Studies in Computational Intelligence 1025

Mohiuddin Ahmed ·
Sheikh Rabiul Islam ·
Adnan Anwar · Nour Moustafa ·
Al-Sakib Khan Pathan *Editors* 

# Explainable Artificial Intelligence for Cyber Security

**Next Generation Artificial Intelligence** 



# **Studies in Computational Intelligence**

Volume 1025

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# Explainable Artificial Intelligence for Cyber Security

Next Generation Artificial Intelligence



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Dedicated to

My Loving Son: Zaif Rayan

—Mohiuddin Ahmed

My studious daughter: Farisha Islam

—Sheikh Rabiul Islam

My devoted family

—Adnan Anwar

My family

—Nour Moustafa

My family

—Al-Sakib Khan Pathan

### **Preface**

Cyber security is a very complex and diverse discipline. Numerous technological problems need to be solved to make the world safer. It is evident that there is no sign of a decrease in cyber-crime; instead, it is the opposite in nature due to the unprecedented technological advancement and our reliance on it. The cyber security community has been leveraging artificial intelligence (AI) technology to solve several complex computing problems, e.g., intrusion detection systems to identify malicious network activities. In the past two decades, there have been hundreds of algorithms developed capitalizing on the effectiveness of artificial intelligence. Therefore, we have observed the transition from classical artificial intelligence to deep learning, federated learning, reinforcement learning, etc. These techniques have been critical in providing solutions for cyber security problems. However, most recent variants of artificial intelligence-based methods are being treated as black-box ones. There is a lack of explanation that humans can easily understand the solution(s) offered. For example, a particular neural network that is perfect for identifying phishing attacks (i.e., the deception using email) is still obscure due to its complex internal working mechanism. Hence, it is important to explore various avenues of explainable artificial intelligence (XAI), an emerging area of artificial intelligence, to provide a human-friendly decision for cyber security from a broader perspective.

In this context, this book addresses the challenges associated with the explainable artificial intelligence for cyber security by providing a bigger picture of the core concepts, intelligent techniques, practices, and open research directions in this area. Additionally, the book will serve as a single source of reference for acquiring knowledge on the technology, process, and people involved in the next-generation artificial intelligence and cyber security.

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### **Chapters**

Chapter 1: The Past, Present, and Prospective Future of XAI: A Comprehensive Review

Chapter 2: An Overview of Explainable Artificial Intelligence for Cyber Security

Chapter 3: Artificial Intelligence: Practical and Ethical Challenges

Chapter 4: Domain Knowledge-Aided Explainable Artificial Intelligence

Chapter 5: Machine Learning Based IDS for Cyberattack Classification

Chapter 6: Artificial Intelligence for Cyber Security: Performance Analysis of Network Intrusion Detection

Chapter 7: Leveraging Artificial Intelligence Capabilities for Real-Time Monitoring of Cybersecurity Threats

Chapter 8: Network Forensics in the Era of Artificial Intelligence

Chapter 9: Obfuscation-Based Mechanisms in Location-Based Privacy Protection Chapter 10: Intelligent Radio Frequency Fingerprinting to Identify Malicious Tags in the Internet of Things

Chapter 11: Explainable Artificial Intelligence for Smart City Application: A Secure and Trusted Platform

Chapter 12: Explainable Artificial Intelligence in Sustainable Smart Healthcare

The book reflects the intersection of artificial intelligence and cyber security. Unlike other books on similar topics, the book focuses on the 'explainability' of cyber security applications. Chapter 1 showcases a holistic view of explainable artificial intelligence, Chapter 2 dives into cyber security using artificial intelligence. Chapter 3 highlights ethical issues associated with artificial intelligence. Chapter 4 focuses on domain-knowledge aided explainability. Chapters 5–7 focus on network intrusion detection in depth. Chapter 8 includes insights on network forensics. Chapter 9 discusses privacy preservation and Chap. 10 highlights malicious tags identification for the Internet of Things (IoT). Chapters 11 and 12 showcase different applications of explainable artificial intelligence on smart cities and healthcare systems.

Joondalup, Australia West Hartford, USA Melbourne, Australia Campbell, Australia Dhaka, Bangladesh Mohiuddin Ahmed Sheikh Rabiul Islam Adnan Anwar Nour Moustafa Al-Sakib Khan Pathan

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Mohiuddin Ahmed Sheikh Rabiul Islam Adnan Anwar Nour Moustafa Al-Sakib Khan Pathan

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