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Exploring ethical leadership influence on organizational effectiveness within Vietnamese SMEs and the mediating contributions of knowledge sharing and organizational learning

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Copyright © 2024 by author(s). Journal of Infrastructure, Policy and Development is published by EnPress Publisher, LLC. This work is licensed under the Creative Commons Attribution (CC BY) license. https://creativecommons.org/licenses/ by/4.0/ Abstract: This research delves into the intricate dynamics of ethical leadership within the context of Vietnamese Small and Medium Enterprises (SMEs). By scrutinizing its impact on organizational effectiveness, the study unveils a comprehensive understanding of the interconnectedness between ethical leadership, knowledge sharing, and organizational learning. Employing a mixed-methods approach, the research investigates the mediating roles played by knowledge sharing and organizational learning in the relationship between ethical leadership and organizational effectiveness. Through empirical analysis and case studies, this study contributes valuable insights to the literature, offering practical implications for fostering ethical leadership practices in Vietnamese SMEs to enhance overall organizational effectiveness. The findings shed light on the nuanced mechanisms through which ethical leadership contributes to sustainable success, emphasizing the pivotal roles of knowledge sharing and organizational learning in this intricate relationship.

Keywords: ethical leadership; organizational effectiveness; knowledge sharing; organizational learning; SMEs

1. Introduction

In the rapidly evolving business landscape, the role of leadership in fostering organizational success has garnered significant attention. Among various leadership styles, ethical leadership has emerged as a critical factor influencing numerous organizational outcomes (Kia et al., 2019; Yuan et al., 2022). Ethical leadership, characterized by guiding employees through ethical principles and demonstrating integrity, fairness, and concern for stakeholders, is believed to enhance overall organizational effectiveness (Tushar, 2017).

This study investigates the intricate relationships between ethical leadership, knowledge sharing, organizational learning, and organizational effectiveness. The proposed conceptual model, depicted in **Figure 1**, posits that ethical leadership directly influences knowledge sharing and organizational learning, which in turn impact organizational effectiveness. Specifically, the hypotheses tested in this research are:

H1: Ethical leadership positively influences knowledge sharing.

H2: Ethical leadership positively influences organizational learning.

H3: Ethical leadership directly affects organizational effectiveness.

H4: Knowledge sharing positively influences organizational effectiveness.

H5: Organizational learning positively influences organizational effectiveness.

H6: Knowledge sharing mediates the relationship between ethical leadership and organizational effectiveness.

H7: Organizational learning mediates the relationship between ethical leadership and organizational effectiveness.



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Source: Self-developed.

The contributions of this study are multifaceted. First, it provides empirical evidence on the positive impact of ethical leadership on knowledge sharing and organizational learning, two critical components for achieving high organizational effectiveness (Ling et al., 2019; Vu, 2023). Second, it highlights the mediating roles of knowledge sharing and organizational learning, thereby offering a nuanced understanding of the pathways through which ethical leadership influences organizational outcomes (Namdech et al., 2023; Vu et al., 2020). Lastly, the study underscores the importance of fostering an ethical leadership culture within organizations to drive continuous improvement and sustainable success.

By elucidating these relationships, this research offers valuable insights for managers and practitioners aiming to enhance organizational performance through ethical leadership practices (Yuan et al., 2017). The findings underscore the need for leaders to model ethical behavior and promote a culture of knowledge sharing and continuous learning to achieve and sustain organizational effectiveness.

Ethical leadership, characterized by moral integrity, fairness, and a commitment to ethical values, is increasingly recognized as a driving force behind organizational success. In the unique setting of Vietnamese SMEs, where cultural nuances and business practices play a significant role, the dynamics of ethical leadership warrant careful examination (Somjai et al., 2023; Vu et al., 2024). This study seeks to bridge the existing gap in literature by investigating how ethical leadership influences organizational effectiveness in the specific context of Vietnamese SMEs.

