

DIGITAL SUPPLY CHAIN AGILITY: STRATEGIES TO IMPROVE MSME EFFICIENCY AND PERFORMANCE IN THE DIGITAL ERA

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Abstract. Digital transformation has become a strategic necessity for Micro, Small, and Medium Enterprises (MSMEs) to increase competitiveness in the digital economy era. This study aims to analyze the effect of digital supply chain adoption on efficiency, digital supply chain agility, and organizational performance of MSMEs. In addition, this study also examines the mediating role of digital supply chain efficiency and agility in this relationship. The study was conducted on MSMEs in Banyumas Regency that have adopted digital technology, using a quantitative method using the Structural Equation Modelling (SEM) approach assisted by AMOS software. The results show that digital supply chain adoption has a positive and significant effect on efficiency, digital supply chain agility, and organizational performance. Digital supply chain efficiency and agility are also proven to have a positive effect on organizational performance, while also acting as mediating variables that strengthen the relationship between digital supply chain adoption and organizational performance. These findings emphasize the importance of strengthening digital-based supply chain agility and efficiency to create resilient, adaptive, and competitive MSMEs in the era of digital transformation.

Keywords: Digital adoption, digital supply chain agility, supply chain efficiency, organizational performance, MSMEs.

1. Introduction

Micro, Small, and Medium Enterprises (MSMEs) play a crucial role in supporting the national economy. MSMEs not only contribute to increasing the national Gross Domestic Product (GDP) but also serve as the backbone of employment. According to data from the Ministry of Cooperatives and SMEs, the MSME sector can absorb up to 97% of the workforce and contribute more than 61% to Indonesia's GDP (1,2). This situation confirms that empowering and strengthening the competitiveness of MSMEs is one of the keys to national economic resilience, especially amidst the challenges of digital disruption and market globalization.

Despite this enormous potential, MSMEs still face various fundamental problems, one of which is supply chain inefficiency. This inefficiency is often caused by limited access to technology, weak information management, and a lack of integration between actors in the supply chain network (3). Yet, an efficient supply chain is a crucial foundation for improving organizational performance and competitiveness (4)

With the advancement of digital technology, new opportunities have emerged for MSMEs to improve their supply chain systems through digital supply chain digitization. Adopting digital technologies such as inventory management systems, cloud computing, and customer relationship management enables business processes to be more efficient, transparent, and responsive to market changes (5). With digital integration, MSMEs can monitor logistics in real time, optimize raw material procurement, and accelerate distribution to end consumers.

Implementing digitalization in the MSME supply chain is not easy. Challenges include low digital literacy, limited technological infrastructure in non-urban areas, and minimal support for digital technology adoption (6). These conditions often lead to a digital adoption gap, where technology adoption fails to significantly improve organizational performance(7).

To bridge this gap, this study develops a new concept called digital supply chain agility. This concept stems from Dynamic Capability theory (8), which emphasizes the importance of an organization's ability to adapt quickly to changes in the business environment through innovation and dynamic resource management. In the context of MSMEs, digital supply chain agility describes the ability of business actors to respond to market changes quickly, flexibly, and efficiently with the support of digital technology (9). Therefore, developing digital supply chain agility is expected to be an effective strategy for improving the operational efficiency and organizational performance of MSMEs in today's digital era. This research not only provides an empirical contribution to the supply chain management literature but also presents a practical approach that MSMEs can implement to survive and thrive amidst constantly changing economic dynamics.

2. Methods

2.1. Sampling and Data Collection

The data obtained in this study comes from two categories: primary and secondary sources. Primary sources were obtained from answers from micro, small, and medium enterprises (MSMEs) regarding closed-ended and open-ended questions about digital adoption in the supply chain system and factors causing inefficiencies in the supply chain. Meanwhile, secondary sources were obtained from literature and related statistical data, including the total number of MSMEs, the number of MSMEs that have adopted digital technology in their supply chains, and research on advances in digital technology in the supply chain. The data collection process was carried out by distributing questionnaires through an online form. The sampling technique used to select MSMEs was purposive sampling, aimed at creative MSME entrepreneurs who use digital technology in their supply chains and who are facing efficiency issues in the supply chain.

2.2. The Measurement Model

Partial least squares structural equation modeling (PLS-SEM) was performed using Stata 18.0 to analyze data. First, confirmatory factor analysis (CFA) was carried out to assess convergent validity and discriminant validity of the constructs. Items with low factor loadings were removed from subsequent analysis, and the remaining items for each construct are presented in Table 3. Model fit indices, including $\chi^2 = 1883.675$, $df = 136$, root mean square error of approximation (RMSEA) = 0.057, comparative fit index (CFI) = 0.947, and standardized root mean square residual (SRMR) = 0.045, indicate a good fit between the collected data and the proposed model (Hu & Bentler, 1999).

