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A BLOCKCHAIN-DRIVEN VAT COMPLIANCE MODEL USING HYPERLEDGER FABRIC AND MONTE CARLO SIMULATIONS

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ABSTRACT

This paper presents the development and evaluation of a VAT compliance model utilizing Hyperledger Fabric blockchain technology integrated with Monte Carlo simulations. The model aims to address the pervasive issue of VAT non-compliance by providing real-time monitoring and automated compliance checks. By simulating 10,000 VAT-related transactions under various compliance scenarios, the study assesses the model's performance in detecting both compliant and non-compliant transactions based on product registration and VAT rate application. The Monte Carlo simulations generate diverse transaction scenarios, while the blockchain provides a secure, immutable ledger for tracking each transaction's compliance status. The model is tested on a system simulating real-world conditions, focusing on key metrics such as transaction throughput, latency, accuracy, sensitivity, precision, and specificity. The results demonstrate that the model achieves 100% accuracy in identifying non-compliant transactions, with a transaction throughput of 1,200 transactions per second and an average latency of 0.83 milliseconds. This study highlights the potential of blockchain technology to revolutionize VAT administration by reducing non-compliance, enhancing transparency, and streamlining tax enforcement process**es**.

Keywords: Blockchain Technology, Value Added Tax (VAT), Hyperledger Fabric, Smart Contracts, Tax Compliance, VAT Administration, VAT Compliance Framework, Monte Carlo Simulation, Permissioned Blockchain

INTRODUCTION

Value Added Tax (VAT) is a consumption tax levied on the value increment of goods and services at every phase of production and distribution, making it one of the most prevalent forms of indirect taxation globally (Omodero *et al.*, 2020). The conception of Value Added Tax (VAT) originated from the French Economist Maurice Laure in 1954 (Agbo and Nwadialor, 2020a). VAT is a consumption tax on the goods and services consumed by persons, business organizations, and individuals (Ojeka *et al.,* 2021). In contrast with a progressive income tax, this does not distinguish among different classes of revenue earners. VAT is referred to as Goods and Services Tax (GST) (Agbo and Nwadialor, 2020a). VAT offers advantages such as tax neutrality, revenue generation capacity, efficiency, and a broad tax base, in comparison to other forms of taxation making it a favored taxation model for governments (Agbo and Nwadialor, 2020). It provides a stable and predictable revenue stream due to its foundation on consumption, enabling better planning and budgeting for public expenditures (Omodero *et al.*, 2020).

Value Added Tax (VAT) compliance is a critical aspect of tax administration, ensuring that businesses accurately charge, report, and remit VAT to tax authorities. VAT is a consumption-based tax applied at each stage of the supply chain, from production to the point of sale. However, non-compliance remains a widespread issue across many economies, leading to significant tax revenue shortfalls and undermining the equity of tax systems. Non-compliance typically stems from various factors, including fraudulent activities, regulatory gaps, and systemic weaknesses within VAT systems. For instance, businesses may exploit inefficiencies by underreporting sales, generating false invoices, or misclassifying goods to reduce their VAT obligations, all of which distort tax revenues and create an unfair competitive advantage (Neve *et al.*, 2020).

The complexities of modern business practices, such as e-commerce and cross-border transactions, further exacerbate VAT compliance challenges. Tax authorities, often operating with limited resources, struggle to keep pace with evolving economic environments and the sophistication of tax evasion techniques. Traditional enforcement methods like audits and penalties, while essential, are proving insufficient to address these challenges, requiring more innovative solutions (Rafiq *et al.*, 2023). Advanced technologies, particularly blockchain, are now being explored as potential tools to enhance transparency and ensure real-time oversight, reducing opportunities for fraud and improving compliance across sectors (Agbo and Nwadialor, 2020a).

In this context, VAT compliance plays a pivotal role not only in maintaining the integrity of the tax system but also in promoting fair competition and supporting revenue generation for national development. Addressing VAT non-compliance requires a comprehensive approach, incorporating regulatory reforms, technological innovation, and stronger enforcement mechanisms.

In this paper, we develop and evaluate a VAT Compliance Model utilizing Monte Carlo simulations integrated with Hyperledger Fabric blockchain technology. The Monte Carlo simulation offers a method for generating thousands of random transaction scenarios involving various seller, buyer, and product profiles, providing a statistically significant analysis of compliance behaviors. This approach allows for an in-depth exploration of how businesses interact with VAT regulations under different conditions, revealing patterns of both compliance and non-compliance.

