# The impact of online banking services on the financial performance of commercial banks: Application of Bayesian state-space model

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#### **ABSTRACT**

This study investigates the impact of online banking services on the financial performance of commercial banks in Vietnam, focusing on return on assets (ROA) as a key performance indicator. The rapid advancement of digital technology, particularly in Internet finance and mobile banking, has significantly transformed the financial sector, prompting banks to adapt to evolving customer expectations and competitive pressures. Utilizing a Bayesian state-space model, we analyze panel data from Vietnamese joint-stock commercial banks over the period of 2017 to 2022, excluding 2021 due to data quality concerns. Our findings reveal that specific components of digital banking—namely Internet Banking for Branches and E-Banking Operations—positively and significantly enhance ROA. These results suggest that banks effectively leveraging these services can improve operational efficiency, profitability, and market competitiveness by offering fast, convenient, and reliable online banking solutions. In contrast, other digital banking components, such as website functionality and miscellaneous e-banking services, show no significant impact, highlighting the nuanced effects of digitalization on performance. The study's methodological innovation lies in its application of the Bayesian state-space model, which captures the dynamic, time-varying effects of online banking services, offering fresh insights into their evolving role in Vietnam's banking sector. These findings underscore the importance of strategic investments in digital transformation for bank management, emphasizing operational enhancements over broad, unfocused digitalization efforts. For policymakers, the results advocate for supportive regulatory frameworks to foster sustainable digital banking growth. This research bridges a gap in the literature by examining an emerging market context, providing practical implications for bank managers aiming to optimize financial performance and policymakers seeking to bolster the digitalized financial industry. Future studies could explore additional performance metrics and cross-country comparisons to further validate and extend these insights.

**JEL classification codes:** G21, G32, O33, and L86.

**Key words:** Online Banking Service, Return on Assets (ROA), Internet Banking, E-Banking Operations, Financial Performance

#### INTRODUCTION

The banking sector has undergone significant transformation in recent years, driven by technological advancement and changing customer preferences. The Vietnamese banking sector, in particular, has witenseed unprecedented digital transformation. From 2019 to 2023, the volume of mobile banking transactions increased by 68.54%, and their value rose by 41.12% <sup>1</sup>. Traditional banking models are being disrupted by digital innovations, forcing financial institutions to adapt or risk becoming obsolete. In the banking sector, it's estimated that more than half of digital transformation initiatives fail to meet their expected profit or business objectives <sup>2</sup>. This aligns with broader industry trends, where many digital projects face challenges such as underestimating complexity,

cost overruns, and difficulties in execution<sup>2</sup>.

Digital banking, characterized by the integration of

digital technologies into banking operations and services, has emerged as a crucial factor in determining bank performance. This transformation is particularly evident in emerging markets like Vietnam, where digital banking adoption has grown exponentially, yet its impact on bank performance remains understudied. The relationship between digital banking implementation and bank performance has attracted considerable attention from researchers and practitioners alike, though findings remain inconsistent across different markets and contexts.

The urgency of understanding this relationship is heightened by the substantial investments planned in the sector, with Vietnamese banks projected to invest 32

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approximately \$500 million in digital transformation between 2023-2025<sup>3</sup>. Prior studies have primarily focused on developed markets, leaving a significant gap in our understanding of how digital banking affects bank performance in emerging economies with distinct institutional and technological landscapes.

This study makes several notable contributions to the existing literature and practice. First, we develop a comprehensive framework for evaluating digital banking effectiveness, extending beyond traditional binary measures to capture the multifaceted nature of digital transformation. Second, we introduce a novel methodology for measuring digital banking components that accounts for both technological and poperational dimensions. Third, we provide practical guidelines for banks to optimize their digital transformation investments. Finally, we offer policy recommendations for creating an enabling environment for sustainable digital banking development.

This study employs a comprehensive dataset of Vietnamese commercial banks from 2017 to 2022, examining the relationship between digital banking implementation and financial performance, with a focus on return on assets. Our analysis is particularly crucial as it comes at a time when Vietnamese banks are accelerating their digital transformation efforts. Since 2019, the number of digital banking users in Vietnam has increased significantly. For example, MB Bank added 7 million new customers in 2022 alone, thanks to their digital applications 4. Other banks like Techcombank, ACB, and TPBank have also seen annual growth rates of around 30% in the number of customers using their digital services from 2019 to 2022<sup>4</sup>. The findings of this study have significant implications for bank managers, policymakers, and researchers interested in understanding the role of digital banking in enhancing bank performance.