2.3. Convergen Validity

Following standard PLS-SEM procedures (10), our first step was to assess the measurement model through item robustness, construct robustness, and validity. As shown in Table 2, the standardized factor loadings for all measurement items exceeded the minimum threshold of 0.7, indicating good robustness. Cronbach's α values for all variables were above 0.7, composite reliability (CR) values were above 0.8, and average variance extracted (AVE) values were above 0.5, indicating sufficient reliability and construct validity(10)

Table 2: Construct and indicators

ELEMENT	Indicator	Cronbach's α	composite reliability (CR)	AVE	Factor Loading
Digital Supply Chain Adoption	DSCAD 1	0,800	0,812	0,559	0,622
	DSCAD 2				0,792
	DSCAD 3				0,727
	DSCAD 4				0,775
	DSCAD 5				0,806
Digital Supply Chain Efficiency	DSCE 1	0,900	0,901	0,714	0,832
	DSCE 2				0,810
	DSCE 3				0,872
	DSCE 4				0,884
	DSCE 5				0,825
Digital Supply Chain Agility	DSCAG 1	0,898	0,904	0,712	0,829
	ADSCG 2				0,833
	ADSCG 3				0,858
	ADSCG 4				0,847
	ADSCG 5				0,703
	ADSCG 6				0,676
Organizational Performance	OP 1	0,881	0,892	0,631	0,741
	OP 2				0,862
	OP 3				0,885
	OP 4				0,896
	OP 5				0,827

2.4. Discriminant Validity

Discriminant validity is crucial to ensure that the constructs being measured are truly distinct from one another, not merely correlated. In PLS-SEM analysis, this validity is assessed using several parameters: the Fornell-Larcker standard, cross-loadings, and the Heterotrait-Monotrait Ratio (HTMT). The Fornell-Larcker standard evaluates whether the square root of the AVE for each construct is greater than its correlation with other constructs in the model (11). This standard states that a construct must explain more variance in its indicators than the variance in other constructs. In general, the correlation between one construct and another should be lower than its AVE to meet this requirement. Cross-loadings assess the extent to which items designed to measure a construct contribute more to that construct than to other constructs. Lower cross-loadings indicate better discriminant validity, as items are more relevant to the intended construct than to unrelated constructs (11). The HTMT ratio measures the ratio of correlations between different constructs to correlations within the same construct, with a commonly used threshold of 0.85. This ratio indicates that correlations between different constructs should be significantly lower than correlations within the same construct to demonstrate discriminant validity (12). Furthermore, a multicollinearity value below 0.5 indicates that no collinearity

problem exists (13). The results in Table 3 indicate that the constructs have met the criteria for discriminant validity.

Table 3. Cross Loading

	DSCAD	DSCE	OP	DSCAG
DSCAD.1	0,622	0,459	0,504	0,396
DSCAD.2	0,792	0,583	0,522	0,520
DSCAD.3	0,727	0,470	0,435	0,435
DSCAD.4	0,775	0,503	0,522	0,471
DSCAD.5	0,806	0,595	0,622	0,608
DSCE.1	0,617	0,832	0,652	0,668
DSCE.2	0,572	0,810	0,670	0,756
DSCE.3	0,624	0,872	0,759	0,716
DSCE.4	0,530	0,884	0,714	0,768
DSCE.5	0,628	0,825	0,663	0,686
OP.1	0,574	0,562	0,741	0,590
OP.2	0,540	0,659	0,862	0,672
OP.3	0,605	0,764	0,885	0,704
OP.4	0,625	0,766	0,896	0,719
OP.5	0,620	0,687	0,827	0,670
DSCAG.1	0,615	0,708	0,631	0,829
DSCAG.2	0,580	0,690	0,659	0,833
DSCAG.3	0,585	0,738	0,707	0,858
DSCAG.4	0,553	0,748	0,650	0,847
DSCAG.5	0,369	0,608	0,534	0,703
DSCAG.6	0,386	0,540	0,602	0,676

2.5. Hypothesis Result

The next phase of the analysis involved testing the study hypotheses using the structural model. The results indicate that DSCAD has a significant and positive impact on DSCE, thereby supporting hypothesis H1. Similarly, DSCAD significantly and positively effect DSCAG supporting hypothesis H2. DSCAD also demonstrates a significant and positive influence on OP confirming hypothesis H3. DSCE is found to have a significant and positive effect on OP, supporting Hypothesis H4. DSCAG also found to have a significant and positive effect on OP, thus supporting hypothesis H5. The result show that DSCAD positively influence OP with the mediating effect of DSCE, supporting hypothesis H6. Likewise DSCAD positively impacts OP tih the mediating effect of DSCAG thereby supporting hypothesis H7. The direct and mediating effects of these relationship are summarized in Table.4

