



## IMPACT OF SUPPLY CHAIN DIGITALIZATION ON OPERATIONAL EFFICIENCY

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### Abstract:

*It has become clear that the digitization of supply chains is a disruptive force that has the potential to greatly improve operational efficiency across a variety of sectors. This article investigates the myriad of effects that digitization of supply chains may have, with a particular focus on the incorporation of cutting-edge technologies like blockchain, artificial intelligence (AI), and the Internet of Things (IoT). Through the facilitation of real-time data exchange, predictive analytics, and automated decision-making, digitalization brings about enhanced visibility, responsiveness, and cooperation among the many parties involved in the supply chain environment. Case studies highlight how businesses that make use of digital solutions are able to accomplish faster procedures, shorter lead times, and optimal inventory management. Based on the data, it appears that adopting digitalization not only improves operational efficiency but also propels innovation and competitiveness in a market landscape that is becoming increasingly dynamic. The findings of this study highlight the need of firms adopting digital strategies in order to succeed in the always changing environment of supply chain management.*

**Keywords:** Supply Chain, Digitalization, Efficiency

### Introduction:

In our day, which is defined by fast technology breakthroughs, the digital transformation of supply chains has become an essential component in the process of improving operational efficiency. For the most part, digital solutions that enable real-time communication, data integration, and automated decision-making are gradually replacing traditional supply chain management, which frequently relies on manual procedures and information that is stored in silos. This change not only improves the efficiency with which resources are allocated and procedures are streamlined, but it also makes supply chains more agile and responsive in general. A wide variety of technologies are included in the idea of supply chain digitization. These technologies include the Internet of Things (IoT), artificial intelligence (AI), big data analytics, and blockchain. The ability of businesses to collect and analyze massive volumes of data is made possible by these advancements, which ultimately results in improvements to forecasting, inventory management, and customer service. To provide an example, Internet of Things devices may monitor product conditions while they are in transit, and artificial intelligence algorithms can forecast swings in demand, which enables businesses to modify their operations in a proactive manner. Increasingly, organizations are coming to the realization that they must implement digital technologies in order to maintain their relevance in the global economy, which is becoming increasingly competitive. The use of digital supply chains not only lowers operating expenses but also opens the door to new business models and potential for further innovation. The move to digitalization, on the other hand, involves a number of problems, such as the requirement for substantial expenditures in technology, the necessity for changes in organizational culture, and the requirement for personnel to obtain new skill sets. The purpose of this article is to explore the influence

that digitization of supply chains has on operational efficiency, looking at both the benefits and the obstacles that are involved with this transition. This research aims to give insights into how digitalization may produce major improvements in supply chain performance and contribute to sustained competitive advantage by evaluating real-world case studies and current industry trends. Specifically, the research will focus on helping to deliver these insights.