To enhance the integrity and transparency of the simulated VAT environment, we integrate Hyperledger Fabric, a permissioned blockchain platform known for its decentralized, secure, and immutable record-keeping capabilities. By leveraging blockchain technology, we create

a tamper-proof ledger of VAT-related transactions, ensuring that every transaction can be transparently tracked and validated. This not only supports better enforcement but also strengthens trust between businesses, consumers, and tax authorities.

The objective of this research is to assess VAT compliance trends over 10,000 transactions, identifying common non-compliance scenarios and their underlying causes. Additionally, we aim to demonstrate how the integration of blockchain technology can offer tax authorities new tools for improving VAT enforcement, specifically through real-time monitoring, enhanced accountability, and the automation of compliance checks. By employing this model, tax authorities can better target non-compliant entities, reducing revenue loss and improving overall tax compliance in the long term.

This study contributes to the growing body of research on the use of advanced technologies, such as blockchain and simulations, in public sector governance, particularly in the domain of tax compliance. The findings highlight the transformative potential of these technologies in reducing VAT evasion, enhancing operational efficiency, and fostering a more equitable tax environment.

VAT Compliance Model Explained

The VAT Compliance Model developed in this study is designed to evaluate and simulate the behavior of businesses regarding VAT registration and VAT rate application within a dynamic marketplace. The model uses a combination of Monte Carlo simulations and blockchain technology (specifically Hyperledger Fabric) to assess VAT compliance trends over a year period.

VAT non-compliance remains a substantial and multifaceted issue across many economies, causing significant tax revenue shortfalls and creating disparities in the tax system's fairness. The issue is particularly challenging due to the intricate nature of VAT systems, which rely on businesses to accurately charge, report, and remit VAT on the goods and services they supply.

Despite its significance, the Nigerian VAT administration system faces challenges such as low taxpayer compliance, tax evasion, weak enforcement mechanisms, administrative bottlenecks, corruption, and technological limitations (Buettner and Tassi, 2023; Al-Ttaffi *et al.,* 2021) and outdated regulatory frameworks that fail to keep pace with evolving business practices such as e-commerce or cross-border transactions. These regulatory gaps allow businesses to exploit inefficiencies in the system, resulting in revenue loss for governments and an uneven playing field for compliant businesses.

Fraudulent activities are a significant contributor to VAT non-compliance (Hossain *et al.,* 2020). Common tactics include the generation of false invoices, which enable businesses to claim improper VAT refunds or deductions, thereby lowering their taxable liabilities. Such fraud undermines the integrity of the VAT system and skews competition by favoring businesses engaging in dishonest practices over those adhering to the law. In addition to false invoicing, underreporting sales is another method used by non-compliant businesses to reduce their VAT obligations, further exacerbating revenue losses for tax authorities (Gaie and Mueck, 2022).

A significant issue in VAT non-compliance is the intentional misclassification of goods or services. Some businesses wrongly categorize products to benefit from reduced VAT rates or exemptions they are not eligible for, allowing them to avoid higher tax liabilities. For example, items that should be taxed at the standard rate may be falsely labeled as zero-rated or exempt. This practice not only reduces tax revenue but also creates inconsistencies in VAT application, complicating the enforcement of tax regulations.

To ensure VAT compliance, businesses must meet key obligations: registering for VAT, applying the correct VAT rates, and remitting collected taxes on time. Non-compliance can occur at any point, such as failing to register, misclassifying goods, or applying inaccurate VAT rates. These issues pose a broader systemic challenge, where businesses can bypass VAT regulations, either intentionally or unintentionally.

The complexity of VAT systems, especially for businesses operating across borders or in industries with frequently changing rules, makes compliance more difficult. As globalization complicates supply chains, tax authorities face increasing challenges in overseeing VAT compliance, often with limited resources. Traditional enforcement methods like audits and penalties, while still necessary, are becoming insufficient to handle sophisticated modern tax evasion techniques.

