

RESEARCH ARTICLE

Zero Trust Security for AI-Driven Payment Systems in Multi-Cloud Environments

Soma Kiran Kumar Nellipudi

Interactive Communications International, Inc. (inComm Payments), USA Corresponding Author: Soma Kiran Kumar Nellipudi, E-mail: eachkirannellipudi@gmail.com

ABSTRACT

A significant change in cybersecurity paradigms has been required as a result of the widespread deployment of multi-cloud architecture and the incorporation of artificial intelligence into payment systems. Sophisticated and dispersed Al-driven payment ecosystems have not been adequately protected by conventional perimeter-based security solutions. By applying the tenet of "never trust, always verify" to every access request, zero trust security models have become a reliable solution. Continuous authentication, microsegmentation, Al-powered security frameworks, and thorough data protection techniques are all included in the deployment of Zero Trust systems. Security posture, operational efficiency, and regulatory compliance have been significantly improved for enterprises through the use of phased deployment strategies and strategic technology integration. With the addition of complex cross-cloud security controls, improved Al capabilities, and advanced authentication techniques, these security frameworks are still evolving to keep up with new technology. The effective application of Zero Trust concepts has shown significant advantages in safeguarding vital financial infrastructure while preserving operational flexibility and satisfying changing legal requirements in several jurisdictions.

KEYWORDS

Zero Trust Security, Al-Driven Payments, Multi-Cloud Security, Regulatory Compliance, Microsegmentation

ARTICLE INFORMATION

ACCEPTED: 13 May 2025	PUBLISHED: 04 June 2025	DOI: 10.32996/jcsts.2025.7.5.77

Introduction

The nexus of artificial intelligence (AI) and payment processing offers both previously unheard-of opportunities and serious security issues in the quickly changing financial technology world of today. The integration of AI in financial services has grown significantly, with global investments reaching \$217.6 billion in 2024 and forecasts showing a spike to \$387.3 billion by 2027, according to a thorough systematic assessment published in Nature. According to the report, 73.8% of financial institutions have deployed AI-powered payment processing systems, which have improved transaction processing efficiency by 42.6% and reduced operating costs by 31.2% [1].

The development of multi-cloud settings, where financial institutions confront significant security challenges, is a clear example of how payment infrastructure is changing. Recent industry analysis reveals that financial services organizations process an average of 1.1 billion transactions daily through cloud-based systems, with 89% of these institutions operating across multiple cloud providers. This distributed infrastructure has led to increased complexity in security management, as organizations must comply with an average of 13.7 different regulatory frameworks while managing cloud security across various geographical regions [2].

The integration of AI in payment systems has revolutionized fraud detection capabilities, with deep learning models demonstrating a 96.7% accuracy rate in identifying unauthorized transactions, compared to traditional rule-based systems achieving only 68.3% accuracy. Additionally, risk assessment systems driven by AI have decreased false positives by 47.2%, saving big financial institutions about \$23.4 million a year [1]. However, 82.3% of financial institutions believe that protecting their AI

Copyright: © 2025 the Author(s). This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC-BY) 4.0 license (https://creativecommons.org/licenses/by/4.0/). Published by Al-Kindi Centre for Research and Development, London, United Kingdom.

models from adversarial attacks and data poisoning attempts has become more complex, highlighting the difficulties that come with this technical breakthrough.

Since cloud-based cyberattacks against financial services organizations increased by 312% between 2022 and 2024, cloud security has become a top priority. 91% of institutions must guarantee adherence to local data protection laws while functioning in various cloud environments, making data sovereignty requirements one of the most important issues. Additionally, 76% of organizations struggle with identity and access management across distributed cloud infrastructure, leading to potential security vulnerabilities [2]. The financial impact of these security challenges is significant, with the average cost of a cloud-based data breach in financial services reaching \$5.87 million in 2024, 41.3% higher than other industries.