### **Supply Chain Management (SCM)**

The phrase "supply chain" refers to a functional network structure that links several stakeholders, including suppliers, manufacturers, distributors, and consumers. It begins with the creation of components, continues with the production of intermediate and final goods, and concludes with the distribution of these items throughout the sales network. In another sense, a supply chain may be seen as an interface that is established between members of the supply chain via activities in order to enable companies to fulfill both internal and external needs. The term "supply chain management" (SCM) refers to a collection of actions and procedures that are designed to plan, regulate, coordinate, and optimize the whole supply chain system. This is done in order to enable businesses to integrate and collaborate in order to meet the volatile and complicated situation that exists in the external market. Supply chain management (SCM) is a method of management that is integrated and coordinated, and it demands the members of the supply chain system to work together in order to accomplish the goals of the corporation. In the beginning, the technique of supply chain management (SCM) was very popular in the manufacturing business. Its primary focus was on logistics management duties, with the goal of lowering transportation costs. However, as time went on, it expanded to encompass all parts of the supply chain [4]. According to the statistics, a firm spends a significant amount of money on its supply chain, which accounts for roughly 25 percent of the company's operational expenditures. Therefore, efficient management of the supply chain is one of the most important factors in lowering needless expenditures and improving overall performance. There have been a lot of researchers focusing on improving the effectiveness of SCM. It was agreed upon that efficient management of supply chains may assist businesses in enhancing their competitive advantages, which in turn boosts their performance and puts them ahead of their rivals. In specifically, it may assist in accomplishing four objectives: reducing the risks that firms are exposed to, achieving earnings growth, providing predictable income, and shortening the amount of time it takes for cash flow to be used. On the other hand, achieving efficient supply chain management in the tough and complicated market environment that exists in this era of economic globalization is not a simple task. A substantial quantity of information is constantly being introduced into the market, which not only brings about a wealth of opportunities but also hints to potential dangers. For example, businesses are unable to correctly gather relevant information in the supply chain and recognize changes in a timely manner, which results in difficulties in selecting the appropriate option and lack of success in decision-making. Alternately, in a typical supply chain, it is difficult to carry out significant information exchange in order to overcome the communication barriers that exist among the member businesses. In light of this, the growth of information inside the supply chain is becoming more prevalent, which is a significant solution to this problem that contributes to the digital supply chain (DSC). Nowicka is of the opinion that the digital supply chain has the potential to successfully increase information transparency among members of the supply chain. This, in turn, considerably promotes the efficiency of information exchange while simultaneously decreasing the cost of time, shortening the flow cycle, and reducing costs that are not essential. It is extremely important for suppliers, manufacturers, and distributors to have effective and accurate communication in order to maintain collaboration and confidence among themselves. This is especially true when it comes to the use of inventory and logistics, which significantly saves wasteful expenditures that are not value-added activities. However, due to the vast quantity of data that is accessible both in and out of the market, the accessibility of information and the speed with which

information feedback is provided are also critical factors in determining the effectiveness of supply chain management. Through the use of real-time monitoring capabilities, the digital supply chain has the potential to enhance the supply chain's traceability, dependability, and reaction speed. When this capability is combined with the ability to predict the risk of the supply chain and to make decisions through the rapid collection, analysis, and processing of pertinent information, organizations and supply chains are able to achieve higher levels of efficiency by reacting more quickly to disruptions that are observed both internally and externally.

### **Supply Chain Digitalization**

As the landscape of supply chain management continues to evolve, the incorporation of digital technology has become increasingly important for businesses that are looking to give themselves a competitive advantage in the digital era. Companies were compelled to implement remote working, paperless operations, and reorganize supply chain structures as a result of the outbreak of COVID-19, which further emphasized the demand for digitization. Various digital technologies that provide solutions that are particular to supply chain difficulties are being adopted by businesses in order to handle specific supply chain challenges. The implementation of block chain technology in the food supply chain is a noteworthy example. This technology enables core firms and stakeholders to monitor and trace the whole process of food production. Within the supply chain, this innovation improves both the transparency and the integrity of the process. Companies that are beginning the process of digitalization do more than just introduce digital technology; they also incorporate digital strategy, organizational structure, culture, and talent into their operations. This all-encompassing strategy guarantees that digitization will be included in a thorough manner.

Supply chain digitization (SCD) is a driving force that integrates digital technologies such as big data, cloud computing, block chain, Internet of Things (IoT), and artificial intelligence into operations that take place inside the supply chain. Creating operational procedures that are enhanced by digital technology is the primary emphasis of SCD, which is centered on "data-driven decision-making." In order to achieve traceability over the entirety of the product lifetime, it is essential to stress the relevance of digital technologies such as smart contracts, digital storage, and intelligent labeling. By doing so, not only does this provide a digital traceability service, but it also considerably enhances the supply chain's transparency and integrity.

To this end, digitalization may be divided into two distinct categories: internal digitalization and outward digitalization. Through the utilization of different technologies, such as video conferencing and digital training, the objective of internal digitalization is to improve the effectiveness of operational procedures. The objective of external digitalization is to make use of digital technology in order to improve interactions with stakeholders, lower the costs of communication, and anticipate the requirements of customers. Examine the procedures that must be followed in order to accomplish digitalization, with a particular focus on the extraction of useful information from the outcomes of data analysis in order to enhance operational procedures. When it comes to digitalization, there are two primary areas that are reflected: digital products and services, and digital processes. Comprehensive digital products and services are offered by highly digital businesses, which also utilize advanced digital procedures in their operations.