To address these challenges, a robust VAT compliance framework leveraging Hyperledger Fabric blockchain technology is proposed to enhance transparency, compliance, and revenue generation. While public blockchain solutions offer potential benefits, concerns regarding control and predictability (Berryhill *et al.,* 2018; Cagigas *et al.,* 2023; Fatz and Hake, 2020; Nguyen *et al.,* 2019; Steve Cheng *et al.,* 2017), necessitate a preference for Consortium blockchain in public sector applications, offering a higher degree of information security and potentially increasing processing speed (Yusoff *et al.,* 2022).

The proposed Hyperledger Fabric-based VAT compliance framework holds the potential to revolutionize tax administration in Nigeria. By facilitating real-time reporting and automated settlements, it aims to reduce non-compliance and fraud, lower compliance costs, and instil trust in the tax system.

MATERIALS AND METHODS

System Setup and Configuration of VAT Compliance Model

The evaluation of the VAT compliance model focused on key blockchain performance aspects such as the test environment, observation points, transaction characteristics, and workload management. The model was deployed on a system running Ubuntu 22.04, equipped with an Intel Core i5-4200U processor (1.60 GHz) and 12 GB of RAM, creating a realistic hardware environment to simulate typical conditions under which VAT compliance systems operate. The VAT compliance model was built using Hyperledger Fabric v2.5, a permissioned blockchain platform known for its secure and transparent transaction validation, making it an appropriate choice for VAT compliance applications.

The blockchain configuration included a 2MB block size, processing 10 transactions per batch, with a 2-second batch timeout. This setup was chosen to balance system performance and security, ensuring the model could handle high transaction volumes efficiently while preserving data integrity and transparency. The test environment was carefully designed to simulate real-world operational conditions, enabling the system to process large and diverse transaction workloads. The configuration allowed for thorough stress testing of the model, ensuring it could meet actual operational demands in VAT compliance monitoring.

Simulation Design and Data Generation

The primary goal of this research was to assess the performance of the VAT compliance model by integrating Monte Carlo simulations with Hyperledger Fabric blockchain technology to identify non-compliant VAT transactions. A Monte Carlo simulation was utilized to generate a dataset of 10,000 sales transactions, encompassing a variety of VAT compliance conditions. These transactions were evenly distributed across four distinct scenarios designed to test the model's ability to detect both compliance and non-compliance behaviors. This comprehensive approach allowed for a detailed evaluation of the model's performance.

Monte Carlo simulations offered a robust method for modeling the complexity of VAT compliance by generating random transaction parameters, enabling the exploration of a broad range of potential compliance outcomes. Hyperledger Fabric, as a permissioned blockchain platform, recorded and verified each transaction's compliance status in a secure, transparent, and immutable manner. Once recorded, transactions were locked in the blockchain, ensuring that they could not be altered and allowing tax authorities to verify them in real time. This combination of simulation and blockchain technology enabled a thorough evaluation of the model's capacity to detect and flag non-compliant transactions while assessing critical performance metrics.

Scenario Setup

The simulation included four distinct VAT compliance scenarios, each designed to reflect varying levels of compliance and non-compliance with VAT regulations. These scenarios captured typical VAT issues that tax authorities face, ranging from simple errors in product registration to more complex misapplications of VAT rates.

The first scenario involved a product that was not registered, but where the correct VAT rate was applied, representing partial compliance. The second scenario addressed a situation where a product was not registered, and an incorrect VAT rate was applied, representing non-compliance. The third scenario focused on partial compliance, where a product was registered, but the incorrect VAT rate was used. The final scenario represented full compliance, where both product registration and the correct VAT rate were applied.

These scenarios were developed to rigorously test the model's capacity to identify non-compliance at various stages of VAT regulation. While the first two scenarios primarily dealt with product registration issues, the latter two evaluated the application of VAT rates in combination with registration. This comprehensive approach allowed for a robust assessment of the model's effectiveness in identifying VAT compliance violations under realistic conditions.

Data Generation

The transaction data for evaluating the VAT Compliance Model was generated using a random number generator with predefined distributions, designed to replicate real-world business conditions. Key parameters—such as Transaction ID, Seller ID, Product ID, Transaction Value, Product Registration Status, and VAT Rate Application—were aligned with the four compliance scenarios.

Each transaction was assigned a unique Transaction ID, and Seller and Product IDs were randomly generated to represent a variety of businesses and product categories. Transaction values were drawn from a normal distribution, reflecting typical sales variations. Product Registration Status and VAT Rate Application were determined based on the compliance scenario, incorporating both correct and incorrect VAT registrations and rates.

