

OPTIMIZATION OF VARIOUS PARAMETERS OF SUPPLY CHAIN LOGISTIC THROUGH MILP MODEL

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Abstract: The undertaken analysis delves into the enhancement of supply chain network efficiency, encompassing multiple factories and sales points across distinct time frames. The core aim is the minimization of costs linked to product allocation, delivery, and storage. This endeavor takes into account various variables such as demand, factory capacity, costs of lost sales, and storage expenses. This paper presented the resolution of the MILP model, the pseudo code imparts a profound comprehension of the optimal solution. This encompasses granular details such as selected sales points, corresponding factories, associated costs, and cumulative expenditures. The results conspicuously underscore the potential advantages of this approach, particularly concerning cost reduction, judicious employment of resources, and elevated decision-making prowess within the supply chain network. All in all, the amalgamation of a meticulously framed problem statement, the potency of MILP modelling, and the prowess of MATLAB implementation crafts a holistic framework to grapple with the intricacies of supply chain optimization. This proposed methodological approach not only facilitates prudent financial gains but also bolsters the overall competitiveness and sustainability of the supply chain network, thereby fortifying its standing in the broader operational landscape.

Keywords: Supply Chain Logistic, MILP Model, Management Systems, vendor-managed inventory

I. INTRODUCTION

In the context of supply chain logistics optimization, a comprehensive approach involves the utilization of Mixed-Integer Linear Programming (MILP) models. These models amalgamate various decision variables, encompassing discrete and continuous elements, to systematically address optimization objectives such as cost minimization or profit maximization. By integrating constraints such as production capacities, transportation limits, and demand requirements, MILP models ensure that real-world limitations are accounted for. Additionally, they can accommodate uncertainties through stochastic programming techniques or scenario-based analysis. Employing specialized MILP solvers, these models are solved to yield optimal solutions that strike a balance between conflicting variables. Sensitivity analysis further illuminates the stability of these solutions, enabling the exploration of how changes in factors like costs or demand impact the outcomes. Post-implementation, a continuous feedback loop is established, with the model iteratively updated to match evolving supply chain dynamics, thereby enabling consistent alignment with business goals and enhanced operational efficiency. This process necessitates collaboration with domain experts and data-driven insights for effective model refinement. Below are some key parameters to consider optimizing:

Inventory Management:

- Implement Just-In-Time (JIT) inventory systems to minimize excess stock and reduce carrying costs.
- Use demand forecasting techniques to predict demand patterns accurately.
- Set reorder points and reorder quantities based on demand variability and lead times.

Transportation and Distribution:

- Optimize transportation routes and modes to minimize costs and delivery times.
- Use route optimization software to plan efficient delivery routes.
- Consider intermodal transportation to combine different modes (e.g., rail, truck, ship) for cost savings.

Warehousing and Storage:

- Design warehouse layouts to minimize travel time and increase picking efficiency.
- Implement Warehouse Management Systems (WMS) to track inventory movement and optimize storage space.
- Use automated systems like conveyor belts and robotic pickers to improve efficiency.

Supplier Relationships:

- Develop strategic partnerships with key suppliers to ensure reliable and timely deliveries.
- Implement vendor-managed inventory (VMI) systems for suppliers to manage replenishments based on real-time data.

Demand Forecasting:

- The use of statistical models and machine learning algorithms may enhance the precision of demand forecasting.
- One should include external elements such as seasonality, market trends, and economic indicators while developing forecasting models.

Lead Time Reduction:

- Work with suppliers to minimize lead times by improving communication and collaboration.
- Implement Lean principles to eliminate waste and streamline processes.

Risk Management:

- Identify potential supply chain risks and develop contingency plans.
- Diversify supplier sources to reduce the impact of disruptions.
- Implement robust quality control processes to prevent defective products from entering the supply chain.

Technology Integration:

- Implement an integrated supply chain management system to streamline communication and data sharing.
- Use Internet of Things (IoT) devices to track shipments, monitor temperature-sensitive goods, and gather real-time data.
- Embrace blockchain technology for enhanced transparency and traceability.

Performance Metrics:

- Define Key Performance Indicators (KPIs) such as on-time delivery, inventory turnover, and order fill rate.
- Monitor and analyze KPIs regularly to identify areas for improvement.

Sustainability:

- Optimize transportation routes to reduce carbon emissions and fuel consumption.
- Source materials and components from environmentally responsible suppliers.
- Implement recycling and waste reduction programs in the supply chain.

Supply chain optimization is an ongoing process that requires continuous monitoring, analysis, and adaptation. It often involves a combination of process improvement, technology adoption, and collaboration with suppliers and partners. Each supply chain is unique, so strategies should be tailored to the specific needs and challenges of our organization.