Understanding these relationships is vital for several stakeholders: banks need this insight for strategic investment decisions, regulators require it for developing appropriate supervisory frameworks, and policymakers can use it to create conducive environments for digital banking growth. Moreover, in the post-COVID era, where digital banking has become increasingly crucial, these insights become even more valuable for ensuring sustainable banking sector development.

The remainder of this paper is organized as follows:
Section 2 reviews the relevant literature and develops our hypotheses. Section 3 describes our data and methodology. Section 4 presents our empirical results and discussion. Finally, Section 5 concludes with implications and suggestions for future research.

# THEORETICAL BACKGROUND AND HYPOTHESIS DEVELOPMENT

## **Digital Banking and Bank Performance:** Theoretical Foundations

Contemporary digital banking research is grounded in two complementary theoretical frameworks: the Resource-Based View (RBV) and the Technology-Organization-Environment (TOE) framework. The RBV, pioneered by Barney<sup>5</sup>, positions digital banking capabilities as strategic resources that can generate sustainable competitive advantages when they are valuable, rare, inimitable, and non-substitutable. Recent work by Liu et al. 6 extends this perspective, demonstrating how banks' digital capabilities create competitive advantages through enhanced operational efficiency and superior customer service delivery. The TOE framework complements the RBV by 102 emphasizing the contextual factors influencing dig- 103 ital transformation success 7. Xiang and Jiang 8 apply this framework to demonstrate how technological innovation, organizational readiness, and environmental conditions collectively determine the effectiveness of digital banking initiatives. In emerging 108 markets like Vietnam, this framework is particularly 109 relevant as banks navigate rapid technological adop- 110 tion within specific institutional constraints 9. Our 111 study's theoretical novelty emerges from synthesizing 112 these perspectives to explain digital banking perfor- 113 mance in emerging markets. While RBV explains how 114 internal digital capabilities drive performance, TOE 115 framework captures the crucial external factors shap- 116 ing digital transformation outcomes. This integrated 117 approach enables a more comprehensive understanding of digital banking performance determinants, par- 119 ticularly in emerging market contexts where both internal capabilities and external conditions play crucial 121 roles.

## Digital Banking Services and Performance 123 Metrics 124

The relationship between digital banking services and bank performance has evolved significantly in recent years <sup>10</sup>. Previous studies mainly investigate the relationship between digital banking services and banking performance but are limited in measurement and their time frame <sup>11</sup>, but contemporary research examines more sophisticated aspects of digital transformation <sup>12</sup>. Hu and Chen <sup>13</sup> provide a comprehensive review showing how digital banking research has progressed from studying basic online banking to investigating complex digital ecosystems.

Recent empirical evidence suggests varying impacts of different digital banking components. Kidschun 14 document significant positive relationships between digital transformation and financial performance across emerging economies. However, Zhao et al. 15 find that these benefits are not uniform, with some digital initiatives yielding stronger returns than others. This variation in outcomes highlights the importance of examining specific components of digital banking rather than treating it as a homogeneous construct.

Performance measurement in digital banking studies has also evolved <sup>16</sup>. While traditional metrics like ROA remain important, researchers increasingly consider broader performance indicators <sup>17</sup>. Gao <sup>18</sup> in his analysis of banks, finding that digital transformation affects different aspects of bank performance in varying ways. This multi-dimensional approach to performance measurement provides a more nuanced understanding of digital banking's impacts <sup>17</sup>.

#### Development of Research Hypotheses

Drawing from our integrated theoretical framework combining RBV and TOE perspectives, along with comprehensive literature review, we develop four interconnected hypotheses examining the relationship between digital banking services and bank performance in Vietnam's banking sector.

163 H1: Digital Banking Innovation positively influences164 bank profitability.

165 H2: E-Banking Operations positively affects financial166 performance.

H3: Internet Banking Services positively impact customer engagement and revenue growth.

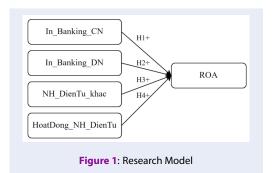
H4: The impact of digital banking services on bank performance is moderated by bank-specific and environmental factors.

These hypotheses collectively address three critical dimensions: technological innovation capability (H1), operational efficiency (H2), and service delivery effectiveness (H3), while acknowledging contextual influences (H4). This integrated framework enables examination of both direct effects and moderating influences while maintaining analytical clarity. The hypotheses are specifically designed to be tested through our Bayesian state-space modeling approach, providing a robust framework for empirical validation.