This approach ensured that the simulated transactions closely mirrored actual VAT compliance conditions, providing a comprehensive dataset for evaluating the model's effectiveness in detecting non-compliant transactions across different scenarios.

Sales Distribution

For the evaluation of the VAT Compliance Model, sales transactions were evenly distributed across the four compliance scenarios, with each scenario receiving 25% of the total 10,000 transactions (2,500 transactions per scenario). This balanced distribution ensured that both compliant and non-compliant cases were well-represented, providing a comprehensive framework for assessing the model's performance under varying conditions. The distribution of transactions across the scenarios is detailed in Table 1. This even distribution enabled a thorough evaluation of the model's ability to detect non-compliance and assess its effectiveness across all scenarios.

Table 1: Scenarios Definition and Sales Distribution

Scenario	Description	Sales Distribution (%)	Number of Transactions
Scenario One (PNR + PPC)	Product Not Registered, Product Properly Captured	25%	2,500
Scenario Two (PNR + PNPC)	Product Not Registered, Product Not Properly Captured	25%	2,500
Scenario Three (PPR + PNPC)	Product Properly Registered, Product Not Properly Captured	25%	2,500
Scenario Four (PPR + PPC)	Product Properly Registered, Product Properly Captured	25%	2,500

VAT Compliance Model

The VAT Compliance Model was developed using Hyperledger Fabric, a permissioned blockchain platform, to securely record and verify the compliance of each transaction. The model operates in two phases: first, Monte Carlo simulations generate transaction data across different compliance scenarios, then the compliance model processes each transaction to evaluate whether it meets the necessary product registration and VAT rate application requirements.

The model flags transactions as non-compliant if the product is either not registered for VAT or if the incorrect VAT rate is applied. Fully compliant transactions are flagged when both the product registration and VAT rate application are correct. By utilizing Hyperledger Fabric, the model provides real-time verification and records each transaction's compliance status on an immutable ledger. This tamper-proof system ensures that data cannot be altered, offering a transparent audit trail for tax authorities. The immutability and transparency of blockchain technology enhance the model's security, making

it a reliable solution for VAT compliance detection and enforcement.

Observation Points and Metrics for Evaluation

The evaluation of the VAT Compliance Model focused on several key metrics to assess the system's performance at different stages of transaction processing. These included:

Transaction Throughput: Measured as the number of transactions processed per second, providing insight into the system's efficiency and scalability. This can be expressed as equation 1.

$$Throughput = \frac{Successful\ Transactions}{\text{Total Time (s)}} \quad (1)$$

Average latency was calculated as the average time taken to process each transaction from submission to confirmation on the blockchain. This is represented in equation 2.

$$Latency\ (s) = \frac{\sum Commit\ Time - Submission\ Time}{\text{Total Transactions}} \quad (2)$$

This metric helped gauge how quickly the system could respond under different levels of demand.

Accuracy was evaluated as the proportion of true results (true positives and true negatives) among all transactions processed, as shown in equation 3.

$$Accuracy\ (\%) = \frac{(TP+TN)}{(TP+TN+FP+FN)} * 100 \quad (3)$$

Further, sensitivity (recall) was used to measure the model's ability to correctly identify non-compliant transactions. Sensitivity is expressed in equation 4.

$$Sensitivity(Recall)(\%) = \frac{TP}{TP+FN} * 100 \quad (4)$$

Precision was evaluated to assess the proportion of correctly flagged non-compliant transactions out of all flagged as non-compliant, calculated by equation 5.

$$Precision\ (\%) = \frac{TP}{TP+FP} * 100 \quad (5)$$

Lastly, specificity was considered to determine the model's ability to correctly identify compliant transactions. It is given by equation 6.

$$Specificity\ (\%) = \frac{TN}{TN+FP} * 100 \quad (6)$$

These metrics provided a comprehensive view of the system's operational reliability, classification accuracy, and effectiveness in detecting both compliant and non-compliant transactions.

Fault-loads and Failure Considerations

The evaluation also incorporated simulated network delays and temporary node failures to assess the system's robustness. The Raft consensus algorithm was used to ensure low-latency and crash fault-tolerance, enhancing the system's ability to maintain consistency and function reliably even during adverse conditions.