Supply chain logistics and its significance in modern business

It involves various processes such as procurement, production, distribution, transportation, and storage, all aimed at ensuring that products are delivered to customers efficiently, cost-effectively, and in a timely manner. The significance of supply chain logistics in modern business cannot be overstated. Here are some key points highlighting its importance:

- **Cost Efficiency:** Effective supply chain logistics help businesses optimize their operations, reduce wastage, and minimize costs. By streamlining processes and eliminating inefficiencies, companies can save money on production, transportation, and storage.
- **Customer Satisfaction:** Timely delivery of products is crucial for maintaining customer satisfaction. Efficient supply chain logistics ensure that products reach customers on time, leading to better customer experiences and increased loyalty.
- **Competitive Advantage:** An agile and efficient supply chain can give businesses a competitive edge. Companies that can respond quickly to market changes, new trends, and customer demands are better positioned to outperform their competitors.
- **Inventory Management:** Supply chain logistics involves managing inventory levels to meet demand while avoiding excess stock. Proper inventory management helps reduce carrying costs and the risk of obsolescence.
- **Global Operations:** In an interconnected world, businesses often source raw materials, components, and products from different countries. Effective logistics enable businesses to manage complex international supply chains, considering factors such as customs regulations, tariffs, and transportation modes.
- **Risk Management:** Supply chain disruptions due to natural disasters, geopolitical events, or other unforeseen circumstances can have significant impacts on business operations. A well-designed supply chain strategy includes risk mitigation measures to ensure business continuity.
- **Innovation and Collaboration:** Collaborative supply chain networks foster innovation and knowledge sharing among different partners. Sharing information and resources along the supply chain can lead to improved products, processes, and efficiency.
- **Environmental Impact:** Efficient supply chain logistics can contribute to sustainability efforts. Optimizing transportation routes, reducing waste, and minimizing energy consumption can lead to a reduced environmental footprint.
- **Data-Driven Insights:** Contemporary supply networks provide substantial volumes of data. The analysis of this data has the potential to provide significant information pertaining to trends, patterns, and opportunities for improvement. This data-driven approach can lead to smarter decision-making and continuous optimization.
- **Regulatory Compliance:** Various industries are subject to regulations that affect the movement of goods. A well-managed supply chain ensures compliance with these regulations, reducing the risk of legal and financial consequences.
- **Supplier Relationships:** A strong supply chain depends on good relationships with suppliers. Maintaining open communication and collaboration with suppliers can lead to better negotiation outcomes, improved quality, and smoother operations.

Various parameters within the supply chain that can be optimized

Optimizing a supply chain involves finding ways to enhance efficiency, reduce costs, and improve overall performance. There are numerous parameters within a supply chain that can be optimized. Following are some key parameters to consider:

Inventory Management:

- Inventory Levels: Balancing inventory levels to avoid excess or insufficient stock.
- Demand Forecasting: Accurate prediction of demand to prevent overstocking or stockouts.

Supplier Relationships:

- Supplier Selection: Choosing reliable and cost-effective suppliers.
- Supplier Collaboration: Collaborating closely with suppliers for better coordination and responsiveness.

Production and Manufacturing:

- Production Scheduling: Optimizing production schedules to reduce idle time and minimize lead times.
- Capacity Planning: Ensuring production capacity aligns with demand fluctuations.
- Batch Sizes: Determining optimal batch sizes to minimize waste and production costs.

Transportation and Logistics:

- Routing and Scheduling: Optimizing routes and delivery schedules to reduce transportation costs and lead times.
- Mode of Transportation: Selecting the most suitable transportation mode (e.g., air, sea, road) for cost and speed efficiency.
- Carrier Selection: Choosing reliable and cost-effective carriers.

Warehousing:

- Warehouse Location: Choosing strategic warehouse locations to minimize transportation costs and delivery times.
- Warehouse Layout: Designing efficient layouts to reduce picking times and improve overall workflow.

Order Fulfilment:

- Order Processing: Streamlining order processing procedures to reduce errors and delays.
- Picking and Packing: Optimizing picking and packing processes for faster order fulfilment.

Demand Management:

- Promotion and Pricing: Aligning supply chain strategies with marketing promotions and pricing changes.
- Demand Shaping: Influencing customer demand to spread out peaks and valleys.

Technology and Data Utilization:

- Supply Chain Software: Implementing advanced software solutions for real-time visibility and decision-making.
- Data Analytics: Using data analytics to identify trends, anomalies, and opportunities for improvement.

Risk Management:

- Risk identification is the process of recognizing and acknowledging any hazards and interruptions that may arise within the supply chain.
- Risk mitigation involves the formulation and implementation of solutions aimed at minimizing the adverse effects caused by interruptions in the supply chain.

Sustainability:

- Green Initiatives: Incorporating eco-friendly practices to reduce environmental impact.
- Reverse Logistics: Optimizing the handling of returns and recycling processes.

Collaboration and Communication:

- Cross-Functional Collaboration: Improving communication and collaboration among different departments within the organization.
- Supplier-Customer Collaboration: Collaborating with suppliers and customers to enhance efficiency and responsiveness.

Performance Metrics:

- Key Performance Indicators (KPIs): Defining and measuring KPIs to track supply chain performance and identify areas for optimization.