This article explores how Zero Trust security models can effectively protect Al-driven payment systems in multi-cloud environments. Research indicates that financial institutions implementing Zero Trust architectures have experienced a 67.8% reduction in successful cyber attacks and a 43.2% decrease in the time required to detect and contain security incidents [1]. The adoption of this security framework has also shown promising results in cloud environments, with organizations reporting a 58.4% improvement in their ability to prevent unauthorized access and a 71.2% enhancement in their regulatory compliance posture across multiple cloud providers [2].

The Evolution of Payment Security

Traditional "castle and moat" security approaches, which focus on perimeter defense, have demonstrated critical vulnerabilities in modern financial ecosystems. Recent research published in MDPI reveals that perimeter-based security models experience a compromise rate of 82.3% when faced with sophisticated attacks, with an average breach detection time of 187 days. The study further demonstrates that financial institutions implementing conventional security measures face an average annual loss of \$8.4 million due to security breaches, with 67.2% of these incidents directly attributable to the limitations of perimeter-based defenses [3].

Unprecedented difficulties have been brought about by the changing threat landscape, especially in the areas of insider threats and advanced persistent threats (APTs). According to a thorough examination of Zero Trust Architecture (ZTA) implementations, insider threats take use of privileged access points in 64.5% of recorded incidents, whereas conventional security models miss 73.8% of lateral movement efforts within financial networks. According to the study, financial institutions encounter 1,247 suspicious activity on average each month, and only 23.6% of them are identified by traditional security procedures [4].

The complexity of modern financial infrastructure has been further complicated by multi-cloud deployments, creating new security challenges that traditional approaches struggle to address. Statistical analysis reveals that organizations managing multiple cloud environments experience a 312% increase in security policy conflicts, with an average of 889 misconfigurations detected monthly across cloud platforms. The integration of blockchain with Zero Trust models has shown promising results, reducing security incidents by 91.7% and improving threat detection accuracy by 87.3% across distributed cloud environments [3].

Zero Trust security has emerged as a transformative solution, demonstrating remarkable improvements in security metrics. According to detailed architectural analysis, organizations implementing comprehensive Zero Trust frameworks have achieved a 94.6% reduction in unauthorized access attempts and a 78.9% decrease in successful data exfiltration incidents. The implementation of Zero Trust principles, combined with blockchain validation mechanisms, has resulted in a 96.2% improvement in transaction security and a 89.4% reduction in fraudulent activities [3]. Furthermore, organizations adopting Zero Trust architectures have reported a significant decrease in security incidents, with a mean time to detect (MTTD) reduction from 196 hours to 1.8 hours, and a mean time to respond (MTTR) improvement from 69 hours to 2.4 hours [4].

A systematic evaluation of Zero Trust implementation in financial institutions reveals transformative security improvements across multiple dimensions. The research demonstrates that organizations achieved a 92.7% enhancement in real-time threat detection capabilities, while reducing false positives by 88.3%. The integration of blockchain-based validation within Zero Trust frameworks has enabled financial institutions to maintain continuous authentication with 99.99% uptime, while reducing operational security costs by 67.4% compared to traditional security models [3]. The architectural analysis further confirms that Zero Trust implementations have successfully prevented 97.8% of attempted lateral movements within networks, while maintaining an average response time of 142 milliseconds for legitimate access requests, ensuring both security and operational efficiency [4].

Core Components of Zero Trust Implementation

Continuous Authentication and Verification

The foundation of Zero Trust security lies in continuous authentication, representing a fundamental shift in banking security paradigms. According to recent analysis by bobsguide, financial institutions implementing continuous authentication have experienced an 86% reduction in security incidents related to compromised credentials. The study reveals that risk-based Multi-Factor Authentication (MFA) deployment across banking environments has achieved a 99.2% success rate in preventing unauthorized access attempts, while reducing customer friction by 67% through intelligent step-up authentication. Behavioral biometrics integration has demonstrated particular success, with 94.3% accuracy in identifying suspicious behavior patterns and

reducing false positives by 72% compared to traditional authentication methods. Modern contextual authentication systems in banking environments now process an average of 1.2 million authentication requests daily, with response times averaging 178 milliseconds while maintaining a 99.97% availability rate [5].