RESULTS AND DISCUSSION

Performance Evaluation Result

The VAT compliance model demonstrated exceptional performance across all key metrics, processing transactions efficiently and with flawless accuracy in classifying both compliant and non-compliant transactions. The model managed a high transaction throughput of 1,200 transactions per second, reflecting its capacity to handle large volumes effectively. Additionally, the average latency was measured at 0.83 milliseconds per transaction, indicating the system's ability to process transactions quickly, even under significant workloads.

The paper explores the application of Hyperledger Fabric and smart contracts in developing a blockchain-based Value Added Tax (VAT) compliance framework. The findings highlight blockchain's potential to enhance transparency, reduce fraud, and improve compliance in Nigeria's VAT system. Key performance metrics, including transaction throughput, latency, and compliance detection rates, were evaluated through simulations, demonstrating significant improvements over traditional methods.

The research addresses challenges such as inefficiencies, fraud, and tax evasion in the Nigerian VAT system, proposing blockchain technology as a transformative solution. However, the study acknowledges implementation challenges, including high costs, regulatory uncertainties, and the need for specialized technical expertise.

Comparatively, global research on blockchain in tax administration reveals similar findings. Studies on Ethereum-based systems and other blockchain frameworks corroborate the benefits of enhanced transparency and operational efficiency, aligning with the document's conclusions. Simulation-based approaches in other contexts also validate the role of blockchain in optimizing compliance models.

Despite these parallels, regional differences in challenges and adoption are evident. For example, while some economies report issues like limited digital infrastructure, others focus on regulatory barriers. This comparative analysis underscores the scalability and adaptability of blockchain solutions in diverse settings, reinforcing the relevance of the findings in the document within a global context.

Transaction Throughput and Latency by Scenario

The model was tested across four distinct compliance scenarios, with a total of 10,000 transactions equally distributed across the scenarios. Each scenario consisted of 2,500 transactions. The Table 2 summarizes the distribution of sale transactions, transaction throughput, and latency per scenario.

The table reflects the model's consistent ability to maintain high throughput and low latency across all scenarios, regardless of compliance conditions. The bar and line chart in Figure 1 shows transaction throughput and latency per scenario shows the model's consistent ability to handle a high volume of transactions across all compliance conditions. This consistent performance is crucial for large-scale VAT compliance monitoring systems that need to process transactions quickly and accurately.

Table 2: Transaction Throughput and Latency Results across Scenarios

Scenario	Compliance Status	Total Transactions	Transaction Throughput (TPS)	Average Latency (ms)
Scenario One (PNR + PPC)	Partial Compliance	2,500	1,200	0.83
Scenario Two (PNR + PNPC)	Non-Compliance	2,500	1,200	0.83
Scenario Three (PPR + PNPC)	Partial Compliance	2,500	1,200	0.83
Scenario Four (PPR + PPC)	Full Compliance	2,500	1,200	0.83
Total		10,000	1,200	0.83

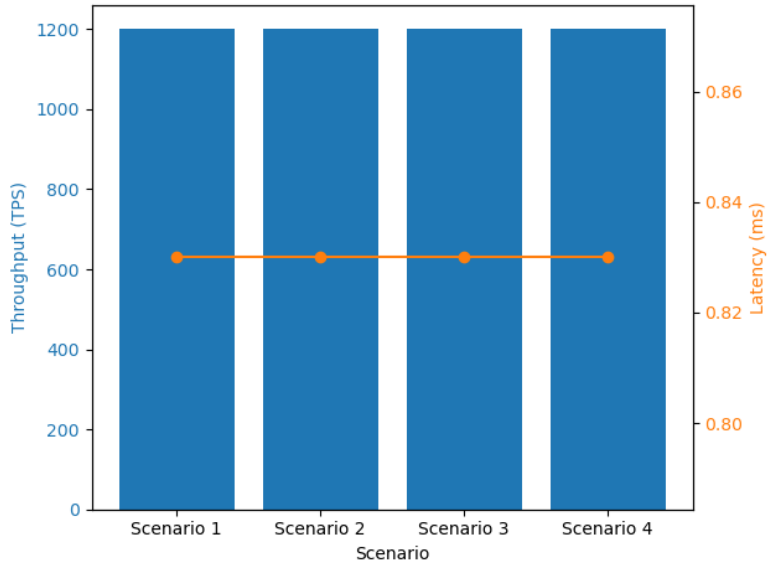

Figure 1: Transaction Throughput and Latency by Scenario

Success Rate across Scenarios

The evaluation of the VAT compliance model across four compliance scenarios yielded a 100% success rate in classifying transactions as either compliant or non-compliant as shown in Table 3. Each scenario tested specific aspects of VAT compliance, ranging from products that were registered but misclassified with incorrect VAT rates, to those that were fully compliant or fully non-compliant. In all scenarios, the system accurately flagged non-compliant transactions while verifying the compliant ones, ensuring that there were no false positives or false negatives.