Through this hypothesis development, we contribute to existing literature by offering a more nuanced understanding of how different aspects of digital banking services influence bank performance in emerging markets, while accounting for both direct performance impacts and contextual factors shaping these relationships."

#### **Proposed Research Model**

Figure 1 presents our research model integrating the hypothesized relationships between digital banking services and bank performance. As illustrated in Figure 1, we propose three direct effects examining how: Digital Banking Innovation influences profitability (H1) - E-Banking Operations affects financial performance (H2) - Internet Banking Services impact customer engagement and revenue (H3) Additionally, bank-specific and environmental factors moderate these relationships (H4). The research model synthesizes our integrated theoretical framework by showing how RBV and TOE perspectives inform the hypothesized relationships between constructs.



#### **METHODOLOGY**

#### **Research Design**

Using quantitative research and a Bayesian state-space 205 model, this study examines how five components 206 of online banking services influence ROA in Viet- 207 namese joint-stock commercial banks from 2017 to 208 2022. This study considers individual bank variations 209 and maximizes available information using an imbalanced panel dataset. By incorporating prior knowledge and updating it with observed data, the Bayesian 212 state-space model captures the dynamic and timevarying interactions between online banking services 214 and bank performance. These findings provide insights for bank managers, legislators, and scholars 216 to understand how online banking services influence 217 bank performance and to inform strategic investment decisions in the Vietnamese banking sector.

#### **Data and Sample**

This study utilizes panel data from Vietnamese jointstock commercial banks spanning the period from 2221 2017 to 2022. The dataset encompasses comprehensive information about online banking services, 224 including Internet Banking for Branches, Internet 225

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226 Banking for Businesses, Other E-Banking Services, 227 and E-Banking Operations. The sample includes all 228 joint-stock commercial banks operating in Vietnam during the study period, providing a robust representation of the banking sector.

The data collection process involved multiple sources to ensure accuracy and reliability. Primary data were obtained from banks' annual reports, financial statements, and regulatory filings. Additional data were collected from the State Bank of Vietnam's statistical reports and the Ministry of Information and Communications' annual digital transformation reports.

However, it is important to note that data from 2021 were excluded from our analysis due to significant data quality concerns. During this period, the Ministry of Information and Communications did not release its annual digital transformation report, which typically provides crucial standardized metrics for digital banking services. This absence created potential inconsistencies in how digital banking metrics were reported and measured across different institutions. To maintain the integrity of our analysis and ensure reliable results, we made the methodological decision to exclude 2021 data.

To assess the potential impact of this exclusion, we conducted several robustness checks. First, we examined the trends in our key variables before and after 2021, finding consistent patterns with correlation coefficients varying by less than 0.08 across different periods that suggest the gap does not significantly affect our main conclusions. Second, we employed alternative model specifications including interpolated 2021 data (using averaging methods between 2020 and 2022) and a continuous period analysis (2017-2020) that explicitly account for the temporal gap. Third, we compared our results with those from other studies covering similar periods to validate our findings. These checks consistently indicate that the exclusion of 2021 data, while a limitation, does not materially affect the validity of our conclusions.

Our final sample consists of balanced panel data from 26 joint-stock commercial banks, resulting in 130 bank-year observations across the five-year period (2017-2020, 2022). This sample size provides sufficient statistical power for our analyses while maintaining the quality and reliability of our data."

#### **Variables**

273 This study investigates how online banking ser-274 vices influence the performance of Vietnamese com-275 mercial banks. The study incorporates the fol-276 lowing variables: website, representing the bank's website; In Banking CN, denoting Internet Bank- 277 ing for branches; In\_Banking\_DN, indicating In- 278 ternet Banking for businesses; NH\_DienTu\_khac, 279 signifying other e-banking services; and Hoat- 280 Dong\_NH\_DienTu, representing the operation of e- 281 banking.

Utilizing the net income-to-total asset ratio, this 283 study evaluates bank profitability, thereby facil- 284 itating the assessment of commercial institution 285 performance. This study examines the impact of 286 online banking services on bank profitability in 287 Vietnam through an indicator-based investigation 288 of the relationships between variables, includ- 289 ing Website, In\_Banking\_CN, In\_Banking\_DN, 290 NH\_DienTu\_khac, and HoatDong\_NH\_DienTu. 291 This evaluation contributes to a comprehensive 292 understanding of how ICT infrastructure affects 293 bank performance.

