed no significant effect on global supply chain efficiency in this aggregated analysis, suggesting potential localized or delayed impacts.
- ❖ The model explains approximately 40.8% of variability in logistics performance, indicating that additional factors beyond climate variables contribute to supply chain resilience.

5. Discussion

This study examined the influence of climate change variables, including CO₂ emissions, temperature anomalies, and flood-related economic damages, on global supply chain performance, measured by the Logistics Performance Index (LPI). The findings reveal a nuanced relationship between environmental factors and logistics efficiency. The positive and

statistically significant association between CO₂ emissions and LPI indicates that regions with higher industrial activity tend to exhibit stronger supply chain infrastructure and logistics capabilities. This aligns with prior research suggesting that industrialization drives improvements in transport networks, customs efficiency, and logistics competence, which collectively enhance supply chain performance. However, this relationship also highlights a paradox: while industrial growth supports logistics efficiency, it simultaneously contributes to increased greenhouse gas emissions and long-term environmental risks.

In contrast, temperature anomalies and flood-related economic damages showed no statistically significant effects on global supply chain performance in this study. This may reflect the aggregated nature of the data and suggest that such climate disruptions have more localized or sector-specific impacts that are not easily captured in global-level indices. Additionally, modern supply chains may exhibit some resilience to short-term climate shocks through redundancy, diversification, and adaptive strategies, thereby mitigating immediate performance degradation.

The model's explanatory power, accounting for approximately 40.8% of the variance in logistics performance, implies that while climate factors are important, other drivers such as workforce skills, technological advancements, regulatory environments, and economic policies also play critical roles in shaping supply chain efficiency.

This study has important practical implications. Policymakers should recognize the dual challenge of supporting industrial growth to enhance logistics infrastructure while pursuing sustainable development goals to limit emissions and mitigate climate risks. Businesses are encouraged to invest in climate-resilient logistics systems, green technologies, and adaptive supply chain management practices to prepare for future environmental uncertainties.

Limitations of the study include the reliance on aggregate global data, which may mask regional heterogeneity and the lagged effects of climate impacts. Future research should incorporate more granular, longitudinal datasets and explore additional climate-related risks, such as extreme weather events and supply chain disruptions, to better understand their complex dynamics. Furthermore, integrating machine learning techniques could enhance predictive insights on the long-term interplay between climate change and supply chain resilience.

Overall, this research contributes to the growing body of knowledge on climate change's role in global supply chains and underscores the urgent need for integrated strategies that balance economic development with environmental sustainability.

6: Conclusion

This study explored how climate change impacts global supply chain performance by examining CO₂ emissions, temperature anomalies, and flood-related economic damages. The findings revealed a positive correlation between CO₂ emissions and logistics efficiency, underscoring the short-term benefits of industrialization but raising concerns about long-term sustainability—highlighting what the authors term the "industrialization paradox." While temperature and flood variables showed no immediate statistical impact, their cumulative and

region-specific effects merit further theoretical investigation. Practically, the integration of visual tools such as box plots and scatter plots enhanced understanding by identifying outliers and nonlinear trends, offering deeper insights for supply chain strategists. The study offers clear policy implications, recommending carbon pricing, climate-integrated trade policies, and mandatory climate risk assessments. Businesses are advised to invest in low-carbon technologies, predictive analytics, and diversified sourcing strategies. Future research should prioritize long-term, regional, and AI-driven models to further understand and manage climate risks in logistics networks.