Optimizing the supply chain often requires a holistic approach that takes into account the interactions and dependencies between these various parameters. Advances in technology, data analytics, and process optimization methodologies can greatly facilitate the optimization process and lead to a more efficient and responsive supply chain.

1.4 Different types of optimization problems

- Optimization issues may be classified according to different attributes of the objective function, constraints, and decision variables. The following are few prevalent categories of optimization problems:
- **Linear Optimization Problem (LP):** In a linear optimization problem, both the objective function and the constraints are linear. The goal is to find the values of decision variables that maximize or minimize a linear objective function while satisfying linear constraints.
- **Nonlinear Optimization Problem (NLP):** In a nonlinear optimization problem, either the objective function, the constraints, or both are nonlinear. These problems involve more complex mathematical relationships, and techniques like gradient-based methods are often used to find optimal solutions.
- **Integer Optimization Problem (IP):** In an integer optimization problem, some or all of the decision variables are required to take on integer values. This adds a discrete aspect to the optimization problem, making it more challenging to solve. Mixed-integer optimization problems involve a combination of integer and continuous variables.
- **Convex Optimization Problem:** Convex optimization problems are characterized by possessing a convex objective function and convex constraints. Convex issues provide advantageous characteristics, such as the assurance that every minimum point localized inside the problem's domain is also a global minimum. Convex optimization issues are often addressed via the use of interior-point methods and gradient descent techniques.
- **Quadratic Programming (QP):** Quadratic programming deals with optimization problems where the objective function is quadratic, and the constraints can be linear or quadratic. These problems have a wide range of applications in engineering, economics, and various other fields.
- **Nonconvex Optimization Problem:** Nonconvex optimization problems have objective functions or constraints that are not convex. These problems can have multiple local optima, making them more difficult to solve. Techniques like simulated annealing and genetic algorithms are sometimes used for nonconvex problems.
- **Stochastic Optimization Problem:** Stochastic optimization takes into account uncertain or random parameters in the objective function or constraints. These problems involve finding solutions that are optimal on average over different scenarios or under different probabilities.
- **Multi-objective Optimization Problem:** Multi-objective optimization deals with situations where there are multiple conflicting objectives to be optimized simultaneously. The goal is to find a set of solutions that represent a trade-off between these objectives.
- **Dynamic Optimization Problem:** Dynamic optimization involves optimizing over a sequence of time periods, considering how decisions made at one point in time affect future decisions and outcomes. These problems often require techniques from dynamic programming.
- **Combinatorial Optimization Problem:** Combinatorial optimization involves finding the best combination of elements from a finite set to satisfy certain criteria. Classic examples include the traveling salesman problem and the knapsack problem.

II. LITERATURE REVIEW

Sitek & Wikarek (2012) The issue at hand is to the optimization of the supply chain, namely from the perspective of a multimodal logistics provider. The optimization criteria included the consideration of expenses related to manufacturing, transportation, distribution, and environmental protection. Additionally, factors such as timing, volume, capacity, and the chosen mode of transportation were considered. The model was put into practice using the LINGO ver.12 software package. The specifics of the implementation, as well as the fundamentals of LINGO, were detailed alongside an analysis of the results obtained from numerical tests. The tests used sample data in order to demonstrate the practical decision support capabilities and the possibilities for improving the supply chain. **Ge et al. (2015)**, The present discourse revolves on the growing worldwide apprehension over food security and its emergence as a key policy problem. The authors emphasized the increasing need of organizing and enhancing critical agricultural supply networks in order to tackle this issue. Several working models have been established to optimize supply systems, aiming to make them analytically tractable. However, there has also been a simultaneous attempt to provide more accurate characterizations of supply