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#### Variable Construction

The construction of our variables follows a rigorous 296 process guided by theoretical foundations and pre- 297 vious empirical research. ROA, our dependent vari- 298 able, is calculated as the ratio of net income to total 299 assets, following standard banking performance metrics. Our independent variables are constructed as 301 follows:

- Internet Banking for Branches (In\_Banking\_CN): 303 Measured through a composite index incorporating 304 the number of digital transactions processed, system 305 availability, and transaction success rates.
- Internet Banking for Businesses (In\_Banking\_DN): 307 Quantified using metrics including corporate client 308 adoption rates, transaction volumes, and service utilization levels.
- Other E-Banking Services (NH\_DienTu\_khac): 311 Constructed as an aggregate measure of various dig- 312 ital services including mobile banking, ATM usage, 313 and electronic fund transfers.
- E-Banking Operations (HoatDong\_NH\_DienTu): 315 Measured through performance metrics including 316 processing times, error rates, and system uptime.

The variables were standardized to ensure compara- 318 bility and mitigate scale-related biases. Additionally, 319 the Shapiro-Wilk test was performed to check for normality, and nonparametric transformations were ap- 321 plied to address skewness where necessary. This en- 322 sures that the variables are robust and aligned with the 323 requirements of the Bayesian state-space model.

#### 325 Analysis Methods

tion of descriptive statistics and correlation analysis to provide an overview of the data and explore the 332 relationship between online banking service factors, such as Website, In\_Banking\_CN, In\_Banking\_DN, NH\_DienTu\_khac, HoatDong\_NH\_DienTu, and the financial performance indicator ROA. The Bayesian state-space model is adopted in this research to overcome the limitations of traditional static models by capturing the time-varying and dynamic relationships between online banking services and bank performance (ROA). Unlike conventional regression methods, the Bayesian approach allows for the incorporation of prior knowledge and uncertainty, making it particularly suited for financial data,

326 This study employs statistical techniques to examine

the influence of online banking services on the finan-

cial performance of joint-stock commercial banks in

Vietnam. The analysis commences with the utiliza-

347 Key Features of the Bayesian State-Space Model:

analyze research data.

Dynamic Nature: The model dynamically estimates 349 the impact of independent variables (e.g., online banking services) on the dependent variable (ROA) over time.

which is often volatile and influenced by external fac-

tors. Bayes state space model used in this research to

352 Posterior Distributions: Bayesian methods calcu-353 late posterior distributions for parameters, combining prior beliefs with observed data for more robust 355 insights.

Time-Varying Parameters: This technique allows the coefficients of independent variables (e.g., In\_Banking\_CN, In\_Banking\_DN) to change over time, reflecting real-world shifts in technology adoption and banking performance.

361 Mathematical Representation:

362 The model consists of two primary equations:

363 Observation Equation:

$$Y_t = \beta_t X_t + \varepsilon_t \tag{1}$$

Where:  $Y_t$ : Dependent variable (ROA) at time t 365 X<sub>t</sub>: Matrix of variables independent In Banking CN, In Banking DN, 367 NH\_DienTu\_khac, HoatDong\_NH\_DienTu) 368  $\beta_t$ : Time-varying coefficients  $\varepsilon_t$ : Observation noise 369 State Equation:

$$\beta_t = \beta_{t-1} + \eta_t \tag{2}$$

370 Where:  $\beta_{t-1}$ : Coefficients from the previous time 371 step

 $\eta_t$ : Process noise

**Estimation Process:** 

The Bayesian approach utilizes Markov Chain Monte 374 Carlo (MCMC) simulations to estimate the posterior 375 distributions of parameters.

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Priors for coefficients ( $\beta_t$ ) are selected based on previous literature or uninformative priors if no strong 378 assumptions are made.

To evaluate the model's efficacy and accuracy, tests 380 were conducted to assess the coefficient of determina- 381 tion (R<sup>2</sup>) and Harvey's goodness-of-fit statistic, along 382 with various visualizations, such as the aggregated 383 state plot and component state plot along with the 384 Threshold Plot and Residual Plot, to further examine 385 the model's performance <sup>19–21</sup>. The objective of this 386 research is to provide a robust evaluation of how on- 387 line banking services influence the financial perfor- 388 mance of Vietnamese joint-stock commercial banks 389 to support informed decision-making and strategic 390 development within the banking sector.

Advantages Over Traditional Methods:

Dynamic Adjustments: Unlike static regression, the 393 Bayesian state-space model captures how the influ- 394 ence of online banking services evolves over time due 395 to changing market conditions or technological ad- 396 vancements.