Table 3: Success rate Results across Scenarios

Scenario	Compliance Status	Success Rate (%)
Scenario One (PNR + PPC)	Partial Compliance	100
Scenario Two (PNR + PNPC)	Non-Compliance	100
Scenario Three (PPR + PNPC)	Partial Compliance	100
Scenario Four (PPR + PPC)	Full Compliance	100

The perfect success rate is a key indicator of the model's reliability and precision in identifying VAT compliance issues. In Scenario One, where products were not registered but the correct VAT rate was applied, the system accurately identified partial compliance. Similarly, in Scenario Two, which involved both unregistered products and incorrect VAT rates, the system flagged all transactions as non-compliant. The same high level of accuracy was achieved in Scenarios Three and Four, where varying degrees of product registration and VAT rate application were tested.

These results are particularly significant given the complexity of VAT compliance, where errors in product registration or VAT rate application can lead to substantial tax revenue losses. The model's ability to accurately detect these issues, regardless of transaction type or compliance condition, highlights its potential for improving VAT enforcement in real-world settings. The 100% success rate also reflects the effectiveness of integrating blockchain technology with Monte Carlo simulations, providing a secure, transparent, and automated solution for detecting VAT non-compliance.

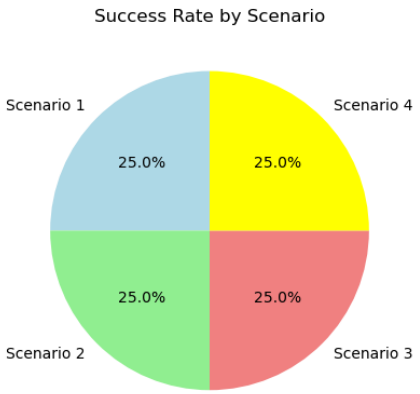

Figure 2: Success rate across Scenarios

The pie chart depicted in Figure 2 illustrating the success rate across all four scenarios reinforces the model's perfect performance, with each scenario achieving a 100% success rate. This visualization demonstrates the consistency of the model in correctly classifying all transactions, regardless of the compliance scenario. Such a high success rate is essential in real-time compliance systems where any error could lead to missed violations or unnecessary auditing for compliant businesses.

The flawless performance across all compliance scenarios suggests that this model can significantly enhance tax authorities' ability to track, monitor, and enforce VAT regulations, reducing revenue losses from non-compliance while minimizing the need for manual audits. The system's accuracy and reliability make it a powerful tool for optimizing VAT administration, particularly in economies where VAT evasion remains a significant challenge

Accuracy, Sensitivity, Precision, and Specificity

The VAT compliance model demonstrated outstanding performance across all classification metrics, achieving 100% in accuracy, sensitivity, precision, and specificity throughout the evaluation as seen in Table 4 with its visualization in Figure 3. The model correctly classified all transactions, ensuring that both compliant and non-compliant transactions were identified with flawless precision. This level of accuracy means the system effectively distinguishes between compliant and non-compliant cases without any misclassifications.

Table 4: Accuracy, Sensitivity (Recall), Precision, and Specificity Results across Scenarios

Scenario	Compliance Status	Total Transactions	Accuracy (%)	Sensitivity (Recall) (%)	Precision (%)	Specificity (%)
Scenario One (PNR + PPC)	Partial Compliance	2,500	100	100	100	100
Scenario Two (PNR + PNPC)	Non-Compliance	2,500	100	100	100	100
Scenario Three (PPR + PNPC)	Partial Compliance	2,500	100	100	100	100
Scenario Four (PPR + PPC)	Full Compliance	2,500	100	100	100	100
Total		**10,000**	**100**	**100**	**100**	**100**