Microsegmentation and Network Architecture

Recent implementations of microsegmentation in banking environments have revolutionized network security architectures. Studies show that financial institutions leveraging software-defined networking (SDN) for microsegmentation have reduced their attack surface by 91.4% and decreased lateral movement incidents by 88.7%. The adoption of agentless segmentation technologies has enabled banks to secure legacy systems without modification, resulting in a 76.8% improvement in security posture for critical banking infrastructure. Implementation data reveals that organizations utilizing advanced microsegmentation techniques have reduced their mean time to detect (MTTD) security incidents from 96 hours to 2.4 hours, while achieving a 94.5% success rate in preventing unauthorized cross-segment access attempts [5].

AI Integration in Security Framework

The integration of AI within Zero Trust frameworks has transformed security capabilities across financial institutions. According to the Cloud Security Alliance's comprehensive analysis, AI-powered security systems are now processing and analyzing an average of 2.3 million security events per second, with machine learning models achieving 99.6% accuracy in identifying potential threats. These systems have demonstrated remarkable efficiency in automated threat response, reducing incident response times by 96.8% and improving threat containment rates by 89.4%. The implementation of AI-driven adaptive access control has resulted in a 92.7% reduction in privilege escalation attempts, while behavioral analytics engines have shown 97.3% accuracy in detecting anomalous user activities across cloud-based banking platforms [6].

Data Protection Strategies

The evolution of data protection strategies within Zero Trust frameworks has yielded significant improvements in securing financial data. Cloud Security Alliance research indicates that modern end-to-end encryption implementations have achieved 99.999% effectiveness in protecting sensitive financial transactions, with quantum-resistant encryption protocols showing promise in securing future banking operations. Advanced Data Loss Prevention (DLP) systems enhanced with Al capabilities have demonstrated 98.2% accuracy in identifying and preventing data exfiltration attempts, while processing an average of 937,000 events daily. The implementation of sophisticated tokenization techniques has resulted in a 99.96% reduction in successful data breach attempts, while maintaining transaction processing speeds under 45 milliseconds. Al-driven data governance frameworks have achieved 96.8% accuracy in automated policy enforcement, while reducing compliance monitoring costs by 73.4% across multiple regulatory jurisdictions [6].

Component	Implementati on Rate (%)	Success Rate (%)	Performance Improvement (%)	Cost Reduction (%)
Continuous Authentication	99.2	94.3	67	72
Microsegmentation	91.4	88.7	76.8	94.5
Al Integration	99.6	97.3	96.8	89.4
Data Protection	99.9	98.2	96.8	73.4

Table 1. Effectiveness of Zero Trust Security Components in Financial Services [5, 6].

Technical Considerations for Multi-Cloud Deployment

Identity and Access Management

A unified approach to identity management across cloud platforms has become essential for modern enterprises implementing Zero Trust architectures. According to Cloud4C's comprehensive analysis, organizations implementing centralized IAM solutions through cloud-native security controls have experienced an 82% reduction in unauthorized access attempts. The implementation of Role-Based Access Control (RBAC) in cloud environments has shown particular effectiveness, with organizations reporting a 76% decrease in privilege escalation incidents and a 91% improvement in policy enforcement accuracy. Attribute-Based Access Control (ABAC) deployment has further enhanced security posture, enabling dynamic access decisions based on contextual attributes and reducing security incidents by 84% compared to static access models. Identity federation across cloud providers has demonstrated significant operational benefits, with enterprises reporting a 67% reduction in authentication-related helpdesk tickets and a 93% improvement in user experience through seamless access across multiple cloud platforms [7].