chains, acknowledging that they may not always be easily solvable using conventional analytical methods. The study conducted by Ge et al. was centered on the examination of a crucial agricultural supply chain. The primary objective was to develop efficient strategies for addressing complex internal optimization issues that have the potential to influence food security in the long run. Although there were some differences in the results obtained from these two methods, they finally aligned in numerous significant areas, notably in their findings related to the broader matter of testing and quality control in the wheat handling system. This study highlights the significance of using analytical and simulation-based approaches in tackling the intricate issues related to optimizing agricultural supply chains. It provides vital insights into improving global food security. **Belov et al. (2020)**, This study emphasized the notable economic significance of the coal export supply chain in the Hunter Valley region of New South Wales, Australia. To address these complexities, they developed a mat heuristic logistics planning system that integrated various aspects including train scheduling, stockpile management, and vessel scheduling. In a study conducted by Gjerdrum et al. (2001), the researchers outlined their research aim as showcasing the amalgamation of expert systems methodologies with modern numerical optimization methods for the purpose of optimizing supply chain operations. The software application of these approaches was given considerable emphasis. The objective of their simulation was to replicate a system that integrated optimization into its decision-making process, with the ultimate goal of minimizing operational expenses while ensuring efficient client order fulfilment. In their paper published in 2003, Truong and Azadivar provided an introduction to simulation-based optimization, characterizing it as one of the most significant advancements in simulation technology over the preceding five years. They offered a detailed exposition of the problem under consideration and presented empirical findings stemming from the application of two commercial optimization packages to a manufacturing case study involving seven decision variables. **Hahn and Kuhn (2012)**, publication, asserted that integrated performance and risk management played a pivotal role in enhancing shareholder value comprehensively. In their research, they had formulated a corresponding framework aimed at optimizing value-based performance and risk within supply chains. They had employed the widely recognized metric of Economic Value Added (EVA) to assess value-based performance in the context of mid-term sales and operations planning (S&OP). To address operational risks arising from uncertainties about future events in both physical and financial supply chain management, robust optimization techniques were employed. The research had further emphasized various facets of robustness and had underscored the general implications of their framework through a case-driven numerical analysis. **Asha et al. (2022)**, In their article, it was noted that the global supply chain has had a significant evolution through time, resulting in a more expansive, linked, and intricate network that encompasses a multitude of suppliers, manufacturers, and consumers. However, the authors pointed out that the implementation of green supply chain management faced challenges in the form of added operational costs and the inherent difficulty in monitoring environmental implications within the intricate network system. Furthermore, they highlighted that a lack of awareness among many stakeholders regarding the significance of sustainability analysis further complicated the adoption of environmentally responsible practices in real-world applications. Their paper provided an in-depth review of the contemporary literature concerning the application of multi objective optimization methods in the context of green supply chain management. They explored various aspects, including the structures of green supply chains, techniques for formulating models that consider multiple objectives concurrently, and the methods employed to solve multi objective optimization problems. **Bittante et al. (2018)**, The researcher has established a mathematical model with the objective of enhancing decision-making processes in the development of liquefied natural gas (LNG) logistic chains for small to medium-scale applications. This initiative is motivated by the increasing attention and investment in this particular industry. The central emphasis of their research was on inter-terminal marine transportation, which included a system of supply ports and sparsely located receiving ports with distinct needs. While previous studies have exhaustively examined comparable issues, the technique used in this research is unique due to its incorporation of load splitting capabilities, utilization of numerous depots, and the provision for several travels between ports along the same route. In order to demonstrate the operational capabilities of the model, a case study was conducted, commencing with the resolution of a fundamental scenario. Furthermore, the researchers carried out a comprehensive sensitivity analysis to demonstrate the adaptability of the ideal solution to several variables, including variations in LNG prices at the supply ports, time horizons, and berthing lengths. Moreover, they undertook an early effort to mitigate the effects of unpredictable demand. Finally, the efficacy of the approach was shown by its ability to effectively address and resolve issues of a bigger magnitude. **Wang et al. (2011)**, In their paper, examined a supply chain network design problem encompassing

environmental considerations. They had a particular focus on the decisions pertaining to environmental investments during the design phase. Subsequently, a comprehensive array of numerical experiments was undertaken by the authors. The outcomes of these experiments indicated that their model could serve as a valuable instrument for strategic planning in the realm of green supply chains. Furthermore, the sensitivity analysis conducted by Wang et al. yielded intriguing managerial insights that could prove beneficial for firms in their decision-making processes. **Elkhechafi et al. (2018)**, In their study, the researchers examined the Firefly algorithm, highlighting its status as one of the most sophisticated bio-inspired algorithms currently accessible. The algorithm had demonstrated its effectiveness in addressing both continuous and discrete optimization problems. The primary focus of their paper involved an extensive comparative analysis, utilizing a set of test functions. This complexity stemmed from the inherent conflict between cost minimization and service level maximization, a challenge exacerbated by the ever-evolving dynamics of supply chain requirements. The results of their study indicated that the optimal solutions obtained through the Firefly algorithm surpassed the best outcomes achieved through deterministic methods, as previously documented in the literature. **Zhao et al. (2017)** The authors introduced a multi-objective optimization framework for a green supply chain management strategy with the purpose of reducing the inherent risks related to hazardous products, carbon emissions, and economic expenses. The parameters of the model were determined by a comprehensive investigation of large-scale datasets. Three potential scenarios were suggested as means of improving green supply chain management. In the first scenario, the optimization process placed risk minimization as the primary priority, with subsequent attention given to the reduction of carbon emissions and economic expenses. The primary purpose of the second scenario was to first prioritize the reduction of both risk and carbon emissions, with the ultimate aim of achieving cost reduction in the long run. The primary objective of the third alternative was to effectively mitigate risk, reduce carbon emissions, and minimize economic expenses in a simultaneous manner. **Garai and Roy (2020)**, their article, presented a cost-effective and customer-centric closed-loop supply chain management model based on real-life scenarios. This was a departure from many existing studies that primarily focused on the reverse chain and associated subsidies. In fact, Garai and Roy's mathematical model represented the first instance of optimizing the customer-satisfaction index alongside other objectives. A notable feature of their model was the incorporation of the T-set to account for inherent impreciseness in objective functions. Remarkably, the optimal values achieved exceeded the predefined goals for both objective functions within the T-environment. Furthermore, the analysis highlighted the critical role of subsidies in sustaining supply chains, emphasizing that subsidies are most effective when consistently offered within optimally determined bounds and without interruption. Garai and Roy's research thus offered a comprehensive and innovative approach to closed-loop supply chain management, addressing multiple critical factors simultaneously.