Tabel 4. Hypothesis Result

	<i>Original sample (O)</i>	<i>Sample mean (M)</i>	<i>Standard deviation (STDEV)</i>	<i>T statistics (O/STDEV)</i>	<i>P values</i>
DSCAD -> DSCE	0,704	0,710	0,046	15,349	0,000
DSCAD -> OP	0,211	0,219	0,080	2,649	0,004
DSCAD -> ADSC	0,659	0,668	0,050	13,134	0,000
DSCE -> OP	0,405	0,406	0,124	3,254	0,001
DSCE -> OP	0,313	0,305	0,123	2,554	0,005
DSCAD -> DSCE -> OP	0,285	0,288	0,090	3,180	0,001
DSCAD-> DSCAG-> OP	0,206	0,203	0,083	2,485	0,007

3. Results And Discussion

With digital supply chain agility and efficiency, this study aims to investigate how implementing a digital-based supply chain affects the performance of a company. Among the UMKM in Banyumas Regency, Indonesia, as a mediating element. Questionnaires distributed through online forms are used to gather data. The purposive sampling technique employed emphasizes creative UMKM entrepreneurs that use digital technology in their supply chain systems and UMKM yang finds challenges in the efficiency of his supply chain system.

The findings of this study offer insight into the use of digital in the supply chain system as well as the elements contributing to inefficiencies in that chain. First, analysis of the structural model clearly reveals a significant and beneficial impact of applying a digital supply chain on the efficiency of an existing digital supply chain. These results line up with prior studies(14,15). Rising significance of digitalisasi, defined as the use of digital technologies in supply chain processes (16,17), helps to enhance several aspek efisiensi rantai pasok, thus helping overall performance and competitiveness. Furthermore, the implementation of a digital supply chain enhances organizational performance. By reducing reliance on physical artifacts and prototypes, digital processes help to boost efficiency in product development and speed up the design process (18). Along with increased internal efficiency, digital transformation helps businesses grow by creating value for customers. By enabling more effective transactions and service delivery, which satisfies growing and personalized product demand (19), a system and process built on digital helps customer experience.

Second, the analysis of the structural model clearly demonstrates a major positive influence of digital supply chain adoption on the agility of the supply chain. The results fit past study (20). With improved virtualisation and simplified information flow, digital technologies have been shown to boost supply chain agility (21,22). along with partner businesses (21,23,24) claim that information technology can improve supply chain flexibility and agility by means of greater visibility of data between firms. Digitalization enables supported transformation of business driven by technology, therefore improving competitiveness, agility, and ambidextrousness (25–27).

Often entailing collaboration with outside partners including suppliers, distributors, and logistic providers, digitalizing the supply chain usually involves partnerships. Using digital platforms and technology, companies may more effectively share best practices, coordinate joint initiatives, and exchange information, therefore promoting supply chain agility (28). Consequently, the agility of the digital supply chain improves organizational performance (29). According to (22), kelincahan involves using information, technology, and management of supply chain, thereby enabling businesses to react. quickly toward unanticipated disruptions. Achieving supply chain agility calls for the synchronization of internal resources, therefore allowing businesses to successfully adjust to unexpected shifts in the supply chain environment (30). In this study, (30,31) define digital supply chain agility as one whole comprising resiliency and agility.

Thirdly, it was discovered that digital supply chain agility greatly moderates the link between organizational performance and adoptions of the digital supply chain. These results match earlier studies by (32). According to dynamic capability theory, organizations must develop agility and get valuable digital assets in reaction to technological advancements and convert these resources. Fast passing (33)

Moreover, a great degree of digital supply chain efficiency was discovered to mediate the relationship between adopsi digital supply chain and organizational performance, therefore corroborating earlier results (15). These results point to the impact of digital transformation on organizational performance conveyed via enhancements in efficiency, therefore validating the hypothesis that digitalization acts as a driving force (34).

4. Conclusion

According to this study, small, medium, and micro businesses (MSMEs) benefit in terms of efficiency, agility, and overall performance from the adoption of digital supply chains. The results show that both agility and efficiency are major mediators of these impacts, therefore showing that digital transformation not only straightens performance but also It also increases operating efficiency and market change adaptation capacity. While greater agility boosts flexibility and responsiveness both critical for competitive success in the modern digital scene increased supply chain efficiency results in decreased waste and cheaper expenses. Practically speaking, this points to a need for improving infrastructure, boosting digital skills, and offering implementation support to fully realize the benefits. The introduction of digital supply chain agility and efficiency as mediating variables provides a deeper understanding and so constitutes the theoretical contribution of this research. of contradictory findings in past research and lays the groundwork for next studies on external influences including policy, ecosystem support, and new technologies.

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