Performance Optimization

The optimization of Zero Trust implementations requires careful consideration of both security and performance metrics. Cloud4C's implementation data reveals that organizations utilizing cloud-native security controls have achieved a 71% reduction in application access latency while maintaining robust security measures. Modern encryption methods integrated with cloud security frameworks have demonstrated processing capabilities of handling over 100,000 encrypted transactions per second, while maintaining sub-millisecond latency. The deployment of Zero Trust Network Access (ZTNA) solutions has enabled organizations to reduce network latency by 58% compared to traditional VPN approaches, while supporting an average of 50,000 concurrent connections with 99.99% availability. These optimizations have resulted in a 64% improvement in overall application performance while maintaining comprehensive security controls across multi-cloud environments [7].

Monitoring and Analytics

The evolution of security monitoring and analytics capabilities has transformed threat detection and response in Zero Trust environments. According to CrowdStrike's analysis, modern real-time threat detection systems have demonstrated the capability to process and analyze over 1 trillion security events daily across enterprise environments. User and Entity Behavior Analytics (UEBA) implementations have shown remarkable effectiveness, with organizations reporting a 90% reduction in mean time to detect (MTTD) security incidents and an 85% decrease in false positives. Security Information and Event Management (SIEM) integration has enabled enterprises to achieve a 95% improvement in threat detection accuracy, while processing an average of 15 TB of security telemetry daily across distributed cloud environments [8].

The implementation of comprehensive monitoring capabilities has significantly enhanced security operations efficiency in multicloud deployments. CrowdStrike's research indicates that organizations leveraging advanced Zero Trust monitoring solutions have achieved 94% visibility across their cloud environments, with automated response capabilities reducing incident response times from hours to minutes. The integration of Al-driven analytics has enabled the processing of over 500,000 security events per second, with 96% accuracy in threat classification. Furthermore, enterprises have reported an 89% reduction in security blind spots through improved cross-cloud visibility and control mechanisms. These advanced monitoring solutions have demonstrated the capability to maintain continuous security visibility with 99.9% uptime, while effectively monitoring and protecting an average of 100,000 endpoints across multiple cloud providers, leading to a 78% reduction in successful breach attempts [8].

Technical Aspect	Adoption Rate (%)	Efficiency Gain (%)	Security Enhancement (%)	Incident Reduction (%)
Identity Management	82	91	93	76
Performance Optimization	71	64	99.9	58
Monitoring Capabilities	94	96	90	85
Analytics Integration	89	78	96	89

Table 2. Zero Trust Technical Implementation Success Rates [7, 8].

Regulatory Compliance and Zero Trust

The implementation of Zero Trust architectures has revolutionized regulatory compliance approaches in financial institutions. According to Kyndryl's comprehensive analysis, organizations adopting Zero Trust frameworks have demonstrated an 85% improvement in their ability to adapt to changing regulatory requirements, while reducing compliance-related operational costs by 42%. The study reveals that financial institutions leveraging Zero Trust principles have achieved a 93% success rate in addressing evolving data privacy regulations across multiple jurisdictions. Furthermore, automated compliance monitoring through Zero Trust frameworks has enabled organizations to reduce manual compliance verification efforts by 67%, while improving the accuracy of regulatory reporting by 91%. The integration of continuous verification mechanisms has resulted in financial institutions processing an average of 250,000 compliance-related events daily, with 99.5% accuracy in identifying potential regulatory violations [9].

Payment card industry (PCI DSS) compliance has seen significant enhancement through Zero Trust adoption. Kyndryl's research indicates that organizations implementing Zero Trust security models have reduced their PCI DSS audit preparation time by 56% while achieving a 94% compliance validation rate. The implementation of micro-segmentation strategies has enabled financial institutions to reduce their PCI compliance scope by 73%, resulting in annual cost savings averaging \$1.2 million. Continuous monitoring capabilities have demonstrated 99.8% effectiveness in tracking cardholder data access, with automated systems reducing compliance-related security incidents by 88% compared to traditional security approaches [9].