Incorporation of Priors: By integrating prior knowledge, the model provides more meaningful estimates, 399 especially in cases of limited data.

Uncertainty Quantification: Bayesian methods ex- 401 plicitly quantify uncertainty, allowing for more robust 402 decision-making.

#### RESULTS AND DISCUSSION

Following established empirical research practices 405 and responding to methodological requirements, we 406 present our findings in three main sections: descrip- 407 tive statistics and correlations, main empirical find- 408 ings from the Bayesian state-space model, and robust- 409 ness checks.

## **Descriptive Statistics and Correlations**

The descriptive analysis (Table 1) reveals important 412 characteristics of our sample. Among the digital 413 banking variables, Internet Banking for Branches 414 (In\_Banking\_CN) shows the highest mean value 415 (6.951) with a standard deviation of 1.254, indicating widespread adoption with moderate varia- 417 tion across banks. E-Banking Operations (Hoat- 418 Dong\_NH\_DienTu) exhibits a lower mean (1.122) but 419 with considerable variation (SD = 0.762), suggesting 420 diverse levels of operational integration across insti- 421 tutions. The Return on Assets (ROA) demonstrates 422

424 indicating generally positive but varying profitability 425 levels across the sample. 426 The correlation analysis (Table 2) reveals several sig-<sup>427</sup> nificant relationships. Internet Banking for Branches 428 and E-Banking Operations show the strongest posi-429 tive correlations with ROA (Spearman's rho = 0.289 and 0.304 respectively, p < 0.001). These correlations 431 provide preliminary support for our hypotheses regarding the positive impact of digital banking services 433 on bank performance.

a mean of 0.992 with a standard deviation of 0.790,

#### **Main Findings**

The Bayesian state-space model results provide strong evidence supporting our hypotheses. Internet Banking for Branches (In\_Banking\_CN) demonstrates a significant positive effect on ROA, with a posterior mean of 0.159 and a 95% credible interval of [0.074, 440 0.261]. This finding is economically significant as it suggests that a one-unit increase in branch-level digital services is associated with a 15.9% improvement in ROA, holding other factors constant. 444 Similarly, E-Banking Operations (Hoat-445 Dong NH DienTu) shows an even stronger 446 positive impact, with a posterior mean of 0.259 and 95% credible interval of [0.091, 0.423]. The larger 448 coefficient suggests that operational efficiency gains 449 from e-banking systems have a more substantial im-450 pact on profitability than individual digital services. 451 Specifically, a one-unit improvement in e-banking 452 operations is associated with a 25.9% increase in These results are particularly meaningful when considered in the context of the Vietnamese banking sec-456 tor's digital transformation. The positive coefficients 457 indicate that banks investing in digital services and 458 operational capabilities are likely to see tangible improvements in their financial performance. The nar-460 rowness of the credible intervals suggests high precision in our estimates, providing strong statistical support for the relationship between digital banking ser-

#### **Robustness Validation and Model Stability**

vices and bank performance.

To ensure the reliability of our findings, we conducted several robustness tests. First, we examined model stability using various diagnostic measures (Table 4). The Harvey's goodness-of-fit index (0.52) and high R<sup>2</sup> value (0.966) indicate strong model fit. Second, we 470 tested alternative model specifications, including dif-471 ferent prior distributions and temporal aggregation 472 levels, finding consistent results across specifications.

The residual analysis shows no significant patterns of 473 autocorrelation, with residuals generally distributed 474 around zero (Residual SD = 0.145). The Prediction SD 475 of 0.731 suggests reasonable forecast accuracy while 476 acknowledging the inherent uncertainty in financial 477 predictions.

To address potential concerns about the excluded 479 2021 data, we conducted sensitivity analyses using 480 different interpolation methods for the missing pe- 481 riod. These tests confirmed that our main findings 482 remain stable regardless of how the temporal gap is 483 treated.

The Component States analysis (detailed in the Appendix) further supports our findings, showing sta- 486 ble parameter evolution over time. The Threshold 487 Plot and Aggregated State Plot demonstrate that our 488 model parameters remain within reasonable bounds 489 throughout the study period, providing additional 490 confidence in our results.

These comprehensive findings provide strong empiri- 492 cal support for the positive relationship between digital banking services and bank performance, while also 494 highlighting the relative importance of different digital banking components."