The servitization of manufacturing enterprises is facilitated by digitalization, which also results in the development of new digital business models and potential for value creation among manufacturers. The manufacturing industry is undergoing a process of transformation as a result of this revolutionary transition toward digital servitization. To demonstrate that enhancing digital capabilities enables buyer companies to improve information sharing and relationship transparency with supplier firms, thereby reducing

opportunistic and unethical behavior and fostering a stronger partnership, a macro perspective on digitalization, which takes into consideration digital connectivity, internet use, e-business, e-commerce, and e-government, demonstrates that digitalization has a positive impact on the development of financial markets and institutions. In its most basic form, supply chain digitization entails the incremental adoption of particular digital technologies that are specifically designed to meet a wide range of supply chain difficulties. This is a reflection of the dynamic character of the digital world.

### **Digitalization and Supply Chain Performance**

There is widespread recognition of the transformational potential of digitalization, which refers to the introduction of digital technology into corporate operations. This potential is acknowledged for its ability to improve organizational performance. Digitalization in supply chain management refers to the process of using digital technology in order to ensure that transactions are carried out without any interruptions across the supply chain network. In addition to facilitating the sharing of information in real time, this integration also improves communication and encourages collaboration among partners in the supply chain. As a result of these improvements, supply chain responsiveness and agility are increased, which assists firms in navigating changes in the market and meeting the ever-changing expectations of their customers.

The influence of digitalization on the performance of supply chains is a complicated topic of research that reflects a variety of results and included a number of intricate dynamics. It has been argued by a number of academics that digitization encourages increased levels of efficiency and collaboration throughout the supply chain, which ultimately results in enhanced performance. There is a contention that digitization makes it possible to engage and communicate in real time, which in turn increases total productivity. Provide additional support for this viewpoint by showing the ways in which digitalization improves the agility and responsiveness of supply chain operations. Concerns have been raised, on the other hand, regarding the possible drawbacks that might result from digitization. draws attention to the fact that differences in digital capabilities across partners in the supply chain might result in imbalances and difficulties in integration. highlights the increasing expenditures in information technology infrastructure that may be required as a result of digitalization, which may have an impact on the cost structure of supply chain operations.

A noteworthy discovery made by researchers in recent times highlights the favorable effect that digitalization has on the performance results of supply chain operations. Companies now have the ability to improve their processes, decrease bottlenecks, and shorten lead times as a result of the incorporation of digital technologies such as data analytics, devices connected to the Internet of Things (IoT), and automation. As a consequence of this, supply chains become more adaptable and possess the ability to fast respond to alterations in customer preferences or interruptions in the operational landscape. Furthermore, have brought attention to the ways in which digitization may improve the collaboration and coordination within supply chains, which ultimately results in an improvement in overall performance. Through the facilitation of real-time data exchange and transparency, digitization helps to develop better connections among stakeholders in the supply chain and eliminates information asymmetry. Not only does this make it possible to make more accurate demand forecasts, but it also makes it possible to manage inventories more effectively and allocate resources more efficiently, which contributes to an increase in the supply chain's efficiency and effectiveness.

### **Digitalization and Supply Chain Integration**

Experts in the field of supply chain dynamics have focused their attention on one facet of digitalization's revolutionary effects: the way it enhances supply chain integration (SCI). Several parts of SCI are

strengthened by digital technology, and the literature provides a multi-faceted analysis of this topic, which is helpful for businesses handling uncertain situations. A contemporary business strategy would be incomplete without supply chain integration (SCI), which stands for the collaborative interaction between an organization and its essential supply chain partners to streamline and standardize various supply chain processes. There are two main axes along which SCI operates as an all-encompassing approach to supply chain management: supplier integration and customer integration.