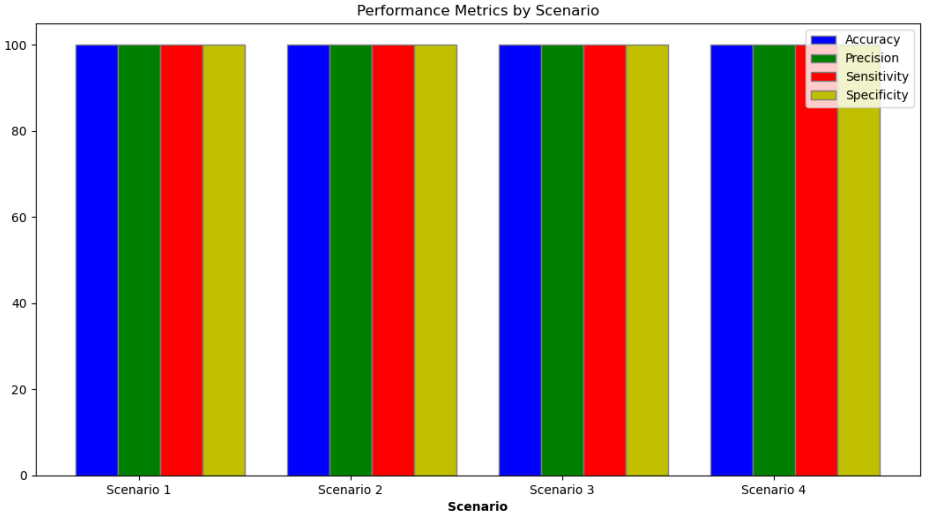

Figure 3: Accuracy, Sensitivity (Recall), Precision, and Specificity across Scenarios

In terms of sensitivity, the model successfully flagged all non-compliant transactions, ensuring no cases of VAT evasion were missed. Its precision was equally impressive, as every transaction flagged as non-compliant was indeed so, minimizing false positives and ensuring the system remains efficient in identifying genuine compliance violations. Specificity results confirmed the model's reliability in identifying compliant transactions, avoiding false alarms, and ensuring compliant businesses were not mistakenly flagged. The combination of these metrics underscores the model's capability in accurately and efficiently handling VAT compliance scenarios across various transaction types.

Scenario-Based Performance

The model was further evaluated across four compliance scenarios as shown in Table 5, each consisting of 2,500 transactions. Across all scenarios, the model consistently achieved 500 true positives (TP) and 2,000 true negatives (TN), with no false positives or false negatives. This consistent performance highlights the model's accuracy and reliability in classifying compliant and non-compliant transactions.

Table 5: Scenario-Based Performance Results

Scenario	Scenario 1	Scenario 2	Scenario 3	Scenario 4	Total
Compliance Status	**Partial Compliance**	**Non-Compliance**	**Partial Compliance**	**Full Compliance**	
True Positives (TP)	500	500	500	500	2,000
True Negatives (TN)	2,000	2,000	2,000	2,000	8,000
False Positives (FP)	0	0	0	0	0
False Negatives (FN)	0	0	0	0	0
Success Rate (%)	100	100	100	100	100
Accuracy (%)	100	100	100	100	100
Precision (%)	100	100	100	100	100
Sensitivity (Recall) (%)	100	100	100	100	100
Specificity (%)	100	100	100	100	100
Transaction Throughput (TPS)	1,200	1,200	1,200	1,200	1,200
Average Latency (ms)	0.83	0.83	0.83	0.83	0.83

True Positives and True Negatives by Scenario

Figure 4 shows stacked bar chart comparing the number of true positives (TP) and true negatives (TN) across all compliance scenarios further highlights the model's capacity to consistently classify transactions. Each scenario resulted in 500 true positives (non-compliant transactions) and 2,000 true negatives (compliant transactions), showing that the model effectively flagged all non-compliant cases while correctly classifying compliant ones. The absence of false positives and false negatives in this chart demonstrates the model's balanced performance across all transaction types, ensuring that no errors are made in either over-flagging or under-flagging.