References

- Abhijeet Ghadge, H. W. (2019). Managing climate change risks in global supply chains: a review and research agenda. *International Journal of Production Research*, 44-64. doi:<https://doi.org/10.1080/00207543.2019.1629670>
- Appfluence. (2024, January 1). Supply chain risk-value matrix. <https://sync.appfluence.com/templates/supply-chain-risk-value-matrix/>
- Asariotis, R. (2021). Climate change impacts seaports: A growing threat to sustainable trade and development. *UNCTAD Transport and Trade Facilitation Newsletter*, Article 75. <https://unctad.org/es/isar/news/climate-change-impacts-seaports-growing-threat-sustainable-trade-and-development>
- Azadegan, A., Mellat Parast, M., Lucianetti, L., Nishant, R., & Blackhurst, J. (2020). Supply chain disruptions and business continuity: An empirical assessment. *Decision Sciences*, 51(1), 38–73. <https://doi.org/10.1111/deci.12395>
- Bag, S., Dhamija, P., & Pretorius, J.-H. C. (2021). Sustainable supply chain transformation: Alignment of digital technology with circular economy and net-zero objectives. *Journal of Cleaner Production*, 320, 128618.
- Baruti, R. (2023). Analysis and implementation of a business intelligence QlikView application for logistic and procurement management: Sews Cabind case for the shortage problem [Doctoral dissertation, Politecnico di Torino].
- Becker, A., Ng, A. K., McEvoy, D., & Mullett, J. (2018). Implications of climate change for shipping and ports in Australia. *Climate Risk Management*, 20, 11–27.
- Bellini, P., Bilotta, S., Collini, E., Fanfani, M., & Nesi, P. (2024). Data sources and models for integrated mobility and transport solutions. *Sensors*, 24(2), Article 441. <https://doi.org/10.3390/s24020441>
- Bi, S., Li, Z., Brown, M., Wang, L., & Xu, Y. (2022). Dynamic weighted and heat-map integrated scalable information path-planning algorithm. *EAI Endorsed Transactions on Scalable Information Systems*, 10(2), Article 1567. <https://doi.org/10.4108/eetsis.v9i5.1567>
- Bin Wan, W. W. (2022). Logistics performance and environmental sustainability: Do green innovation, renewable energy, and economic globalization matter? *Frontiers in Environmental Science*, 10. doi:<https://doi.org/10.3389/fenvs.2022.996341>
- Bui, T. D., Tsai, F. M., Tseng, M. L., Tan, R. R., Yu, K. D. S., & Lim, M. K. (2021). Sustainable supply chain management towards disruption and organizational ambidexterity: A data-driven analysis. *Sustainable Production and Consumption*, 26, 373–410. <https://doi.org/10.1016/j.spc.2020.09.017>

- Chartis. (2023). Climate Risk Modeling Solutions 2023: Market and Vendor Landscape.
- Choi, T. M., Wallace, S. W., & Wang, Y. (2023). Big Data Analytics in Operations and Supply Chain Management: Theory and Applications. *Annals of Operations Research*, 316(2), 407–429.
- Copernicus Climate Change Service. (2024, January 1). Climate datasets. <https://climate.copernicus.eu/climate-datasets>
- Cruz, A. M., & Krausmann, E. (2013). Vulnerability of the oil and gas sector to climate change and extreme weather events. *Climatic Change*, 121(1), 41–53. <https://doi.org/10.1007/s10584-013-0891-4>
- Dask. (n.d.). GridSearchCV. https://ml.dask.org/modules/generated/dask_ml.model_selection.GridSearchCV.html
- Data.gov. (2024). Climate change datasets. https://catalog.data.gov/dataset/?tags=climate-change&res_format=CSV
- Datahub.io. (2024). Climate change data collections. <https://datahub.io/collections/climate-change>
- Datrics. (2024). Demand forecasting and planning in retail: Datrics use cases. <https://www.datrics.ai/articles/demand-forecasting-and-planning-in-retail-datrics-use-cases>
- Doll, C. N. H., & Klug, S. (2021). Climate Resilience in Transport Infrastructure: The Need for a Sectoral and Regional Perspective. *Transport Reviews*, 41(3), 365–386
- Emmanuel, T., Maupong, T., Mpoeleng, D., Semong, T., Mphago, B., & Tabona, O. (2021). A survey on missing data in machine learning. *Journal of Big Data*, 8, Article 16. <https://doi.org/10.1186/s40537-021-00516-9>
- Er Kara, M., Ghadge, A., & Bititci, U. S. (2021). Modelling the impact of climate change risk on supply chain performance. *International Journal of Production Research*, 59(24), 7317–7335. <https://doi.org/10.1080/00207543.2020.1849844>
- Everstream AI. (2022, June 22). Everstream now available on Oracle Cloud marketplace - Everstream Analytics. <https://www.everstream.ai/media/everstream-available-oracle-cloud-marketplace/>
- George, G., Merrill, R. K., & Schillebeeckx, S. J. D. (2021). Digital sustainability and entrepreneurship: How digital innovations are helping tackle climate change and sustainable development. *Entrepreneurship Theory and Practice*, 45(5), 999–1027.
- Ghadge, A., Wurtmann, H., & Seuring, S. (2020). Managing climate change risks in global supply chains: A review and research agenda. *International Journal of Production Research*, 58(1), 44–64. <https://doi.org/10.1080/00207543.2019.1629670>
- Godde, C. M., Mason-D'Croz, D., Mayberry, D. E., Thornton, P. K., & Herrero, M. (2021). Impacts of climate change on the livestock food supply chain: A review of the evidence. *Global Food Security*, 28, Article 100488. <https://doi.org/10.1016/j.gfs.2020.100488>
- Hugos, M. H. (2024). *Essentials of supply chain management* (5th ed.). John Wiley & Sons.
- Icograms. (2024). Supply chain diagram: Simplify supply chain visualization with Icograms Designer: Empower your business efficiency. <https://icograms.com/usage-supply-chain-diagram>