The objective of supplier integration is to create mutually advantageous partnerships with essential suppliers through the synchronization and knowledge of supply chain processes. In this comprehensive approach, team members share information, collaborate on plans, and build goods together. Among the many benefits are the following: decreased supply cycle time, inventory levels, and disputes; expedited material delivery; and the ability to make last-minute adjustments to the production plan. When businesses have strong relationships with their suppliers, it may help them save money, make more money, create new products faster, and provide customers more value.

Improving overall business performance through streamlined information interchange and collaboration with important customers is the primary objective of customer integration. We will be keeping tabs on shifting customer preferences, sharing market knowledge, and developing goods and services with a focus on the market as part of our joint venture. Less inventory obsolescence, shorter lead times, and fewer operational expenditures are the end results of improved corporate performance, which is achieved through good customer integration. Increased revenue, satisfied customers, market share, and responsiveness to market shifts are all outcomes of customer integration.

In today's dynamic markets, SCI is crucial for organizations to stay ahead. Due to the collaborative nature of supplier and customer integration, companies have a higher chance of adapting to the always shifting business landscape. Strategic alignment is characterized by mutual understanding and productive engagement with important supply chain partners, which in turn promotes efficient supply chain operations and increased customer value. Therefore, SCI is a game-changer that helps firms become more lucrative, efficient, and competitive in the long term; it's more than just a logistical requirement.

Digitalization, which is a network of smart and data-driven technologies, is therefore essential for increasing SCI since it allows for better collaboration, data sharing in real-time, and communication amongst supply chain actors that is both efficient and effective. An open and connected flow of information is made feasible by digital supply chain systems, which allow for the integration of data from numerous sources. The foundation of SCI is this real-time data exchange, which allows partners to share and access critical information instantly and fosters a shared understanding of supply chain dynamics. emphasize that stakeholders have real-time visibility into supply chain operations, including item status, inventory levels, and production processes, because to digitalization. More integration occurs as a result of less downtime and shorter wait times brought about by supply chain partners' improved coordination made possible by this degree of openness. On top of that, digitalization facilitates enhanced collaboration. place an emphasis on digital solutions that let partners work together, share demand forecasts, and synchronize their efforts in a collaborative project setting. Integrating the supply chain is made easier in this team environment because it promotes honesty, trust, and a shared desire to succeed.

## Methods

Digitalization, supply chain integration, efficiency, and performance are all intricately related, and this article used a thorough data gathering approach to analyze them. In order to do this, a questionnaire-based technique was used, which provided a formal framework for statistically analyzing the variables and

lending credence to pertinent ideas. The purpose of this study was to increase the survey's external validity and generalizability by focusing on manufacturing enterprises in Turkey from a variety of industries. Due to budget constraints that may prevent investment in digital technology, the sample selection method did not include small businesses with less than 50 workers. Instead, it concentrated on medium- and large-sized organizations. We took great effort in selecting survey takers, giving special weight to their positions within the companies. The intended recipients were chief executive officers, senior executives, and those in charge of the supply chain or operations. In order for the poll to be relevant and genuine, it was necessary for respondents to have used some type of digital technology for supply chain transactions prior to taking part in it. A web-based poll was used to gather information for this investigation. Data was collected in a very short period of time because to the use of telephone and email reminders, which increased the response rate. In order to streamline the selection process, the survey was accompanied by a cover letter that stated the criteria for eligible responders. During the data review step, we removed respondents who did not fulfill the set criteria. The researchers in this study used a basic random sampling methodology, which gives every person in the population an equal chance of being chosen for the sample. Building a sampling frame, or inventory of all population units that may be included in the sample, was the first step. Many research have utilized this method. The researchers used the database of "TOBB (The Union of Chambers of Commerce, Industry, Maritime Trade and Commodity Exchanges, accessed on 15 September 2023)" to build the sampling frame. This database includes members of various commodity exchanges, coastal commerce, and local chambers of commerce, with a total of more than one million firms. One thousand companies were selected at random from this database after companies that did not meet the requirements of this study were removed. The total number of questionnaires returned was 306 after two waves of data collection and one reminder. Thirteen surveys were removed from further consideration after a thorough data cleaning procedure identified issues with duplicate submissions, incorrect respondents/firms, and missing numbers. Hence, 293 surveys were considered valid, resulting in a 29.3% effective response rate. In Table 1 you can see the summary sample characteristics, which include demographics and other relevant facts.