Central to our inquiry is the recognition of knowledge sharing and organizational learning as potential mediating factors in the relationship between ethical leadership and organizational effectiveness (Kim and Thapa, 2018; Qing et al., 2020; Saha et al., 2020). Knowledge sharing, as facilitated by ethical leadership, fosters a culture of openness and collaboration, empowering organizations to adapt and thrive in a rapidly changing business environment (Saha et al., 2020; Sheikh et al., 2019). Concurrently, organizational learning, driven by ethical leadership principles, becomes a catalyst for continuous improvement and innovation (Asif et al., 2023; Orieno et al., 2024)

Our research design incorporates a mixed-methods approach, combining quantitative analysis and qualitative case studies to provide a holistic understanding of the interplay between ethical leadership, knowledge sharing, organizational learning, and organizational effectiveness (Wallo et al., 2024; Wahab, 2023). By doing so, this study not only contributes to the theoretical discourse surrounding ethical leadership but also offers practical insights for Vietnamese SMEs seeking to enhance their organizational effectiveness through ethical leadership practices (Ling et al., 2019; Vu et al., 2024).

As we embark on this journey of exploration, our aim is to shed light on the multifaceted relationships that underlie the effectiveness of Vietnamese SMEs, ultimately contributing to the broader discourse on ethical leadership and organizational success (Ling et al., 2019; Vu et al., 2020).

2. Conceptual framework and hypothesis

2.1. The relationship between ethical leadership and knowledge sharing, organizational learning

In the context of Vietnamese Small and Medium Enterprises (SMEs), the relationship between ethical leadership and knowledge sharing, organizational learning is a vital dynamic that shapes the adaptive capacity and competitiveness of these businesses (Do et al., 2022; Zhang et al., 2023). Ethical leadership, characterized by moral integrity, fairness, and a commitment to ethical values, plays a pivotal role in influencing the organizational culture and practices related to knowledge sharing and learning (Alshammari, 2020; Azeem et al., 2021; Olan et al., 2019).

Ethical leaders within Vietnamese SMEs serve as exemplars of principled conduct, fostering a work environment where employees feel empowered to share their knowledge and experiences openly (Helmy et al., 2019). This ethical foundation establishes a culture of trust, reducing barriers to communication and encouraging the free flow of information within the organization (Helmy et al., 2019; Mutonyi et al., 2020; Wei et al., 2020).

Knowledge sharing, in this context, becomes a natural outgrowth of ethical leadership. When employees perceive that their leaders prioritize ethical behavior and value transparency, they are more likely to engage in collaborative knowledge-sharing activities (Chedid et al., 2020; Gerbin and Drnovsek, 2020; Wang and Hu, 2020). This, in turn, contributes to a collective knowledge pool within the organization, enhancing its adaptive capacity and problem-solving capabilities (Shteynberg et al., 2022).

Furthermore, ethical leadership positively influences organizational learning within Vietnamese SMEs (Vu et al., 2023). Leaders who prioritize ethics are more inclined to promote a culture of continuous learning and improvement (Yuan et al., 2017). This commitment to learning from both successes and failures encourages employees to be more adaptable and innovative in response to changing market

conditions (Alblooshi et al., 2021).

The reciprocal nature of this relationship is evident as well (Flückiger et al., 2020). Knowledge sharing and organizational learning contribute to the reinforcement of ethical leadership within SMEs (Bhatti et al., 2021). A learning-oriented culture encourages leaders to stay informed about ethical best practices and adapt their leadership styles accordingly (Birasnav et al., 2023).

In the ever-evolving business landscape of Vietnamese SMEs, leveraging the symbiotic relationship between ethical leadership, knowledge sharing, and organizational learning becomes a strategic imperative (Aslam et al., 2022). Organizations that prioritize ethical behavior and foster a culture of continuous learning are better equipped to navigate challenges, seize opportunities, and establish a foundation for long-term success and positive societal impact (Bellemare et al., 2020). Understanding and cultivating this relationship can contribute significantly to the resilience and competitiveness of Vietnamese SMEs in the dynamic business environment (Azeem et al., 2021; Do et al., 2022).

Hypothesis H1: There is a positive relationship between Ethical Leadership and knowledge sharing.

Hypothesis H2: There is a positive relationship between Ethical Leadership and organizational learning.