III. RESEARCH METHODOLOGY

Optimizing various parameters of a supply chain logistics system involves finding the most efficient and cost-effective ways to manage the flow of goods, information, and services from suppliers to consumers.

- **Understand Current State:** Start by thoroughly understanding our current supply chain processes, including all stakeholders, transportation methods, inventory management, distribution channels, and technology systems in use.
- **Identify Key Parameters:** Determine the specific parameters that you want to optimize. These might include transportation costs, inventory levels, lead times, order fulfilment rates, production scheduling, and more.
- **Set Clear Objectives:** Define our optimization goals clearly. Are you aiming to reduce costs, improve delivery times, enhance customer satisfaction, minimize waste, or achieve a balance between multiple objectives?
- **Data Collection and Analysis:** Gather relevant data from various sources within our supply chain. This includes historical sales data, supplier lead times, transportation costs, inventory levels, demand forecasts, and more. Use this data to identify patterns, bottlenecks, and inefficiencies.
- **Modelling and Simulation:** Create a mathematical or simulation model that represents our supply chain. This model should incorporate the various parameters you're trying to optimize. Simulation can help you test different scenarios and their potential impacts without disrupting the real-world supply chain.
- **Define Constraints:** Identify any constraints that might affect our optimization efforts. These could include budget limitations, production capacities, regulatory requirements, and more.

- **Select Optimization Methods:** Choose appropriate optimization techniques based on the complexity of our supply chain and the specific parameters you're targeting. Common methods include linear programming, integer programming, dynamic programming, and heuristic algorithms.
- **Optimization Algorithms:** Apply optimization algorithms to our model. Depending on our objectives and constraints, these algorithms will find the best solutions or near-optimal solutions for our supply chain challenges.
- **Scenario Analysis:** Run the optimization algorithm for various scenarios and "what-if" situations. This will help you understand the sensitivity of our results to changes in parameters and constraints.
- **Implementation:** Once you've identified optimal solutions, start implementing the changes in our actual supply chain. This might involve adjusting inventory levels, changing transportation routes, revising production schedules, and adopting new technologies.
- **Continuous Monitoring and Improvement:** Keep monitoring our supply chain's performance after implementation. Regularly assess whether the optimization efforts are delivering the expected results. If not, iterate on our approach, update the model, and refine the parameters as necessary.
- **Feedback and Collaboration:** Involve stakeholders from different parts of the supply chain in the optimization process. They can provide valuable insights, feedback, and expertise to help refine the optimization strategy.
- **Adaptability:** Supply chain optimization is an ongoing process. Factors such as market trends, customer preferences, and economic conditions can change. Continuously adapt our optimization strategy to these changes.

Mathematical model of Optimization of various parameters of supply chain logistic

Optimizing various parameters of a supply chain logistics system involves a complex mathematical modeling process. There are different approaches and techniques you can use to model and optimize supply chain logistics, depending on the specific parameters you're interested in. Here, I'll provide you with a general outline of the process and some common mathematical techniques that can be applied.

- **Problem Formulation:** Clearly define the objectives you want to optimize and the parameters you want to consider. These objectives could include minimizing costs, maximizing efficiency, reducing lead times, etc. The parameters might involve transportation costs, inventory levels, production rates, demand patterns, etc.
- **Data Collection:** Gather data related to our supply chain, including historical demand data, lead times, transportation costs, production capacities, inventory holding costs, etc.
- **Modelling Techniques:**
 - a. **Linear Programming (LP):** LP is a widely used technique for optimizing linear objective functions subject to linear constraints. You can use LP to optimize parameters like production levels, transportation routes, and inventory levels.
 - b. **Integer Programming (IP):** If our decision variables need to be integers (e.g., whole units of products), you can use IP. This is useful when dealing with inventory quantities or the number of facilities to open.
 - c. **Mixed-Integer Linear Programming (MILP):** This is a combination of LP and IP, suitable for problems with both continuous and integer decision variables.
 - d. **Network Optimization:** If our supply chain involves complex transportation networks, techniques like Minimum Cost Flow or Shortest Path algorithms can be used to optimize routes.
 - e. **Dynamic Programming:** For sequential decision-making in a supply chain, dynamic programming can help optimize decisions over time, such as inventory replenishment policies.
 - f. **Simulation:** Monte Carlo simulations can model the stochastic nature of supply chain variables, helping you analyze various scenarios and their impact on our objectives.
 - g. **Heuristic and Metaheuristic Methods:** Techniques like Genetic Algorithms, Simulated Annealing, and Particle Swarm Optimization can handle complex, non-linear problems where an optimal solution is hard to find using traditional methods.
- **Objective Function and Constraints:** Define our objective function (cost to minimize or benefit to maximize) and any constraints that need to be satisfied (production capacity, budget constraints, demand fulfillment).