**Table 1. The research sample's demographics are as follows:.**

Measures	Item	Frequency	Percentage (%)
Gender	Male	162	55.3%
	Female	131	44.7%
Functional area	General management	85	29.0%
	Supply chain management	192	65.5%
	Operation management	16	5.5%
Respondent position	Executive/senior manager	166	56.7%
	Middle/first-level manager	105	35.8%
	Others	22	7.5%
Years of operation	Less than 5 years	17	5.8%
	5–10	70	23.9%

	11–30	86	29.4%
	31–50	54	18.4%
	More than 50	66	22.5%
Industry sector	Food, beverage and paper	88	30.0%
	Plastics, pharmaceutical, and Chemicals	42	14.3%
	Clothing and textile	32	10.9%
	Electrical equipment and machinery	56	19.1%
	Leather, wood, metal, and glass	48	16.4%
	Other manufacturing	27	9.2%
Number of employees	Less than 250	20	6.8%
	251–500	43	14.7%
	501–1000	95	32.4%
	1001–5000	89	30.4%
	More than 5000	46	15.7%
Total		293	100%

### Power Analysis Check

In this investigation, an apriori power analysis was carried out with the assistance of the G\*Power 3.1.9.7 software in order to determine whether or not the selected sample size was enough. In order to guarantee that this study had a sample size that was big enough to identify significant effects in the structural model, the power analysis was carried out. Under the assumption of a medium effect size of 0.15, the results of the power analysis suggested that a minimum sample size of 119 participants is necessary for the structural model in order to obtain a statistical power of 0.95 at a significance level of 0.05. For the purpose of capturing relevant associations within the context of the study, this impact size is judged to be suitable. That being the case, the sample size that was selected for this investigation consisted of 293 individuals, which was greater than the minimum needed size that was determined by the power analysis. This suggests that the sample size of this study is substantial, since it offers a comfortable margin of error over the minimum required for a statistically valid analysis. The choice to surpass the minimal sample size requirement improves the reliability and generalizability of the findings of this study. This decision also ensures that the sample sufficiently represents the population that is being investigated.

### Analysis and Results

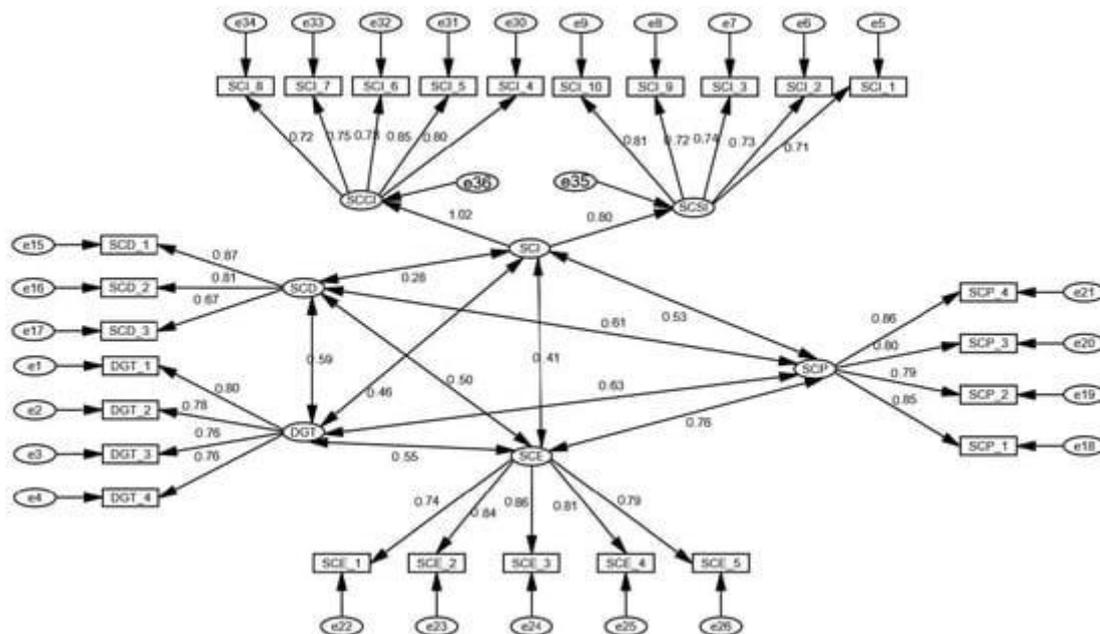
An method known as structural equation modeling (SEM) that is based on covariance was utilized in order to show the findings and analytical findings of this investigation. The method of analysis was carried out in two independent steps, the first of which was the estimate of a measurement model to evaluate the