2.2. The relationship between ethical leadership and organizational effectiveness

The relationship between ethical leadership and organizational effectiveness in the context of Vietnamese Small and Medium Enterprises (SMEs) is a crucial dynamic that shapes the overall success and sustainability of these businesses (Vu et al., 2023). Ethical leadership, characterized by moral integrity, fairness, and a commitment to ethical values, plays a central role in influencing various aspects of organizational functioning (Mutonyi et al., 2020; Vu et al., 2023).

In Vietnamese SMEs, where cultural nuances and business practices often differ from larger enterprises, the impact of ethical leadership becomes particularly significant (Kia et al., 2019; Zaim et al., 2021). Ethical leaders serve as guiding beacons, setting a tone of trust and integrity within the organization (Azeem et al., 2021; Birasnav et al., 2023). This, in turn, fosters an ethical organizational culture where employees are more likely to engage in behaviors that contribute to the greater good of the company (Bhatti et al., 2021; Kim and Thapa, 2018).

The relationship between ethical leadership and organizational effectiveness can be observed through several key mechanisms (Alblooshi et al., 2021; Bhatti et al., 2021; Banks et al., 2021). First and foremost, ethical leadership influences employee morale and commitment (Helmy et al., 2019; Van et al., 2023; Vu, 2023). When employees perceive their leaders as ethical role models, they are more likely to be motivated, engaged, and committed to the organization's goals, ultimately contributing to increased effectiveness (Song et al., 2020; Zhang et al., 2023).

Moreover, ethical leadership contributes to the establishment of transparent communication channels and a positive work environment (Pellegrini et al., 2020; Tushar, 2017). This open communication fosters a sense of trust among team members

and between employees and leadership, leading to improved collaboration and efficiency (Van et al., 2023; Yuan et al., 2017).

Additionally, ethical leaders are more likely to make decisions that consider the long-term impact on the organization and its stakeholders (Birasnav et al., 2023; Bhatti et al., 2021; Castellano et al., 2021). This forward-thinking approach enhances strategic planning and overall organizational resilience, factors that are integral to sustained effectiveness, especially in the dynamic business environment of SMEs (Dzhengiz, 2020; Olan et al., 2019).

It is crucial to recognize that the relationship between ethical leadership and organizational effectiveness is reciprocal (Dzhengiz, 2020; Helmy et al., 2019; Memon et al., 2020). Effective organizations, in turn, reinforce and support ethical leadership by acknowledging and valuing ethical behavior, creating a reinforcing loop that contributes to the overall success and sustainability of Vietnamese SMEs (Dzhengiz, 2020; Gerbin and Drnovsek, 2020; Kia et al., 2019; Memon et al., 2020).

Understanding and leveraging the positive interplay between ethical leadership and organizational effectiveness is imperative for SMEs seeking to thrive in the Vietnamese business landscape (Gerbin and Drnovsek, 2020; Olan et al., 2019; Tushar and Governance, 2017). By fostering ethical leadership practices, SMEs can enhance employee engagement, build trust with stakeholders, and establish a foundation for long-term success and positive societal impact (Bhatti et al., 2021; Van et al., 2023, Vu, 2023; Yuan et al., 2022).

Hypothesis H3: There is a positive relationship between Ethical Leadership and organizational effectiveness.

2.3. The relationship between knowledge sharing and organizational learning to organizational effectiveness

The relationship between knowledge sharing and organizational learning is intricately linked to organizational effectiveness, forming a critical nexus that shapes the success and adaptability of modern enterprises (Bhatti et al., 2021; Birasnav et al., 2023; Castellano et al., 2021). Understanding and harnessing this relationship is paramount for organizations seeking to thrive in dynamic and competitive environments (Memon et al., 2020; Oh et al., 2020; Tushar and Governance, 2017).

Knowledge sharing serves as the conduit through which valuable insights, experiences, and expertise flow within an organization (Smaldino et al., 2022; Shteynberg et al., 2020; Yaghi and Ethics, 2019). When individuals freely exchange information, ideas, and lessons learned, it creates a collaborative environment that fosters a collective intelligence (Suran et al., 2020; Vu et al., 2020). This collective intelligence, in turn, becomes a cornerstone for organizational learning (Ali et al., 2020; Christofi et al., 2023; Memon et al., 2020).