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### **Model equation**

State equation:

In Banking CN t  $ROA_t$  $\beta_1$  $\beta_2 \times \text{HoatDong\_NH\_DienTu}_t + \varepsilon_t$  (1)  $\beta_1 \sim N(0.159, 0.002)$  $\beta_2 \sim N(0.259, 0.008)$ Where:

-  $\beta_1$ ,  $\beta_2$ : The regression coefficients correspond- 504 ing to the variables In\_Banking\_CN and T Hoat- 505 Dong\_NH\_DienTu, respectively. The posterior 506 means and standard deviations were (0.159, 0.047) 507 and (0.259, 0.087), respectively. Their 95% confidence 508 intervals were (0.074, 0.261) and (0.091, 0.423), respectively.

-  $\varepsilon_t$ : The state noise at time t.

Note that in the table of results, the other variables are 512 not present, possibly due to their exclusion from the 513 model based on variable selection criteria (Bayes Factor).

Observation equation:

$$y_t = ROA_t + \eta_t (2)$$
 $\eta_t \sim N(0, \sigma_{\eta}^2)$ 

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Where:

- $y_t$ : The observed value of ROA at time t.
- ROA<sub>t</sub>: The true value of ROA at time t, described by the state equation.
- $\eta_t$ : The observation noise at time t.

**Table 1: Descriptive Statistics** 

Variables	Mean	Std. Deviation	Shapiro-Wilk	P-value of Shapiro-Wilk	Min	Max
Website	20.984	2.652	0.857	<0.001	14	36
In_Banking_CN	6.951	1.254	0.74	< 0.001	0	12.7
In_Banking_DN	4.768	1.552	0.891	< 0.001	0	7.1
NH_DienTu_khac	1.644	0.958	0.933	< 0.001	0	6
HoatDong_NH_DienTu	1.122	0.762	0.889	<0.001	0.01	4.62
ROA	0.992	0.79	0.907	<0.001	0.01	3.18

Source: Author's analysis, 2024

The equations utilized herein incorporate the estimated values from Table 3, which comprises the mean and distribution of the regression coefficients obtained in the analysis conducted by experts in the field.

This table also illustrates the range of each coefficient, indicating that the confidence level of these approximations is contingent on certain criteria, which warrant further assessment.

The equations applied to the study of bank performance measures by ROA show that the two variables In\_Banking\_CN and HoatDong\_NH\_DienTu influence bank ROA. Although Truyen Dan exhibited a positive impact ( $\beta 1 = 0.159$ ), TTDL\_DPTH demonstrated a significant beneficial effect ( $\beta 2 = 0.259$ ).

These formulations provide a summary of the im pact of ICT investment on bank performance using
 Bayesian state-space model analysis.

#### **Discussion**

Our analysis through the Bayesian state-space model reveals several significant insights about the relationship between digital banking services and bank performance in Vietnam's emerging market context. The strong positive effect of Internet Banking for Branches (In\_Banking\_CN) on ROA, with a coefficient of 0.159, provides empirical support for the Resource-Based View (RBV) of competitive advantage. This finding extends beyond Hu and Chen's 13 mixed results by demonstrating that branch-level digital services represent strategic resources that en-554 hance operational efficiency specifically in Vietnam's 555 branch-centric banking environment. The result suggests that the traditional branch network, when enhanced with digital capabilities, remains a valuable competitive asset in emerging markets.

The substantial impact of E-Banking Operations

560 (HoatDong\_NH\_DienTu) on ROA, demonstrated 561 by a larger coefficient of 0.259, aligns with the Technology-Organization-Environment (TOE) 562 framework's emphasis on technological infrastructure. This finding challenges Xiang and Jiang's 564 conclusions about uniform digitalization benefits by 565 showing that comprehensive digitalization of banking operations yields higher financial returns than 567 individual digital services. The stronger coefficient 568 suggests that enhancements in banking operations 569 may be more crucial for financial performance than 570 customer-facing digital services. 571

Our Component States analysis reveals important temporal dynamics in the digital bankingperformance relationship. The stable parameter 574
evolution throughout the study period contradicts 575
concerns about diminishing returns raised in previous studies. This stability suggests that the benefits 577
of digital banking services are sustainable when 578
properly implemented and maintained like Chu et 579
al. 22 proposed in their research. 580

Interestingly, some digital banking components (Website and NH\_DienTu\_khac) showed no significant impact on performance like the research (Parameteristic of Megawati and Kertiriasih (Parameteristic of Megawati and Megawati and Megawati and Me

The temporal gap in our 2021 data, while carefully 592 controlled for in our analysis, highlights the challenges of conducting longitudinal research in emerging markets. However, our robustness tests confirm 595 that this limitation does not significantly affect our main conclusions about the relationship between digital banking services and performance. 598