dependability of the construct. In the following step, the hypothesized correlations were examined through the use of SEM-based techniques.

**Measurement Model Estimation**

Thoroughly analyzing the creation and validity of the measuring model was the first stage. The model's fitness was thoroughly assessed using Confirmatory Factor Analysis (CFA) in AMOS 24. Following standard procedure, the  $\chi^2/df$  ratio was checked for a value below 3, which would indicate a good fit of the model. A well-fitting model was defined as having a CFI, TLI, IFI, or NFI value more than 0.90, in accordance with the guidelines laid out by Hu and Bentler (1999). We also aimed for SRMR and RMSEA values  $< 0.08$ . The following statistics were found to suggest that the measurement model fitted the data well:  $\chi^2 = 705.754$ ,  $df = 284$ ,  $\chi^2/df = 2.485$ ,  $CFI = 0.925$ ,  $TLI = 0.913$ ,  $IFI = 0.916$ ,  $NFI = 0.907$ ,  $SRMR = 0.058$ , and  $RMSEA = 0.061$ .

Extensive investigation, as shown in Table 2, confirmed the measurement model's validity. All items were checked to make sure they loaded correctly into their relevant factors, and correlations between the study's components were allowed. All items showed substantial factor loadings ( $p < 0.001$ ), indicating convergent validity, above the required criterion of 0.5. Figure 2 from the statistical program Amos 24 shows the latent constructs' factor loading structure and correlation. A thorough synopsis of the connections between the latent components and the observable variables is given in the figure. A factor loading, denoted by an arrow in the figure, shows the direction and intensity of the association between a latent construct and an observable variable. Using double-headed arrows, we can see the relationships between latent constructs. By showing how well the measured variables match their predicted latent components, this visual assists in comprehending the performance of the measurement model. The correlations and factor loadings displayed in Figure 2 help evaluate the measurement model's construct validity and reliability, which in turn supports the structural equation model's robustness.



**Figure 2. Factor loadings and correlation in the CFA model: confirmatory factor analysis.**

**Table 2. Scale measurement, reliability, and validity are investigated..**

Construct/Indicators	Mean	Std	Factor Loadings	Cronbach's Alpha Values	CR	AVE
Digitalization (DGT)				0.855	0.857	0.599
DGT1	5.04	1.171	0.803			
DGT2	5.16	1.328	0.778			
DGT3	5.21	1.327	0.760			
DGT4	5.32	1.179	0.755			
Supply Chain Integration (SCI)				0.915	0.920	0.853
<i>Supplier Integration (SCIS)</i>				<i>0.860</i>	<i>0.843</i>	<i>0.520</i>
SCIS1	4.87	1.329	0.643			
SCIS2	4.60	1.506	0.638			
SCIS3	4.83	1.542	0.676			
SCIS4	4.77	1.313	0.774			
SCIS5	4.85	1.332	0.852			
<i>Customer Integration (SCIC)</i>				<i>0.886</i>	<i>0.890</i>	<i>0.619</i>
SCIC1	5.04	1.207	0.798			
SCIC2	5.05	1.394	0.851			
SCIC3	5.02	1.382	0.775			
SCIC4	5.29	1.298	0.763			
SCIC5	4.95	1.305	0.743			
Supply Chain Dynamism (SCD)				0.825	0.828	0.618
SCD1	5.29	1.285	0.866			
SCD2	5.30	1.288	0.810			
SCD3	5.19	1.285	0.669			
Supply Chain Performance (SCP)				0.893	0.894	0.679
SCP1	5.47	1.071	0.847			
SCP2	5.37	1.153	0.792			
SCP3	5.43	1.104	0.795			