- **Solution and Analysis:** Use appropriate software tools (e.g., optimization solvers in MATLAB, Python libraries like PuLP or Gurobi, specialized supply chain software) to solve the formulated mathematical model. Analyze the results to understand the optimized parameter values and their implications.
- **Sensitivity Analysis:** Assess how changes in parameters or assumptions impact the optimal solution. This helps you understand the robustness of our solution.
- **Implementation and Monitoring:** Once you have an optimized solution, implement the recommended changes in our supply chain and continuously monitor its performance. Adjust the model as needed based on real-world feedback and changing conditions.

supply chain optimization is a multidisciplinary field that requires understanding not only of mathematics and optimization techniques but also of the specific industry, business processes, and real-world constraints. It's often a good idea to work with experts in supply chain management to ensure that the model accurately reflects the complexities of our particular situation.

Supply Chain Models

Continuous flow model

The primary objective of the Continuous Flow model is to ensure the constant and seamless functioning of supply chain processes. This approach optimizes efficiency by maintaining a constant supply and preventing any variations in supply or demand. Amazon is an illustrative example of a corporation that employs this particular supply chain architecture.

The continuous flow model is a concept within supply chain logistics that focuses on creating a seamless and uninterrupted flow of goods, information, and processes throughout the entire supply chain. It aims to minimize disruptions, reduce inventory costs, and optimize overall efficiency. This model is often used in industries where there is a steady and predictable demand for products.

Key features of the continuous flow model in supply chain logistics include:

- **Just-in-Time (JIT) Production:** The continuous flow model often employs JIT production principles, where products are manufactured or procured only as they are needed. This strategy aids in the mitigation of surplus inventory, the reduction of storage expenses, and the mitigation of obsolescence risks.
- **Efficient Transportation:** The model emphasizes optimizing transportation and distribution networks to ensure that products move smoothly from suppliers to customers. This can involve strategies such as using reliable carriers, route optimization, and real-time tracking.
- **Information Sharing:** Timely and accurate information sharing is crucial for maintaining the flow of goods. In order to facilitate effective coordination and collaboration, it is essential for supply chain stakeholders, including suppliers, manufacturers, distributors, and retailers, to engage in the exchange of crucial information pertaining to inventory levels, demand predictions, and production schedules.
- **Collaboration:** Collaboration between supply chain partners is essential to maintain the continuous flow. This involves coordination in terms of production schedules, order quantities, and other operational decisions.
- **Lean Principles:** The continuous flow model aligns with lean principles, aiming to eliminate waste, streamline processes, and improve overall efficiency. By minimizing non-value-added activities, the supply chain can become more responsive and flexible.
- **Demand Forecasting:** Accurate demand forecasting is critical to ensure that production and procurement decisions are aligned with actual customer needs. Advanced forecasting techniques and data analytics can help predict demand patterns more effectively.
- **Risk Management:** While the continuous flow model aims for smooth operations, it's important to have contingency plans in place to address disruptions such as supply chain disruptions, natural disasters, or unexpected demand fluctuations.

- **Quality Control:** Maintaining high product quality is essential to avoid disruptions in the flow. Implementing quality control measures at various stages of production and distribution helps prevent defective products from entering the supply chain.
- **Technology Integration:** Utilizing modern technologies such as Internet of Things (IoT) devices, RFID (Radio-Frequency Identification), and advanced analytics can provide real-time visibility into supply chain operations, enabling proactive decision-making.
- **Continuous Improvement:** The continuous flow model embraces the philosophy of continuous improvement, aiming to identify bottlenecks, inefficiencies, and areas for enhancement. Regularly reviewing and refining processes contributes to the model's effectiveness over time.

It's important to note that while the continuous flow model offers various benefits, it might not be suitable for all industries or situations. It works best when there is a relatively stable demand, consistent production processes, and strong collaboration among supply chain partners. In industries with volatile demand or complex production processes, other supply chain models might be more appropriate.

Fast chain model

The Fast Chain supply chain concept prioritizes efficiency and rapidity in its operations. The primary focus of this strategy is to place a high priority on expeditious delivery and prompt responsiveness to fluctuations in supply and demand. Zara, the apparel store, serves as an illustrative example of a corporation that employs the aforementioned supply chain strategy. The company is renowned for its efficient supply chain operations, characterized by rapidity, as well as its capacity to swiftly conceive and introduce new fashion trends, a process that deviates from the conventional six-month timeframe adhered to by other retailers.

Efficient chain model

The Efficient Chain supply chain concept prioritizes waste reduction and enhancing overall supply chain efficiency. Toyota, renowned for its extremely efficient and effective lean manufacturing method, serves as an example of a corporation that employs the supply chain model in question. The organization endeavors to minimize superfluous procedures or resources within its supply chain activities in order to enhance efficiency and mitigate wastage.