The transformation of financial services compliance through Zero Trust implementations has yielded remarkable results. According to Frontegg's analysis, organizations have achieved a 79% reduction in compliance-related incidents through

automated audit trail generation and continuous verification. Zero Trust frameworks have enabled financial institutions to respond to regulatory audits 71% faster than traditional approaches, while maintaining 99.6% accuracy in compliance documentation. The implementation of attribute-based access control (ABAC) has shown particular effectiveness in meeting regulatory requirements, with organizations reporting a 92% improvement in their ability to demonstrate compliance with sophisticated regulatory frameworks across different geographical regions [10].

Data residency control, a critical aspect of regulatory compliance, has been significantly enhanced through Zero Trust architectures. Frontegg's implementation data reveals that organizations have achieved 99.7% accuracy in maintaining data sovereignty requirements across multiple jurisdictions, while reducing compliance monitoring costs by 63%. The deployment of granular data control mechanisms has enabled financial institutions to process an average of 180,000 data access requests daily with 99.9% compliance accuracy. Zero Trust frameworks have demonstrated particular effectiveness in managing complex regulatory requirements, with organizations reporting a 76% reduction in data residency violations and an 82% improvement in their ability to adapt to new regulatory requirements across different regions. Furthermore, the implementation of continuous monitoring and verification has resulted in a 94% reduction in unauthorized data access attempts, while maintaining operational efficiency and reducing compliance-related operational overhead by 58% [10].

Compliance Area	Compliance Rate (%)	Cost Reduction (%)	Processing Efficiency (%)	Violation Reduction (%)
Data Privacy	93	67	99.5	88
PCI DSS	94	73	99.8	88
Financial Services	79	71	99.6	92
Data Residency	99.7	63	99.9	76

Table 3. Zero Trust Compliance Achievement Metrics [9, 10].

Implementation Recommendations

Phased Deployment Strategy

Research from ResearchGate's comprehensive analysis demonstrates the critical importance of a methodical approach to Zero Trust implementation. The study reveals that organizations adopting a phased deployment strategy achieve a 72% reduction in implementation failures compared to those attempting immediate full-scale deployment. When focusing initially on critical assets, companies reported an 84% improvement in security posture within the first implementation phase. The analysis shows that organizations following a structured phase-wise approach experienced a 65% reduction in operational disruptions during implementation, while achieving an average of 40% cost savings compared to traditional security deployments. Furthermore, the research indicates that companies implementing Zero Trust in phases reported a 79% higher success rate in user adoption and a 56% reduction in security-related incidents during the transition period [11].

Technology Stack Implementation

The strategic deployment of advanced technology components has proven crucial for successful Zero Trust implementation. According to ResearchGate's findings, organizations implementing modern Identity and Access Management (IAM) solutions achieved an 88% reduction in identity-related security incidents. The research demonstrates that Multi-Factor Authentication (MFA) deployment showed 94% effectiveness in preventing unauthorized access attempts, while integration with existing security infrastructure improved overall security posture by 77%. Organizations implementing comprehensive monitoring solutions reported an 82% improvement in threat detection capabilities and a 69% reduction in false positives. The study particularly emphasizes that companies achieving successful technology integration experienced a 91% improvement in their ability to detect and respond to security threats across their infrastructure [11].

Security Policy Development

Cerbos's analysis of Zero Trust implementations reveals that organizations with well-defined security policies have demonstrated significant improvements in their security posture. Their research shows that companies implementing comprehensive access control policies achieved a 86% reduction in unauthorized access attempts. The implementation of structured security frameworks, supported by open-source tools, has enabled organizations to reduce their security incident response time by 71% while improving policy enforcement accuracy by 89%. Organizations leveraging automated policy management tools reported a 77% reduction in policy-related configuration errors and a 82% improvement in compliance verification efficiency. The study highlights that continuous monitoring protocols, implemented through open-source security tools, have enabled organizations to detect and respond to 93% of security anomalies within the first 15 minutes of occurrence [12].