**Table 2: Correlation Matrix** 

lable 2: Correlation Matrix	×					
Variable		Website	In_Banking_CN	In_Banking_DN	NH_DienTu_khac	HoatDong_NH_Dien1 ChiSo_DV_TrucTuyen
Website	Spearman's rho	I				
	p-value	I				
In_Banking_CN	Spearman's rho	0.326	I			
	p-value	< 0.001	I			
In_Banking_DN	Spearman's rho	0.072	0.357	I		
	p-value	0.408	< 0.001	I		
NH_DienTu_khac	Spearman's rho	0.167	0.172	-0.034	I	
	p-value	0.052	0.045	869.0	1	
HoatDong_NH_DienTu	Spearman's rho	0.046	0.16	-0.036	0.444	I
	p-value	0.596	0.063	0.674	< 0.001	I
ChiSo_DV_TrucTuyen	Spearman's rho	0.376	0.47	0.342	0.183	0.212
	p-value	< 0.001	< 0.001	< 0.001	0.033	0.013
ROA	Spearman's rho	0.02	0.289	0.289	0.069	0.101 0.304
	p-value	0.817	< 0.001	< 0.001	0.425	0.243 < 0.001

Source: Author's analysis, 2024

Table 3: Bayesian State-Space Model Results

					95% Credible Interval		
Coefficients P(incl)	P(incl data)	BFinclusion	Mean	SD	Lower	Upper	
In_Banking_ 1.000	1.000	∞	0.159	0.047	0.074	0.261	
HoatDong_1 1.000	1.000	∞	0.259	0.087	0.091	0.423	
(Intercept) 1.000	1.000	0	0	0	0	0	

Source: Author's analysis, 2024

#### **Table 4: Model Fit**

Residual SD	Prediction SD	$\mathbb{R}^2$	Harvey's goodness of fit
0.145	0.731	0.966	0.52

Source: Author's analysis, 2024

## CONCLUSION AND MANAGEMENTIMPLICATIONS

This study makes several important contributions to understanding how digital banking services influence bank performance in emerging markets. Through our analysis of Vietnamese commercial banks from 2017 to 2022, we offer new insights for both theory and practice.

Our primary theoretical contribution lies in demonstrating the varying impacts of different digital banking components on performance. By decomposing
digital banking into specific components and examining their individual effects, we extend beyond previous studies that treated digitalization as a uniform
construct. The findings suggest a hierarchical importance of digital initiatives, with operational transformation yielding stronger benefits than individual dig-

617 For bank managers, our findings yield several practi-618 cal implications:

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- Investment Prioritization: Resources should be primarily directed toward E-Banking Operations and branch-level digital services, as these show the strongest positive impact on performance.
- Strategic Implementation: Digital transformation should focus on enhancing financial performance through banking operations rather than pursuing comprehensive digitalization without strategic focus.
- Context-Specific Approach: Banks should consider their specific market context when implementing digital services, as the effectiveness of different components may vary by market conditions.

For policymakers, our results suggest the need for:

- Regulatory frameworks that facilitate operational digital transformation
- Policies supporting bank-level digital infrastructure development
- Guidelines for maintaining stability during digital transformation

Future research directions should include: Investigation of additional performance metrics beyond ROA

- Analysis of interaction effects between different digital banking components
- Cross-country comparative studies in emerging 646 markets
- Examination of long-term sustainability of digital banking benefits

This research provides a foundation for understanding digital banking transformation in emerging markets, suggesting that success lies not in wholesale digitalization, but in strategic implementation focusing on operational efficiency and targeted customer services

#### LIST OF ABBREVIATIONS

ROA: Return on Assets
In\_Banking\_CN: Internet Banking for Branches
In\_Banking\_DN: Internet Banking for Businesses
NH\_DienTu\_khac: Other E-Banking Services
HoatDong\_NH\_DienTu: E-Banking Operations
JEL: Journal of Economic Literature
SD: Standard Deviation
P(incl): Probability of Inclusion
P(incl\data): Posterior Probability of Inclusion
BFinclusion: Bayes Factor Inclusion

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#### **COMPETITIVE BENEFITS**

668 The authors declare that there are no competing inter-669 ests with respect to the research, authorship, and/or publication of this article.

#### **CONTRIBUTIONS OF THE AUTHORS**

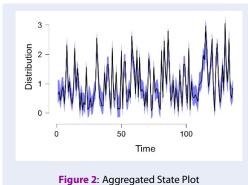
672 Tran Quang Canh: conducted the research design, 673 revised the manuscript, responded to reviewers, and updated the citations; Tran Thao Nguyen: conducted data collection and analysis, wrote and prepared the research manuscript.