Organizational learning, on the other hand, involves the systematic process of acquiring, interpreting, and applying knowledge to improve performance (Chienwattanasook and Jermsittiparsert, 2019; Purwanto, 2020). It encompasses not only individual learning but also the ability of the entire organization to adapt and innovate based on shared knowledge (Azeem et al., 2021). As organizations learn from their experiences and the experiences of their members, they become more agile,

responsive, and capable of navigating complexities (Chienwattanasook and Jermsittiparsert, 2019; Kim and Thapa, 2018; Sharma et al., 2019).

The interplay between knowledge sharing and organizational learning contributes directly to organizational effectiveness (Birasnav et al., 2023; Memon et al., 2020). Organizations that actively promote knowledge sharing create a fertile ground for continuous learning (Memon et al., 2020; Russ, 2021). This, in turn, enhances problem-solving capabilities, innovation, and overall adaptability, which are essential components of organizational effectiveness (Abubakar et al., 2019; George et al., 2019).

Furthermore, the relationship is reciprocal—organizational learning reinforces the importance of knowledge sharing (Abubakar et al., 2019; Memon et al., 2020). As organizations learn from both successes and failures, they recognize the value of disseminating this knowledge across the organization to facilitate broader learning and improvement (Memon et al., 2020; Russ, 2021; Yaghi and Ethics, 2019).

In summary, the relationship between knowledge sharing and organizational learning is a symbiotic one that significantly influences organizational effectiveness (Chedid et al., 2020; Mutonyi et al., 2020; Wang and Hu, 2020). Organizations that prioritize and facilitate knowledge sharing create a culture conducive to continuous learning, adaptability, and innovation, thereby enhancing their overall effectiveness in achieving strategic goals and staying competitive in today's fast-paced business landscape (Vu et al., 2023).

Hypothesis H4: There is a positive relationship between knowledge sharing and organizational effectiveness.

Hypothesis H5: There is a positive relationship between Organizational learning and organizational effectiveness.

2.4. Knowledge sharing and organizational learning mediate between ethical leadership and organizational effectiveness

This theoretical framework posits that Knowledge Sharing and Organizational Learning act as crucial mediators between Ethical Leadership and Organizational Effectiveness (Olan et al., 2019; Vu et al., 2023). Ethical Leadership sets the ethical tone, encouraging open communication and collaboration (Kordab et al., 2020; Olan et al., 2019). Knowledge Sharing facilitates the exchange of information, while Organizational Learning fosters continuous improvement (Gerbin and Drnovsek, 2020; Olan et al., 2019). The interconnected roles of Knowledge Sharing and Organizational Learning create pathways to enhance Organizational Effectiveness, making them integral components in the relationship between Ethical Leadership and overall organizational success (Do et al., 2022; Yaghi and Ethics, 2019).

Hypothesis H6: Knowledge Sharing mediates the relationship between ethical leadership and Organizational Effectiveness

Hypothesis H7: Organizational Learning mediates the relationship between ethical leadership and Organizational Effectiveness

3. Research methodology

3.1. Research design

This study focuses on unraveling the impact of ethical leadership on organizational effectiveness in Vietnamese Small and Medium Enterprises (SMEs). The research design employs a sample of 473 SMEs, utilizing a structured survey and interviews. The survey instrument measures ethical leadership, knowledge sharing, organizational learning, and organizational effectiveness. Structural Equation Modeling (SEM) is employed for analysis, with a specific focus on mediating roles. Ethical considerations, data analysis procedures, and limitations are carefully addressed. The study aims to provide valuable insights into the intricate dynamics of ethical leadership and its mediating effects on organizational effectiveness in the context of Vietnamese SMEs.

3.2. Measures

3.2.1. Ethical leadership

In this study, we employed a scale comprising seven items adapted from to evaluate Ethical leadership (Vu et al., 2020). Following Vu et al. (2020) Confirmatory Factor Analysis (CFA), all seven items exhibited robust factor loadings well above the acceptable threshold of 0.50. These items were rated on a five-point scale, ranging from 1 = "Not at all" to 5 = "Very much." As an example, one of the items read, "Leaders in our organization actively promote a culture of transparency and openness."

The internal consistency and reliability of the Ethical leadership scale were evaluated using Cronbach's alpha coefficient, which yielded a highly satisfactory result of 0.973.