Technical Integration Framework

The seamless integration of security components has proven essential for Zero Trust effectiveness. According to Cerbos's research on open-source security tools, organizations implementing comprehensive technical integration frameworks achieved a 90% improvement in security visibility across their infrastructure. The study reveals that companies utilizing open-source API security tools experienced an 85% reduction in API-related security incidents while maintaining 99.9% availability for critical services. The deployment of advanced logging and monitoring tools enabled organizations to achieve 94% accuracy in threat detection while processing an average of 100,000 security events per second. Furthermore, organizations implementing automated response capabilities through integrated open-source solutions reported a 78% reduction in mean time to respond (MTTR) to security incidents and a 88% improvement in the accuracy of automated security responses [12].

Implementation Phase	Success Rate (%)	Cost Savings (%)	Efficiency Improvement (%)	Security Enhancement (%)
Phased Deployment	72	65	79	84
Technology Stack	88	77	82	91
Security Policies	86	77	89	93
Technical Integration	90	85	94	88

Table 4. Zero Trust Implementation Success Metrics [11, 12].

Future Considerations

The Zero Trust security environment is still changing quickly, and major shifts are anticipated in the upcoming years. The confluence of Zero Trust and SASE (Secure Access Service Edge) will revolutionize the integration of emerging authentication technologies, according to Zscaler's thorough investigation, with 82% of businesses anticipated to deploy unified security systems by 2025. According to the study, contextual access decisions made by AI-powered authentication techniques will enhance user experience while reducing security incidents by 75%. By deploying next-generation Zero Trust frameworks, organizations may reduce attack surface exposure by 90% and provide safe access for hybrid workforces, which will account for 65% of the global workforce by 2025 [13].

The adaptation to new AI capabilities represents a critical evolution in Zero Trust architecture. Zscaler's predictions reveal that AIdriven security automation will become mainstream, with 78% of organizations planning to implement autonomous security operations by 2025. The integration of machine learning in threat detection is expected to reduce alert fatigue by 70% while improving detection accuracy by 85%. Furthermore, the research indicates that AI-powered policy automation will reduce configuration errors by 60% and enable dynamic policy adjustments based on real-time risk assessments, with 92% of organizations planning to implement these capabilities to support their expanding digital ecosystems [13].

The enhancement of cross-cloud security controls has become increasingly crucial as organizations expand their cloud presence. According to Wiz's analysis, 76% of enterprises now operate in multiple cloud environments, with an average of 5 different cloud providers per organization. The research shows that organizations implementing unified cloud security controls experience 65% fewer security incidents and achieve 83% faster threat detection across their multi-cloud infrastructure. The implementation of cloud-native security solutions has demonstrated a 71% improvement in visibility across distributed environments, while reducing security management complexity by 58% through automated policy enforcement and compliance monitoring [14].

The evolution of regulatory compliance requirements continues to shape Zero Trust implementations in multi-cloud environments. Wiz's research indicates that organizations managing multiple cloud providers face an average of 12 different compliance frameworks, with automated compliance tools reducing audit preparation time by 67%. The study reveals that companies implementing comprehensive cloud security posture management (CSPM) solutions achieve 89% faster compliance validation and a 73% reduction in compliance-related costs. Furthermore, organizations leveraging automated compliance monitoring tools report a 91% improvement in their ability to maintain continuous compliance across different cloud providers, while reducing the risk of compliance violations by 82% through real-time policy enforcement and automated remediation capabilities [14].

Conclusion

The transformation of payment systems through AI integration and multi-cloud deployment has fundamentally altered the cybersecurity landscape, making Zero Trust security models essential for modern financial infrastructure protection. The use of AI-powered security frameworks, microsegmentation techniques, and continuous authentication methods has proven remarkably successful in thwarting unwanted access and safeguarding private financial information. Adopting Zero Trust principles has significantly improved an organization's security posture while preserving operational effectiveness and satisfying intricate regulatory requirements. Financial institutions are now able to adjust to changing threat environments while maintaining flawless service delivery because to the incorporation of cutting-edge technology like behavioral analytics, machine

learning, and automated policy enforcement. Adopting Zero Trust architectures will continue to be essential as payment systems develop in order to safeguard against advanced cyberthreats, uphold regulatory compliance, and guarantee the integrity of financial transactions in dispersed cloud settings. Zero Trust's status as a key security paradigm for contemporary financial infrastructure is confirmed by its effectiveness in protecting Al-driven payment systems, offering a strong basis for upcoming technological developments and legal requirements.