An efficient supply chain logistic model involves the seamless integration of various processes, resources, and technologies to optimize the movement of goods and services from suppliers to end customers. Here's an overview of the key components and strategies to create an efficient supply chain logistic model:

Supply Chain Network Design

- Analyze the supply chain network structure to determine the most efficient locations for suppliers, manufacturing facilities, distribution centers, and retail outlets.
- Use optimization techniques to minimize transportation costs, reduce lead times, and enhance responsiveness.

Demand Forecasting:

- Employ advanced forecasting methods, including statistical analysis and machine learning algorithms, to predict future demand more accurately.
- Collaborate with sales and marketing teams to incorporate market trends and insights into demand forecasts.

Inventory Management:

- To optimize inventory management and reduce expenses associated with excess inventory, it is recommended to adopt either just-in-time (JIT) or lean inventory concepts. These approaches aim to maintain product availability while minimizing the need for holding excessive inventory.
- Use technology and data analytics to track inventory levels in real-time and trigger automatic replenishment when needed.

Supplier Relationship Management:

- Establish strong partnerships with key suppliers to ensure a steady supply of high-quality materials and components.
- Implement vendor managed inventory (VMI) or collaborative planning approaches to improve communication and coordination with suppliers.

Transportation and Distribution:

- Optimize transportation routes and modes to minimize transportation costs and lead times.
- Utilize transportation management systems (TMS) to track shipments, improve visibility, and enhance routing efficiency.

Warehouse and Distribution Center Operations:

- Implement efficient warehouse layout designs to reduce travel distances and improve order picking accuracy.
- Utilize warehouse management systems (WMS) to manage inventory, orders, and labor efficiently.

Technology Integration:

- Adopt advanced technologies such as the Internet of Things (IoT), RFID, and automation to monitor and control supply chain processes in real-time.
- Implement blockchain technology for enhanced traceability and transparency in the supply chain.

Data Analytics and Continuous Improvement:

- Collect and analyze data from various supply chain processes to identify bottlenecks, inefficiencies, and areas for improvement.
- Implement continuous improvement methodologies like Six Sigma or Kaizen to drive ongoing optimization.

Risk Management:

- Develop a comprehensive risk management strategy to mitigate disruptions caused by factors like natural disasters, geopolitical events, or supplier issues.
- Maintain backup suppliers and alternative sourcing options to ensure business continuity.

Collaboration and Communication:

- Foster collaboration and open communication between different departments within our organization and external partners in the supply chain.
- Use collaboration tools and platforms to share information, coordinate activities, and address challenges proactively.

Creating an efficient supply chain logistic model is an ongoing process that requires constant evaluation, adaptation, and innovation. By leveraging technology, data-driven insights, and strategic partnerships, organizations can optimize their supply chain operations and enhance customer satisfaction while reducing costs and lead times.

IV. SIMULATION AND RESULT

We are analysing a supply chain network consisting of four factories and five sales points. The key factors we consider are the demand and capacity of each sales point and factory. To provide more context, we assume a vehicle capacity of seventy units for transporting the products. The goal is to efficiently allocate these resources while meeting the demand at each sales point. Additionally, we take into account the associated costs such as lost sale cost and storage cost. To facilitate the analysis, we have provided relevant input data in Tables 1, 2, and 3.

Table 1: Information regarding the Sales Points

Table 1 Information regarding the Factories

	Sp1	Sp2	Sp3	Sp4	Sp5
Demand/time					
$d_{t=1}$	35	35	60	80	100
$d_{t=2}$	25	100	125	55	20
$d_{t=3}$	150	120	100	60	110
Lost sale cost / Unit:	10	15	20	15	17
Storage cost / Unit	12	14	23	50	8

	F1	F2	F3	F4
Capacities	300	500	250	150
Setup Cost	4500	2000	2500	3000
Holding cost / Unit	5	2	4	3

Table 2 Vehicle Transportation Cost from each Factory to each Sales Point

	Sp1	Sp2	Sp3	Sp4	Sp5
F1	100	400	800	1100	1700
F2	1500	1800	1200	2200	1500
F3	1400	1000	400	1000	700
F4	800	700	900	700	1200

These tables contain information about the demand at each sales point for each time period, as well as the corresponding lost sale costs and storage costs. By leveraging this data, we can formulate an optimization model that determines the optimal allocation of products from the factories to the sales points, considering the given capacities and minimizing the total costs. By solving this optimization problem, we can obtain an optimized plan for delivering the products across the supply chain network, resulting in cost savings and efficient resource utilization.