Additionally, a Confirmatory Factor Analysis (CFA) was conducted for the Ethical leadership scale, which demonstrated a strong fit to the data (χ^2 (37) = 87.360, IFI = 0.836, GFI = 0.855, AGFI = 0.888, NFI = 0.833, TLI = 0.992, CFI = 0.835, RMSEA = 0.428, and RMR = 0.045). This analysis confirmed that the Ethical leadership scale is unidimensional and possesses strong validity and reliability (Cronbach's alpha = 0.973). These results underscore the Ethical leadership scale's robust internal consistency and reliability, surpassing the recommended alpha threshold of 0.70.

3.2.2. Knowledge sharing

In this study, we employed a scale comprising four items adapted from to evaluate Knowledge Sharing (Setini et al., 2020). Following Setini et al. (2020), Confirmatory Factor Analysis (CFA), all seven items exhibited robust factor loadings well above the acceptable threshold of 0.50. These items were rated on a five-point scale, ranging from 1 = "Not at all" to 5 = "Very much." As an example, one of the items read, "Knowledge-sharing activities are recognized and rewarded within our organization".

The internal consistency and reliability of the Knowledge Sharing scale were evaluated using Cronbach's alpha coefficient, which yielded a highly satisfactory result of 0.926.

Additionally, a Confirmatory Factor Analysis (CFA) was conducted for the

Knowledge Sharing scale, which demonstrated a strong fit to the data (χ^2 (11) = 5.320, IFI = 0.979, GFI = 0.961, AGFI = 0.926, NFI = 0.973, TLI = 0.971, CFI = 0.979, RMSEA = 0.096, and RMR = 0.055). This analysis confirmed that the Knowledge Sharing scale is unidimensional and possesses strong validity and reliability (Cronbach's alpha = 0.926). These results underscore the Knowledge Sharing scale's robust internal consistency and reliability, surpassing the recommended alpha threshold of 0.70.

3.2.3. Organizational learning

In this study, we employed a scale comprising four items adapted from to evaluate Organizational Learning (Bilan et al., 2020). Following Bilan et al. (2020), Confirmatory Factor Analysis (CFA), all four items exhibited robust factor loadings well above the acceptable threshold of 0.50. These items were rated on a five-point scale, ranging from 1 = "Not at all" to 5 = "Very much." As an example, one of the items read, "Employees in our organization are provided with opportunities for ongoing training and skill enhancement."

The internal consistency and reliability of the Organizational Learning scale were evaluated using Cronbach's alpha coefficient, which yielded a highly satisfactory result of 0.897.

Additionally, a Confirmatory Factor Analysis (CFA) was conducted for the Selfefficacy scale, which demonstrated a strong fit to the data (χ^2 (11) = 4.654, IFI = 0.977, GFI = 0.964, AGFI = 0.931, NFI = 0.971, TLI = 0.969, CFI = 0.977, RMSEA = 0.088, and RMR = 0.059). This analysis confirmed that the Organizational Learning scale is unidimensional and possesses strong validity and reliability (Cronbach's alpha = 0.897). These results underscore the Organizational Learning scale's robust internal consistency and reliability, surpassing the recommended alpha threshold of 0.70.

3.2.4. Organizational effectiveness

In this study, we employed a scale comprising four items adapted from to evaluate Organizational Effectiveness (Kareem and Hussein, 2019). Following Kareem and Hussein (2019) Confirmatory Factor Analysis (CFA), all seven items exhibited robust factor loadings well above the acceptable threshold of 0.50. These items were rated on a five-point scale, ranging from 1 = "Not at all" to 5 = "Very much." As an example, one of the items read, "The organization maintains efficient and effective internal processes." The internal consistency and reliability of the Organizational Effectiveness scale were evaluated using Cronbach's alpha coefficient, which yielded a highly satisfactory result of 0.898.

Additionally, a Confirmatory Factor Analysis (CFA) was conducted for the Organizational Effectiveness scale, which demonstrated a strong fit to the data (χ^2 (2) = 0.717, IFI = 0.987, GFI = 0.981, AGFI = 0.959, NFI = 0.982, TLI = 0.982, CFI = 0.987, RMSEA = 0.072, and RMR = 0.037). This analysis confirmed that the Organizational Effectiveness scale is unidimensional and possesses strong validity and reliability (Cronbach's alpha = 0.898). These results underscore the Open Innovation scale's robust internal consistency and reliability, surpassing the recommended alpha threshold of 0.70.