SCP4	5.37	1.098	0.859			
Supply Chain Efficiency (SCE)				0.904	0.900	0.645
SCE1	5.26	1.214	0.703			
SCE2	5.39	1.260	0.818			
SCE3	5.53	1.283	0.863			
SCE4	5.80	1.209	0.821			
SCE5	5.43	1.219	0.802			

In addition, the average variance extracted (AVE) values for each variable were computed, and it was discovered that they above the threshold of 0.50, as indicated by [149]. This further strengthens the argument that convergent validity exists. Cronbach's alpha and composite reliability (CR) values were analyzed in order to determine the internal construct consistency and validity. The results of this analysis are presented in Table 2, which can be found here. Each of the constructions' Cronbach's alpha values was higher than the minimum requirement of 0.70, which is considered acceptable. Along the same lines, the CR values were higher than the suggested level of 0.60. In light of these findings, it was determined that the measuring items for each construct exhibited appropriate levels of internal consistency and reliability.

Analysis of the discriminant validity was carried out in accordance with the methodology. In Table 3, the square root of the average variance extracted (AVE) for each construct was compared with the correlations among all of the other constructs in the model. It was discovered through this study that the square root of each and every AVE was greater than any correlation that existed between pairings of latent components, which further strengthened the evidence of discriminant. The result is that the estimations provided by the measuring model were substantiated by the full evaluation of CFA.

**Table 3. Differentiate between the validity of the steps.**

Factors	1	2	3	4	5
1. Supply chain digitalization	0.774				
2. Supply chain integration	0.463 ***	0.710			
3. Supply chain dynamism	0.594 ***	0.275 ***	0.786		
4. Supply chain performance	0.627 ***	0.533 ***	0.611 ***	0.824	
5. Supply chain efficiency	0.555 ***	0.420 ***	0.498 ***	0.760 ***	0.803

## Discussion

The findings of this research shed light on the complex dynamics of digitization, supply chain integration, efficiency, and performance within the management of supply chains, which is a landscape that is always shifting. In the examination of the structural model, it is established without a reasonable doubt that

digitization has a large and favorable influence on the integration, efficiency, and performance of supply chain operations. These findings are consistent with those of previous research that highlights the revolutionary potential of digital technology in terms of improving a variety of areas of supply chain operations. Continuously demonstrating its capacity to stimulate cooperation, enable information exchange, and enhance coordination among supply chain participants, the integration of digital technologies, such as supply chain management systems, is a key component of efficient supply chain management. As a consequence of this, improved integration levels are achieved, which in turn increases the efficiency and performance of the supply chain.

As an additional point of interest, the mediation study highlights the essential role that supply chain integration and efficiency play in mediating the link between digitalization and supply chain performance. This observation lends credence to the idea that the influence of digitalization on performance is mediated by the development of integration and efficiency, which is in line with the concept of digitalization as an enabler. It provides the basis for a continuous flow of information, visibility in real time, and the streamlining of procedures, all of which eventually lead to an improvement in the performance of the supply chain. Within the current corpus of research on the mediating mechanisms of supply chain digitalization on supply chain performance, this study makes a contribution to the existing body of knowledge. While earlier research has investigated mediation through a variety of factors, including internal integration, supply chain resilience, supply chain traceability, and supply chain agility, our investigation delves more deeply into the roles that supply chain external integration (customer and supplier) and supply chain efficiency play in mediating the relationship between demand and supply chain efficiency. Businesses who are looking to fully embrace digitalization for enhanced supply chain efficiency will benefit greatly from this sophisticated knowledge, which gives significant insights.