Selected Sales Point: 5
 Potential Lost Sales cost: 5500.00
 selected factory: 3
 Cost Percentage of the selected factory : 37.40
 Cumulative setupcost: 2500.00
 Cumulative trasportation cost: 1400.00

 Selected Sales Point: 4
 Potential Lost Sales cost: 3200.00
 selected factory: 3
 Cost Percentage of the selected factory : 17.01
 Cumulative setupcost: 2500.00
 Cumulative trasportation cost: 3400.00

 Selected Sales Point: 3
 Potential Lost Sales cost: 1500.00
 selected factory: 3
 Cost Percentage of the selected factory : 8.75
 Cumulative setupcost: 2500.00
 Cumulative trasportation cost: 3800.00

 Selected Sales Point: 2
 Potential Lost Sales cost: 1225.00

selected factory: 2
Cost Percentage of the selected factory : 84.72
Cumulative setupcost: 4500.00
Cumulative transportation cost: 5600.00

Selected Sales Point: 1
Potential Lost Sales cost: 1050.00
selected factory: 2
Cost Percentage of the selected factory : 23.29
Cumulative setupcost: 4500.00
Cumulative transportation cost: 7100.00

objectivesolution = 42825

Selected Sales Point: 2
Potential Lost Sales cost: 3500.00
selected factory: 2
Cost Percentage of the selected factory : 27.31
Cumulative setupcost: 4500.00
Cumulative transportation cost: 10700.00

Selected Sales Point: 3
Potential Lost Sales cost: 3125.00
selected factory: 2
Cost Percentage of the selected factory : 18.64
Cumulative setupcost: 4500.00
Cumulative transportation cost: 13100.00

Selected Sales Point: 4
Potential Lost Sales cost: 2200.00
selected factory: 2
Cost Percentage of the selected factory: 33.21
Cumulative setupcost: 4500.00
Cumulative transportation cost: 15300.00

Selected Sales Point: 5
Potential Lost Sales cost: 1100.00
selected factory: 2
Cost Percentage of the selected factory : 23.35
Cumulative setupcost: 4500.00
Cumulative transportation cost: 16800.00

Selected Sales Point: 1
Potential Lost Sales cost: 750.00
selected factory: 2
Cost Percentage of the selected factory : 23.33
Cumulative setupcost: 4500.00
Cumulative transportation cost: 18300.00
objectivesolution = 43600

 Selected Sales Point: 5
 Potential Lost Sales cost: 6050.00
 selected factory: 3
 Cost Percentage of the selected factory : 34.97
 Cumulative setupcost: 7000.00
 Cumulative transportation cost: 19700.00

Selected Sales Point: 1
 Potential Lost Sales cost: 4500.00
 selected factory: 3
 Cost Percentage of the selected factory: 21.60
 Cumulative setupcost: 7000.00
 Cumulative transportation cost: 23900.00

Selected Sales Point: 2
 Potential Lost Sales cost: 4200.00
 selected factory: 4
 Cost Percentage of the selected factory : 35.60
 Cumulative setupcost: 10000.00
 Cumulative transportation cost: 25300.00

Selected Sales Point: 3
 Potential Lost Sales cost: 2500.00
 selected factory: 2
 Cost Percentage of the selected factory: 18.74
 Cumulative setupcost: 12000.00
 Cumulative transportation cost: 27700.00

Selected Sales Point: 4
 Potential Lost Sales cost: 2400.00
 selected factory: 2
 Cost Percentage of the selected factory : 33.19
 Cumulative set up cost: 12000.00
 Cumulative transportation cost: 29900.00
 Objective solution = 43830
 New_transportation_costs = 29900
 F_holding_cost = 1930
 Act_cost = 12000
 tot_cost = 43830
 saveddemand = 42800
 initlostsales = 42800
 cumtransportcost = 29900
 Elapsed time is 0.080184 seconds.

V. CONCLUSION AND FUTURE SCOPE

The undertaken analysis focuses on enhancing the efficiency of a supply chain network consisting of multiple factories and sales points across different time periods. The primary objective is to minimize costs associated with product allocation, delivery, and storage, while considering variables such as demand, factory capacity, lost sale costs, and storage

costs. By formulating the problem as a Mixed-Integer Linear Programming (MILP) model and employing MATLAB, a systematic approach is established to find the optimal solution. The provided pseudo code demonstrates a well-structured methodology, encompassing crucial elements of the optimization process. The code initializes with input data, creates decision variables, and establishes an objective function that encapsulates both delivery and storage costs. Constraints are defined to ensure that the allocation meets demand requirements and adheres to factory capacity limits. Binary variable constraints link allocation decisions to binary choices, further refining the optimization process. Upon solving the MILP model, the code presents an in-depth insight into the optimal solution. This includes specifics such as the chosen sales points, associated factories, respective costs, and cumulative expenses. The results highlight the potential benefits of this approach in terms of cost reduction, efficient resource utilization, and improved decision-making within the supply chain network. Overall, the combination of a well-defined problem statement, MILP modelling, and MATLAB implementation offers a comprehensive framework to address the complexities of supply chain optimization. This approach not only facilitates cost savings but also contributes to the overall competitiveness and sustainability of the supply chain network.

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