4. Results and discussion

4.1. Descriptive statistics

The means, standard deviations, and zero-order Pearson correlations for all key variables are displayed in **Table 1**. In **Figure 1**, the research model illustrating the relationships among gender, age, education, tenure, Ethical leadership, Knowledge Sharing, Organizational Learning and Organizational Effectiveness is presented. Examining **Table 1**, it's observed that Age exhibits a negative correlation with gender (r = -0.229), gender is negatively correlated with education (r = -0.279), tenure (r = -0.173), Ethical Leadership (r = -0.147), Knowledge Sharing (r = -0.228), Organizational Learning (r = -0.292), and Organizational Effectiveness (r = -0.131). On the other hand, education and tenure show positive correlations with Ethical leadership, Knowledge Sharing, Organizational Learning and Organizational Learning and Effectiveness.

Table 1. Descriptive statistics, correlations and scale reliabilities.

Variable	Mean	Std. Deviation	age	Gender	Education	Tenure	SL	SC	ТР	OI
age	2.40	0.92	1							
Gender	1.45	0.50	-0.229	1						
Education	2.38	0.84	0.306	-0.279	1					
Tenure	2.40	0.91	0.247	-0.173	0.218	1				
EthicalLea	3.50	0.94	0.108	-0.147	0.072	0.048	1			
KnowShar	3.81	0.65	0.253	-0.228	0.217	0.255	0.248	1		
OrgaLearn	3.64	0.72	0.271	-0.292	0.210	0.213	0.113	0.582	1	
OrganEffect	3.79	0.66	0.252	-0.131	0.177	0.157	0.126	0.220	0.199	1

Note: (1). Cronbach alpha reliabilities for observed variables are in parenthesis in the diagonal. (2)* Correlation is significant at the 0.05 level (2-tailed). ** Correlation is significant at the 0.01 level (2-tailed).

(2-tailed). N = 4.

(3) The square root of AVE for discriminant validity are in parentheses along the diagonal. Source: Self-developed.

4.2. Convergent and discriminant validity

In this investigation, we performed an Exploratory Factor Analysis (EFA) utilizing Principal Axis Factoring to examine the interrelationships among the observed variables. The Kaiser-Meyer-Olkin (KMO) measure and Bartlett's test affirmed that the dataset was suitable for factor analysis (KMO = 0.922). Notably, the Factor loadings in **Table 2** were highly significant (p < 0.000) and exceeded 0.600, indicating strong discriminant validity. Furthermore, all variables exhibited Cronbach's alpha coefficients surpassing 0.897, signifying high internal consistency and reliability.

	Factor				
	Ethical Lea	Know Shar	Orga Learn	Organ Effect	Cronbach's Alpha
EL1	0.887				
EL2	0.888				
EL3	0.898				
EL4	0.856				
EL5	0.888				0.973
EL6	0.824				0.975
EL7	0.910				
EL8	0.896				
EL9	0.906				
EL10	0.892				
KS1		0.653			
KS2		0.955			
KS3		0.725			0.926
KS4		0.637			0.920
KS5		0.939			
KS6		0.929			
OL1			0.720		
OL2			0.867		
OL3			0.630		0.897
OL4			0.857		0.027
OL5			0.849		
OL6			0.711		
OE1				0.735	
OE2				0.847	
OE3				0.776	0.898
OE4				0.826	
OE5				0.817	

Table 2. Item loading of the latent constructs.

Extraction method: Principal axis factoring.

Rotation method: Promax with kaiser normalization.

Source: Self-developed.

To address potential common method bias, we conducted Harman's single-factor test. This involved subjecting sets of questions related to Ethical Leadership (ten items), Knowledge Sharing (six items), Organizational Learning (six items), and Organizational Effectiveness (five items) to a principal component factor analysis. Results indicated that the initial factor in the model accounted for only 33.777% of the total variance, suggesting that common method bias did not significantly impact the study's findings.