- Intergovernmental Panel on Climate Change. (2021). Climate change 2021: The physical science basis. Contribution of Working Group I to the Sixth Assessment Report of the Intergovernmental Panel on Climate Change. Cambridge University Press. <https://www.ipcc.ch/report/ar6/wg1/>
- Ivanov, D., & Dolgui, A. (2021). A digital supply chain twin for managing the disruption risks and resilience in the era of Industry 4.0. *Production Planning & Control*, 32(9), 775–788. <https://doi.org/10.1080/09537287.2020.1768450>
- James, G. (2013). *An introduction to statistical learning*. Springer. <https://doi.org/10.1007/978-1-4614-7138-7>
- Kanike, U. K. (2023). Factors disrupting supply chain management in manufacturing industries. *Journal of Supply Chain Management Science*, 4(1–2), 1–24. <https://doi.org/10.18757/jscms.2023.6986>
- Katsaliaki, K., Galetsi, P., & Kumar, S. (2022). Supply chain disruptions and resilience: A major review and future research agenda. *Annals of Operations Research*, 1–38. <https://doi.org/10.1007/s10479-020-03912-1>
- Khakpour, A., Colomo-Palacios, R., & Martini, A. (2021). Visual analytics for decision support: A supply chain perspective. *IEEE Access*, 9, 81326–81344. <https://doi.org/10.1109/ACCESS.2021.3085496>
- KPMG. (2019). *The road to everywhere: The future of supply chain*. KPMG Global. <https://assets.kpmg.com/content/dam/kpmg/uk/pdf/2021/06/kpmg-future-of-supply-chain-report.pdf>
- Leal, L. J. M. (2019). *A business intelligence approach for operational performance monitoring and improvement in a logistics operator* [Master's thesis, University of Porto].
- Leung, T. C. H., Guan, J., & Lau, Y. Y. (2023). Exploring environmental sustainability and green management practices: Evidence from logistics service providers. *Sustainability Accounting, Management and Policy Journal*, 14(3), 461–489. <https://doi.org/10.1108/SAMPJ-03-2022-0133>
- MacCarthy, B. L., Ahmed, W. A., & Demirel, G. (2022). Mapping the supply chain: Why, what, and how? *International Journal of Production Economics*, 250, Article 108688. <https://doi.org/10.1016/j.ijpe.2022.108688>
- Maheshwari, S., Gautam, P., & Jaggi, C. K. (2021). Role of big data analytics in supply chain management: Current trends and future perspectives. *International Journal of Production Research*, 59(6), 1875–1900. <https://doi.org/10.1080/00207543.2020.1793011>
- McDonnell, T. (2013, August 18). MAP: Global flood damage could exceed \$1 trillion annually by 2050. Mother Jones. Retrieved from <https://www.motherjones.com/environment/2013/08/map-top-cities-billion-dollar-floods/>
- McSweeney, R. (2022, April 11). Explainer: What the new IPCC report says about extreme weather and climate change. Carbon Brief. <https://www.carbonbrief.org/explainer-what-the-new-ipcc-report-says-about-extreme-weather-and-climate-change/>
- Mehdizadeh, A. (2021). *Data analytics methods for supply chain risk management with applications in transportation and manufacturing safety* (Doctoral dissertation, Auburn University).