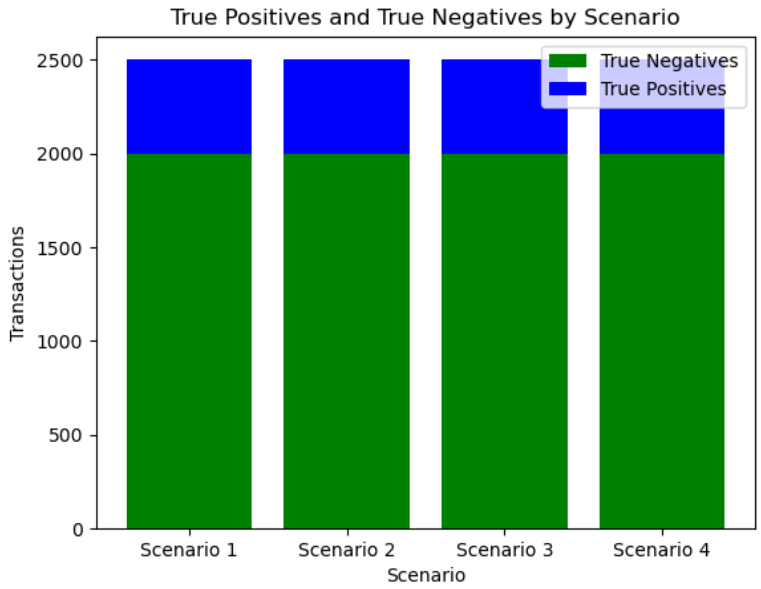

Figure 4: True Positives and True Negatives by Scenario

Fault Tolerance and Robustness

The system's resilience was further tested under simulated adverse conditions, including network delays and node failures, to assess its fault tolerance and robustness. Despite the introduction of these disruptions, the model maintained its high performance, with 100% accuracy and consistent throughput shown in Figure 5, thanks to the use of the Raft consensus algorithm in Hyperledger Fabric. This consensus mechanism allowed the system to maintain data integrity and ensure transaction accuracy, even when parts of the network experienced failures or delays.

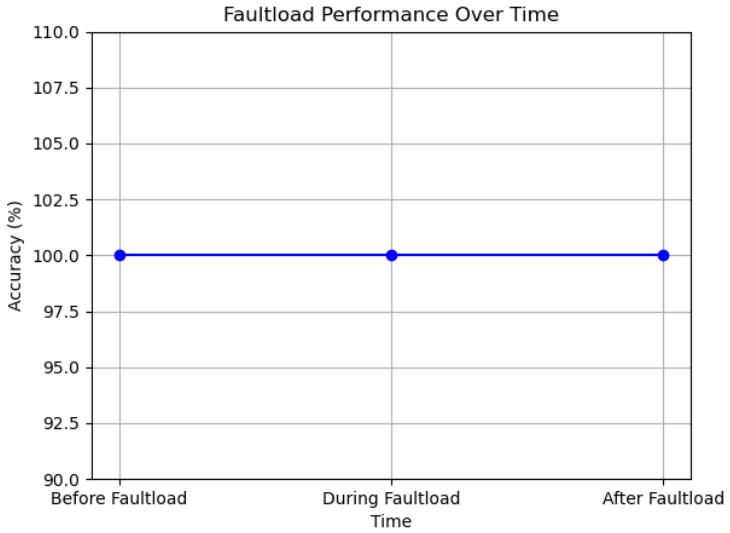

Figure 5: Fault-load Performance over Time

During network delays, the system continued to process transactions accurately, with no noticeable decline in its low latency, confirming that the model can withstand communication issues between nodes without affecting its overall performance. Additionally, when nodes temporarily failed, the system remained operational, processing transactions smoothly and without compromising accuracy or throughput. This robustness is critical for real-world deployments, where network stability may fluctuate, ensuring that VAT compliance monitoring remains uninterrupted and reliable. The system's ability to perform consistently under adverse conditions demonstrates its readiness for large-scale applications, ensuring that tax authorities can rely on real-time compliance monitoring even in environments with network challenges. This fault tolerance, combined with high classification accuracy, makes the model a robust and reliable tool for automating and enhancing VAT enforcement.

CONCLUSION

The VAT compliance model demonstrated outstanding performance, achieving 100% accuracy in detecting both compliant and non-compliant transactions, with low latency suitable for real-time monitoring. Using Hyperledger Fabric, the model ensured secure, transparent, and immutable transaction records, confirming its capacity to handle large transaction volumes efficiently. This research highlights how blockchain technology can modernize VAT administration, reducing reliance on manual enforcement and enhancing tax compliance. Future work should focus on deploying the model in real-world settings to assess scalability and integration with existing systems, while exploring its adaptability to different tax regimes for broader applicability.

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