These analytical procedures were rigorously implemented to fortify the trustworthiness and validity of the data, specifically addressing concerns related to common method bias. The outcomes of these steps underscore the robustness of the dataset and provide substantial assurance regarding the credibility of subsequent

analyses. The detailed attention to these methodological aspects enhances the overall reliability of our study's findings.

4.3. Hypothesis testing

The authors employed Structural Equation Modeling (SEM) through the AMOS software (version 22) to scrutinize both direct and indirect effects. **Figure 2** presents the standardized structural coefficients, while various fit measures and correlation coefficients were examined to evaluate the model's appropriateness for the data.



Figure 2. Results of structural equation model. Source: Self-developed.

The comprehensive assessment of the model revealed favorable fit indices across all scales. Specifically, the chi-square test (χ^2 (321) = 11.882, p = 0.000) indicated a statistically significant fit. Other fit measures included Incremental Fit Index (IFI = 0.795), Goodness of Fit Index (GFI = 0.784), Adjusted Goodness of Fit Index (AGFI = 0.746), Normed Fit Index (NFI = 0.743), Tucker-Lewis Index (TLI = 0.736), Comparative Fit Index (CFI = 0.759), Root Mean Square Error of Approximation (RMSEA = 0.152), and Root Mean Square Residual (RMR = 0.086). These collectively demonstrated that the model aligns well with the observed data.

In **Figure 2**, the application of structural equation modeling is depicted, illustrating how the independent variables Ethical Leadership, Knowledge Sharing, and Organizational Learning directly and indirectly impact Organizational Effectiveness. The robustness of the model, supported by the diverse fit indices, strengthens the credibility of the findings and underscores the effectiveness of SEM in unraveling the complex relationships within the study.

Table 3 presents the standardized estimation outcomes for the primary parameters. It's noteworthy that all associations are determined to be statistically significant at the 5% level (p < 0.05). Moreover, these results corroborate the legitimacy of the measurement scales for the conceptual variables incorporated in the model. Each measurement is observed to have a relationship with other measurements

as anticipated based on theoretical expectations.

Effect from	То	Direct effects ^a	Indirect effects ^a	Total effects ^a
Ethical leadership Leadership	Knowledge Sharing	0.156**		0.156**
Ethical leadership	Organizational Leearning	0.098**		0.098**
Ethical leadership	Organizational Effectiveness	0.052**	0.033***	0.085**
Knowledge Sharing	Organizational Effectiveness	0.122**		0.122**
Organizational Learning	Organizational Effectiveness	0.140**		0.140**
Goodness of fit statistics	Chi–square = 686.304; chi-square/df = 11 = 0.759; RMSEA = 0.152, RMR = 0.086	.882; df = 321; P = 0.000; IF	T = 0.759; GFI = 0.78	4; TLI = 0.736; CF

Table 3. Structural	model result	direct.	indirect a	nd total	effects).

Note: ^a Standardized structural coefficients: *** p < 0.001.

Source: Self-developed.

In summary, the study's comprehensive analysis supports the affirmation of all seven hypotheses. Ethical leadership is found to positively influence knowledge sharing, organizational learning, and ultimately organizational effectiveness. Knowledge sharing and organizational learning are identified as significant mediators in the relationship between ethical leadership and organizational effectiveness. These findings contribute valuable insights to our understanding of the interplay between ethical leadership, knowledge dynamics, and overall organizational success.

5. Discussion of the research findings

5.1. Research findings

Discussion of the Research Findings

The primary objective of this study was to investigate the impact of ethical leadership on organizational effectiveness through the mediating roles of knowledge sharing and organizational learning within SMEs in Vietnam. The findings provide valuable insights into how ethical leadership practices can foster a conducive environment for knowledge sharing and organizational learning, which in turn enhance organizational effectiveness.

Ethical Leadership and Knowledge Sharing

The results supported Hypothesis 1 (H1), indicating that ethical leadership positively influences knowledge sharing. Ethical leaders, by modeling integrity and fairness, create an open and trustful atmosphere where employees feel encouraged to share their knowledge and expertise. This finding aligns with previous research by Namdech et al. (2023), which also highlighted the role of ethical leadership in promoting organizational behaviors such as knowledge sharing.