It is interesting to note that the investigation of the moderating effect of supply chain dynamism that was carried out in this study showed complicated dynamics. In supply chain settings that are characterized by increased volatility and quick change, the effect of digitalization is magnified. This is indicated by the fact that supply chain dynamism has a positive moderating influence on the linkages between digitalization and supply chain integration. It can be deduced from this that digitalization not only has an immediate impact on the outcomes of supply chain operations, but it also interacts with the degree of dynamism that exists inside the supply chain environment, heightening the impact of digitalization. The aforementioned statement is in agreement with the notion that digital technologies have the potential to endow supply chains with agility and flexibility, hence enabling them to efficiently respond to changing market conditions. The findings of the research did not disclose a statistically significant moderating influence of supply chain dynamism on the link between digitalization and supply chain performance. This was contrary to our original predictions based on the findings of the investigation. The fact that this is the case shows that the effect of digitalization on supply chain performance is pretty consistent regardless of the degree of supply chain dynamism. The significance of this discovery resides in the fact that it suggests that the revolutionary potential of digitalization in improving supply chain performance may be somewhat independent of the degree of dynamism that exists within the supply chain environment. It seems to imply that digitization projects have the potential to produce performance benefits even in supply chain situations that are less dynamic or more stable. An unexpectedly considerable negative moderating influence was performed by supply chain dynamism, which was discovered via the investigation of the link between digitization and supply chain efficiency. This proved to be an intriguing discovery. A conclusion that can be drawn from this is that although digitalization has a favorable influence on supply chain efficiency, this benefit is diminished in supply chain settings that are significantly more dynamic. This might be linked to the difficulties that are brought about by greater dynamism, such as the requirement for quick response to

shifting market conditions and the increased level of uncertainty. Since this is the case, digitization has the potential to improve efficiency. There is a possibility that the complexity brought about by a supply chain setting that is very dynamic will make it less successful in accomplishing this goal.

### Conclusion:

It may be concluded that the digitization of supply chains is a paradigm shift that has the potential to greatly improve operational efficiency across a wide range of businesses. According to the findings of this study, the incorporation of cutting-edge technologies like the Internet of Things (IoT), artificial intelligence (AI), big data analytics, and blockchain makes it easier for stakeholders in the supply chain to increase their visibility, responsiveness, and ability to work together. In an environment that is becoming increasingly competitive, the findings reveal that firms that adopt digital technologies not only optimize their operations and save operating costs, but they also stimulate creativity and adaptation. Digitalization is becoming an increasingly important facilitator of operational excellence as businesses struggle to satisfy the requirements of contemporary consumers and successfully negotiate the intricacies of global supply chains. Enhanced inventory management, decreased lead times, and increased customer service are just some of the concrete benefits that have been experienced by firms that have effectively implemented digital strategies, as demonstrated by the case studies that were evaluated in this research. Nevertheless, it is of the utmost importance to acknowledge the difficulties that are associated with this change. Significant obstacles to effective digital transformation include the need for major expenditures, the demand for cultural adjustments inside businesses, and the requirement for workforce reskilling. These are just some of the issues that need to be addressed. In order for businesses to fully reap the benefits of digitalizing their supply chains, it will be essential for them to address the issues that these challenges provide. In the end, the implications of this research go beyond improvements in operational efficiency; they bring to light the fact that it is essential for businesses to take a proactive approach when it comes to their digital journeys. Decision-makers may design strong strategies to effectively traverse the digital world by harnessing the insights acquired from this study. This will ensure that their supply chains are not only efficient, but also resilient and prepared for the future. Digitalization of supply chains will continue to become increasingly important as the corporate environment continues to undergo continuous change. Organizations that make digital transformation a priority will be in a better position to respond to changes in the market, adapt to the expectations of consumers, and keep a competitive edge. In the future, research should continue to investigate the developing technologies and techniques that will have a significant impact on the future of supply chain management. This will provide more light on the road that leads to operational excellence in the digital age.

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