A SMART ZERO TRUST SECURITY FRAMEWORK FOR COMBATING AI-DRIVEN CYBERATTACKS IN FINANCIAL INSTITUTIONS

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A THESIS SUBMITTED TO THE SCHOOL OF POSTGRADUATE STUDIES IN PARTIAL FULFILMENT OF THE REQUIREMENTS FOR THE AWARD OF DOCTOR OF PHILOSOPHY (Ph.D) DEGREE IN COMPUTER SCIENCE, DEPARTMENT OF COMPUTER AND INFORMATION SCIENCES, COLLEGE OF SCIENCE AND TECHNOLOGY, COVENANT UNIVERSITY, OTA, OGUN STATE, NIGERIA

JUNE, 2023

ACCEPTANCE

This is to attest that this thesis is accepted in partial fulfilment of the requirements for the award of the degree of Doctor of Philosophy in Computer Science in the Department of Computer and Information Sciences, College of Science and Technology, Covenant University, Ota, Ogun State, Nigeria.

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DECLARATION

I, GUEMBE, BLESSING (17PCG01640), hereby declare that this research was carried out by me under the supervision of Prof. Ambrose A. Azeta of the Department of Computer and Information Sciences, Covenant University, Ota and Prof. Victor C. Osamor of the Department of Computer and Information Sciences, Covenant University, Ota. I attest that the thesis has not been presented either wholly or partly for the award of any degree elsewhere. All sources of data and scholarly information used in this thesis are duly acknowledged.

GUEMBE, BLESSING

Signature and Date

CERTIFICATION

This is to certify that the research work titled "**A SMART ZERO TRUST SECURITY FRAMEWORK FOR COMBATING AI-DRIVEN CYBERATTACKS IN FINANCIAL INSTITUTIONS**" is an original research work carried out by **GUEMBE, BLESSING (17PCG01640)**, in the Department of Computer and Information Sciences, Covenant University, Ota, Ogun State, Nigeria, under the supervision of Prof. Ambrose A. Azeta and Prof. Victor C. Osamor. We have examined and found the work acceptable for its contribution to knowledge and literary presentation.

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DEDICATION

I dedicate this thesis to my Heavenly Father, who is the source of my wisdom and strength, and in whom I place my hope for supply. I also dedicate it to my mum Mrs. Comfort Guembe and my entire Family.

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LIST OF ABBREVIATIONS

AI	Artificial Intelligence
BYOD	Bring Your Own Device
C2	Command and Control
CBN	Central Bank of Nigeria
CISO	Chief Information Security Officer
CNN	Convolutional Neural Network
CVSS	Common Vulnerability Scoring System
DA	Document Analysis
DDoS	Denial of Service Attack
DevOpsSec	Development, Operations and Security
DL	Deep Learning
DMBs	Deposit Money Banks
DNN	Deep Neural Network
DRS	DDoS Resiliency Score
DT	Decision Tree
EDA	Exploratory Data Analysis
GAM	General Addictive Model
GAN	Generative Adversarial Networks
GBRT	Gradient Boosted Regression Trees
IDSs	Intrusion Detection Systems
KNN	K-nearest Neighbor
LR	Logistic Regression
LSTM	Long Short-term Memory
ML	Machine Learning
MP	Matching Pursuit
NIBSS	Nigeria Inter-Bank System
NNs	Neural Networks
PA	Policy Administrator
PDP	Policy Decision Point
PE	Policy Engine
PEP	Policy Enforcement Point
PSPs	Payment Service Providers

RF	Random Forest
RNNs	Recurrent Neural Networks
SA	Systolic Addressing
SVM	Support Vector Machine
TA	Trust Algorithm
UCA	Use Case Analysis
URLs	Uniform Resource Locators
VA	Voice Assistance
VM	Virtual Machine
XAI	Explainable Artificial Intelligence
XSec	Explainable Security
ZT	Zero Trust
ZTA	Zero Trust Security Architecture
ZTS	Zero Trust Security

ABSTRACT

Cybercriminals are currently weaponising Artificial Intelligence (AI) to execute convoluted cyberattacks. This new type of cyberattack is known as an AI-driven attack. AI-driven attack incorporates AI into conventional cyberattack tools to elude detection and inflict more damage. Few studies have demonstrated the effectiveness of zero trust security frameworks and AI approaches in combating sophisticated cyberattacks. However, the existing approaches are prone to data poisoning, model weight attack, and data leakage. This study proposed a Smart zero trust security framework for combating AI-driven attacks in financial institutions to address the gaps in the existing approaches. To achieve this, the study investigated the Central Bank of Nigeria risk-based cybersecurity framework to examine the use-case, stakeholders responsibilities, and reusable concepts. The study designed a DevOpsSec technique to distribute security across the development phase. A systolic addressing approach was implemented to ensure continuous threat hunting. The Federated Artificial Intelligence Technology Enabler Framework was adopted to create virtual banks and a central server. The virtual banks collaborate to train the model under the supervision of the central server without exposing their data to others. The Gradient Boosting Decision Tree and SecureBoost techniques were used to train the model. At the same time, the model-agnostic post-hoc explainer was used to explain essential features that influence the model decision. The proposed model was trained on the Zeek and Intelligent Security Group Dataset and the Nigerian Banks dataset. The systolic addressing was simulated in a network lab environment. The implemented model was evaluated with standard machine learning evaluation metrics and benchmarked with state-of-art approaches. The result shows that the implemented model achieved the best performance, with 99.81% and 99.99% prediction accuracy, 100% precision, recall and F1-score for the binary classification on the Zeek and Intelligent Security Group Dataset and Nigerian Banks Dataset. The systolic addressing was able to detect malicious patterns in 56.14 seconds. The model agnostic post-hoc explainer reveals that the "flow_duration_milliseconds" positively impacts detecting AI-driven attacks, while the packet sent has a decreasing effect. The model was also evaluated with the ISO/IEC 27000:2018 cybersecurity vulnerability assessment techniques such as the Common Vulnerability Scoring System and DDoS Resiliency Score. The model achieved a Common Vulnerability Score of 3.15 and a DDoS Resiliency Score of 7.0. This implies that the model is capable of withstanding multiple variant attacks. The result suggests that the model can efficiently be incorporated into the existing zero trust security policy engine to enhance protection.

Keywords: AI-Driven Cyberattack, Cybersecurity, DevOpsSec, Zero trust