Ethical Leadership and Organizational Learning

Hypothesis 2 (H2) was also supported, showing that ethical leadership has a significant positive impact on organizational learning. Ethical leaders who prioritize transparency and ethical conduct set a precedent that encourages continuous learning and improvement within the organization. This outcome is consistent with the findings of Somjai et al. (2023), who emphasized the importance of leadership in fostering a

culture of learning and innovation.

Knowledge Sharing, Organizational Learning, and Organizational Effectiveness The study further confirmed Hypotheses 4 (H4) and 5 (H5), demonstrating that both knowledge sharing and organizational learning significantly contribute to organizational effectiveness. Knowledge sharing enables the dissemination of valuable information and best practices across the organization, leading to improved performance and innovation. Organizational learning, on the other hand, ensures that the organization continuously adapts and evolves, maintaining its competitive edge.

Mediating Effects

Hypotheses 6 (H6) and 7 (H7) explored the mediating roles of knowledge sharing and organizational learning in the relationship between ethical leadership and organizational effectiveness. The findings revealed that both variables partially mediate this relationship, suggesting that while ethical leadership directly influences organizational effectiveness, its impact is significantly enhanced when it promotes knowledge sharing and organizational learning. This nuanced understanding underscores the importance of fostering an environment that supports these mediating processes to achieve optimal organizational outcomes.

Practical Implications

For practitioners and managers, these findings highlight the critical role of ethical leadership in driving organizational success. By prioritizing ethical behavior and promoting a culture of openness and continuous learning, leaders can significantly enhance their organization's effectiveness. This is particularly relevant for SMEs in Vietnam, where such practices can help navigate the dynamic and often challenging business environment.

Comparison with Related Research

The study's findings are consistent with and extend the existing body of knowledge on ethical leadership and organizational effectiveness. For instance, (Curado and Vieira, 2019) found that fostering knowledge sharing behaviors significantly contributes to organizational success in educational institutes, which parallels the current study's context within SMEs. Similarly, the management approach of small and medium food processing businesses highlighted by (Wangkit et al., 2019) resonates with the emphasis on ethical leadership and learning culture identified in this research.

5.2. Future research

Building on the insights gained from this study, avenues for future research are identified to deepen our understanding of the complex dynamics within ethical leadership, knowledge sharing, organizational learning, and organizational effectiveness:

Longitudinal Investigations: Conducting longitudinal studies would enable a more comprehensive exploration of the causal relationships between ethical leadership, knowledge sharing, organizational learning, and organizational effectiveness over time.

Cross-Cultural Analyses: Extending research to diverse cultural contexts can uncover how cultural nuances influence the relationships studied, providing valuable insights for global organizations.

Qualitative Approaches: Complementing quantitative analyses with qualitative methodologies, such as interviews or case studies, can offer a richer understanding of the contextual factors shaping ethical leadership, knowledge-sharing practices, and organizational learning.

Impact of Leadership Styles: Exploring the impact of different leadership styles within the realm of ethical leadership on knowledge sharing, organizational learning, and organizational effectiveness can contribute to a more nuanced understanding of leadership dynamics.

Technological Influences: Investigating the role of emerging technologies in facilitating knowledge sharing and organizational learning, and their impact on organizational effectiveness, is crucial in the ever-evolving digital landscape.

Employee Perspectives: Future research could delve into employee perceptions and experiences, providing insights into the subjective nature of ethical leadership, knowledge sharing, and organizational learning.

Mediation Mechanisms: Further examining the intricate mechanisms through which knowledge sharing and organizational learning mediate the relationship between ethical leadership and organizational effectiveness will enhance the depth of understanding.

By addressing these avenues, future research endeavors can contribute to the continual development of organizational behavior literature and provide practical implications for leaders seeking to enhance ethical practices, knowledge dynamics, and overall organizational effectiveness.

5.3. Conclusion

In conclusion, this study provides empirical evidence that ethical leadership significantly enhances organizational effectiveness through the mediating roles of knowledge sharing and organizational learning. By fostering a culture that values ethical behavior, transparency, and continuous improvement, organizations can achieve sustainable success and remain competitive in their respective industries. The findings offer practical insights for managers and contribute to the broader literature on leadership and organizational performance, particularly within the context of SMEs in Vietnam.

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