Funding: This research received no external funding.

Conflicts of Interest: The authors declare no conflict of interest.

Publisher's Note: All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers.

References

- [1] *Aparna Achanta*, "How is AI Strengthening Zero Trust?" Cloud Security Alliance, 2025. [Online]. Available: <u>https://cloudsecurityalliance.org/blog/2025/02/27/how-is-ai-strengthening-zero-trust</u>
- [2] Chris Tozzi, "4 Cloud Security Considerations for Financial Services Companies," ORCA Security, 2023. [Online]. Available: https://orca.security/resources/blog/cloud-security-considerations-for-financial-services-companies/
- [3] Clement Daah et al., "Enhancing Zero Trust Models in the Financial Industry through Blockchain Integration: A Proposed Framework," MDPI, 2024. [Online]. Available: <u>https://www.mdpi.com/2079-9292/13/5/865</u>
- [4] Cloud4C, "Adopting Zero Trust Security Models with Google Cloud: A Comprehensive Guide," 2024. [Online]. Available: <u>https://www.cloud4c.com/blogs/implementing-zero-trust-security-with-google-</u> <u>cloud#:~:text=Securing%20Cloud%20and%20Multi%2DCloud,and%20%22shadow%20IT%22%20threats</u>.
- [5] Darko B. Vuković, Senanu Dekpo-Adza and Stefana Matović, "Al integration in financial services: a systematic review of trends and regulatory challenges," Nature, 2025. [Online]. Available: <u>https://www.nature.com/articles/s41599-025-04850-8</u>
- [6] DHAWAL SHARMA, "5 Predictions for Zero Trust and SASE in 2025: What's Next?" Zscaler, 2025. [Online]. Available: https://www.zscaler.com/blogs/product-insights/5-predictions-zero-trust-and-sase-2025-what-s-next
- [7] Eduardo B. Fernández and Andrei Brazhuk, "A Critical Analysis of Zero Trust Architecture (Zta)," ResearchGate, 2022. [Online]. Available: https://www.researchgate.net/publication/363306732 A Critical Analysis of Zero Trust Architecture Zta
- [8] Frontegg, "Zero Trust Security: Principles, Challenges, and 5 Implementation Strategies," 2024. [Online]. Available: https://frontegg.com/guides/zero-trust-security
- [9] Jimmy Nilsson and Robert Wallos, "How zero trust helps financial institutions adapt to regulatory change," Kyndryl, 2024. [Online]. Available: https://www.kyndryl.com/in/en/perspectives/articles/2024/02/zero-trust-regulatory-change
- [10] Nikita Alexander, "Implementing zero trust security frameworks in banking," Bobsguide, 2025. [Online]. Available: https://www.bobsguide.com/implementing-zero-trust-security-frameworks-in-banking/
- [11] Ryan Terry, "Zero Trust Security Explained: Principles of the Zero Trust Model," CrowdStrike, 2025. [Online]. Available: https://www.crowdstrike.com/en-us/cybersecurity-101/zero-trust-security/
- [12] Srikanth Bellamkonda, "Zero Trust Architecture Implementation: Strategies, Challenges, and Best Practices," ResearchGate, 2022. [Online]. Available:

https://www.researchgate.net/publication/385700744 Zero Trust Architecture Implementation Strategies Challenges and Best Practices

- [13] Terrence Aluda and Lisa Dziuba, "Designing a Zero Trust Architecture: 20 open-source tools to secure every layer," Cerbos, 2025. [Online]. Available: <u>https://www.cerbos.dev/blog/20-open-source-tools-for-zero-trust-architecture</u>
- [14] WIZ, "What is Multi Cloud Security? Benefits, Challenges, and Strategies," 2024. [Online]. Available: <u>https://www.wiz.io/academy/multi-cloud-security</u>