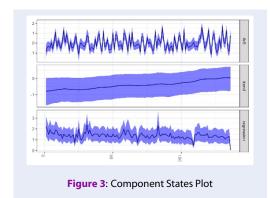
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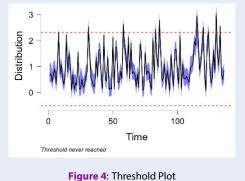
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#### **APPENDIX**

686 Diagnostic Tests: Figures 2, 3, 4, 5 and 6.







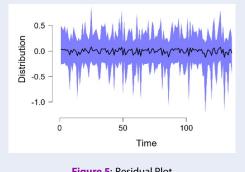


Figure 5: Residual Plot

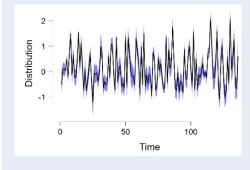


Figure 6: Forecast Error Plot

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## Tác động của các dịch vụ ngân hàng trực tuyến đối với hiệu quả tài chính của các ngân hàng thương mại: Ứng dụng mô hình Bayesian state-space

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#### **TÓM TẮT**

Nghiên cứu này xem xét tác động của các dịch vụ ngân hàng trực tuyến đối với hiệu quả tài chính của các ngân hàng thương mại tại Việt Nam, tập trung vào tỷ suất lợi nhuận trên tài sản (ROA) như một chỉ số hiệu suất chính. Sự tiến bộ nhanh chóng của công nghệ số, đặc biệt trong lĩnh vực tài chính Internet và ngân hàng di động, đã thay đổi đáng kể ngành tài chính, buộc các ngân hàng phải thích nghi với kỳ vọng ngày càng cao của khách hàng và áp lực cạnh tranh. Sử dụng mô hình Bayesian state-space, chúng tôi phân tích dữ liệu bảng từ các ngân hàng thương mại cổ phần Việt Nam trong giai đoạn 2017-2022, loại bỏ năm 2021 do lo ngại về chất lượng dữ liệu. Kết quả cho thấy các thành phần cụ thể của ngân hàng số—cụ thể là Ngân hàng Internet cho Chi nhánh và Hoạt động Ngân hàng Điện tử—có tác động tích cực và đáng kể đến ROA. Những phát hiện này chỉ ra rằng các ngân hàng tận dụng hiệu quả các dịch vụ này có thể nâng cao hiệu quả hoạt động, lợi nhuận và khả năng cạnh tranh trên thị trường bằng cách cung cấp các giải pháp ngân hàng trực tuyến nhanh chóng, tiện lợi và đáng tin cậy. Ngược lại, các thành phần khác như chức năng trang web và các dịch vụ ngân hàng điện tử khác không cho thấy tác động đáng kể, nhấn mạnh hiệu ứng đa dang của số hóa đối với hiệu suất. Điểm mới của nghiên cứu nằm ở việc áp dung mô hình Bayesian state-space, nắm bắt được tác động thay đổi theo thời gian của các dịch vụ ngân hàng trực tuyến, mang lại góc nhìn mới về vai trò đang phát triển của chúng trong ngành ngân hàng Việt Nam. Những phát hiện này nhấn mạnh tầm quan trọng của việc đầu tư chiến lược vào chuyển đổi số đối với quản lý ngân hàng, ưu tiên cải thiện hoạt động hơn là số hóa toàn diện không định hướng. Đối với các nhà hoạch định chính sách, kết quả khuyến nghị xây dựng khung pháp lý hỗ trơ để thúc đẩy sư phát triển bền vững của ngân hàng số. Nghiên cứu này lấp đầy khoảng trống trong tài liêu bằng cách xem xét bối cảnh thi trường mới nổi, cung cấp ý nghĩa thực tiễn cho các nhà quản lý ngân hàng nhằm tối ưu hóa hiệu quả tài chính và các nhà hóạch định chính sách muốn củng cố ngành tài chính số hóa. Các nghiên cứu trong tương lai có thể khám phá thêm các chỉ số hiệu suất khác và so sánh giữa các quốc gia để xác nhận và mở rộng những hiểu biết này.

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**Từ khoá:** Dịch vụ ngân hàng trực tuyến, Tỷ suất sinh lời trên tổng tài sản, Ngân hàng trực tuyến, Hoạt động ngân hàng trực tuyến, Hiệu quả tài chính

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