- Mukwarami, S., Nkwaira, C., & van der Poll, H. M. (2023). Environmental management accounting implementation challenges and supply chain management in emerging economies' manufacturing sector. *Sustainability*, 15(2), Article 1061. <https://doi.org/10.3390/su15021061>
- Nabil, D. H., Rahman, M. H., Chowdhury, A. H., & Menezes, B. C. (2023). Managing supply chain performance using a real-time Microsoft Power BI dashboard by action design research (ADR) method. *Cogent Engineering*, 10(2), Article 2257924. <https://doi.org/10.1080/23311916.2023.2257924>
- National Centers for Environmental Information. (2024). Climate data online (CDO). <https://www.ncdc.noaa.gov/cdo-web/datasets>
- National Oceanic and Atmospheric Administration. (2023). A collage of typical climate and weather-related events: Floods, heatwaves, drought, hurricanes, wildfires, and loss of glacial ice. <https://www.commerce.gov/images/collage-typical-climate-and-weather-related-events-floods-heatwaves-drought-hurricanes>
- OECD. (2023). Harnessing trade and environmental policies to accelerate the green transition.
- Ojo, B. (2024). Resilience and sustainability of supply chains in the face of natural disasters and climate change. *International Journal of Science and Research Archive*, 12(1), 2996–3007. <https://doi.org/10.30574/ijrsra.2024.12.1.1184>
- Pankratz, N. M., & Schiller, C. M. (2024). Climate change and adaptation in global supply-chain networks. *The Review of Financial Studies*, 37(6), 1729–1777. <https://doi.org/10.1093/rfs/hhad093>
- Pawar, P. V., & Paluri, R. A. (2022). Big data analytics in logistics and supply chain management: A review of literature. *Vision. Advance online publication*. <https://doi.org/10.1177/09722629221091655>
- Provost, F. (2013). *Data science for business: What you need to know about data mining and data-analytic thinking* (Vol. 355). O'Reilly Media, Inc.
- Ravindran, A. R., Warsing Jr., D. P., & Griffin, P. M. (2023). *Supply chain engineering: Models and applications*. CRC Press. <https://doi.org/10.1201/9781003283393>
- Rawat, A., Kumar, D., & Khati, B. S. (2024). A review on climate change impacts, models, and its consequences on different sectors: A systematic approach. *Journal of Water and Climate Change*, 15(1), 104–126. <https://doi.org/10.2166/wcc.2023.536>
- Razack, Z. A. (2020). *Effect of climate change on stability of multinational supply chains* [Doctoral dissertation, Northcentral University].
- Rüttinger, L., Ackern, P. V., Lepold, T., Vogt, R., & Auberger, A. (2020). *Impacts of climate change on mining, related environmental risks, and raw material supply* (Final report No. UBA-FB-000279/ENG). Umweltbundesamt.
- Saadi, S. U. R. (2022). *Climate change impact on Pakistan's agriculture and livestock*. AgriHunt. <https://agrihunt.com/articles/climate-changes-impact-on-pakistans-agriculture-and-livestock/>
- Samra Nazir, L. Z. (2024). Impact of Green Supply Chain Management Practices on the Environmental Performance of Manufacturing Firms Considering Institutional Pressure as a Moderator. *Sustainability*, 16(6). doi:<https://doi.org/10.3390/su16062278>

- Sarkis, J., Cohen, M. J., Dewick, P., & Schröder, P. (2020). A brave new world: Lessons from the COVID-19 pandemic for transitioning to sustainable supply and production. *Resources Conservation and Recycling*, 159, Article 104894. <https://doi.org/10.1016/j.resconrec.2020.104894>
- Scott, M. (2023). Supply chain mapping for emergency management decision-making (Report No. IHS/CR-2023-1027). The Sam Houston State University Institute for Homeland Security.
- Sharma, N. (2024). Redefine your inventory management with Power BI Inventory Dashboard. The Sunflower Lab. <https://www.thesunflowerlab.com/power-bi-inventory-dashboard/>
- Shokouhyar, S., Pahlevani, N., & Mir Mohammad Sadeghi, F. (2019). Scenario analysis of smart, sustainable supply chain on the basis of a fuzzy cognitive map. *Management Research Review*, 43(4), 463–496. <https://doi.org/10.1108/MRR-01-2019-0002>
- Song, M.J., Seo, Y.J., & Lee, H.Y. (2023). The dynamic relationship between industrialization, urbanization, CO₂ emissions, and transportation modes in Korea: empirical evidence from maritime and air transport. *Transportation*, 50, 2111–2137. <https://doi.org/10.1007/s11116-022-10303-x>
- Sousa, R., Miranda, R., Moreira, A., Alves, C., Lori, N., & Machado, J. (2021). Software tools for conducting real-time information processing and visualization in industry: An up-to-date review. *Applied Sciences*, 11(11), Article 4800. <https://doi.org/10.3390/app11114800>
- UNCTAD. (2022). Making Trade Work Better for the Planet. United Nations Conference on Trade and Development.
- Worden, K., Staszewski, W. J., & Hensman, J. J. (2010). Natural computing for mechanical systems research: A tutorial overview. *Mechanical Systems and Signal Processing*, 25(1), 4–111. <https://doi.org/10.1016/j.ymssp.2010.07.013>
- World Bank. (2024). Climate change data. <https://data.worldbank.org/topic/climate-change>
- Zhang, Z., & Baranzini, A. (2004). What do we know about carbon taxes? An inquiry into their impacts on competitiveness and distribution of income. *Energy Policy*, 32(4), 507–518. [https://doi.org/10.1016/S0301-4215\(03\)00152-6](https://doi.org/10.1016/S0301-4215(03)00152-6)



©2025 by the Authors. This Article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (<http://creativecommons.org/licenses/by/4.0/>)