

Guest Editors' Introduction: Special Section on Latest Developments for Security Management of Networks and Services

I. INTRODUCTION

AS THE backbone of communications amongst objects, humans, companies, and administrations, the Internet has become a great integration platform capable of efficiently interconnecting billions of entities, from RFID chips to data centers. This platform provides access to multiple hardware and virtualized resources (servers, networking, storage, applications, connected objects) coming from cloud computing and Internet-of-Things (IoT) infrastructures. From these resources that may be hosted and distributed amongst different providers and tenants, the building and operation of complex and value-added networked systems is enabled.

These networked systems are, however, subject to a large variety of security attacks, such as distributed denial-of-service (DDoS), man-in-the-middle (MITM), Web-injection and malicious software attacks, orchestrated in a more or less stealthy manner through the Internet. While they are gaining in sophistication and coordination (i.e., advanced persistent threats), these attacks may affect the fundamental security goals of confidentiality, integrity, availability and non-repudiation of resources. The accessibility, distribution, and increased complexity of networked systems make them particularly vulnerable targets. In that context, cybersecurity techniques offer new perspectives for protecting these networked systems, through the elaboration of intelligent and efficient management methods for detecting, analyzing and mitigating such attacks.

Given the strong interest in both industry and academia in this area, this second special issue on security management was opened to topics, including: network and service management for security, security of network and service management, security management architecture, protocols and APIs, secure and resilient design and deployment of networked systems, monitoring and detection of threats and attacks, artificial intelligence and data analytics, modeling for security management, and configuration and orchestration of security mechanisms.

Following the success of the TNSM Special Issue on Cybersecurity Techniques for Managing Networked Systems in 2020, this new 2021 Special Issue focuses on latest developments for security management of networks and services. The selected papers are addressing challenges that currently

play a very important role in the security management of current and future network infrastructures, including advances in network monitoring, analytics and configuration.

II. ACCEPTED PAPERS

This Special Issue welcomed submissions addressing the important challenges and presenting novel research and experimentation results on security management of networks and services. Survey papers that offer a perspective on related work and identify key challenges for future research have also been considered. Sixty-eight papers were submitted for this Special Issue. The submitted papers were thoroughly reviewed and, when needed some authors were given the time to update their papers and to address in detail the concerns raised by the reviewers. It was finally decided to accept sixteen papers for inclusion in this Special Issue.

From the selected papers in this Special Issue, the first ten papers deal with advanced methods for monitoring and detection using machine learning (Section III-A), while the six others are focused on configuration and mitigation techniques to counter attacks (Section III-B).

A. *Advances in Monitoring and Detection*

Efficient monitoring and detection methods are a key challenge for supporting the identification of threats and attacks at an early stage in network infrastructures. The papers in this category place a strong emphasis on machine learning (ML) techniques in different application domains, but also on techniques to address traffic encryption and anonymization.

In "A New Method for Flow-Based Network Intrusion Detection Using the Inverse Potts Model," C. Pontes *et al.* [item 2] in the Appendix] define a new algorithm, called Energy-based Flow Classifier (EFC), to support flow-based network intrusion detection using inverse Potts models. This algorithm is capable of accurately performing binary flow classification, and the experiments show that it is more adaptable to different data distributions than classical ML-based classifiers.

In "A Unified Deep Learning Anomaly Detection and Classification Approach for Smart Grid Environments," I. Siniosoglou *et al.* [item 3] in the Appendix] introduce an intrusion detection system, called MENSA, implementing a novel autoencoder-generative adversarial network (GAN) architecture for detecting anomalies and classifying cyber-attacks, by combining deep neural network techniques and

taking into account the adversarial loss and the reconstruction difference.

In “Anomaly Detection for Insider Threats Using Unsupervised Ensembles,” D. Le and N. Zincir-Heywood [item 4) in the Appendix] present an anomaly detection approach, where the focus is on employing unsupervised ML methods and different representations of data with temporal information for identifying signs of anomalous behaviours that may indicate insider threats. The purpose is to detect early signs of user behaviour changes flagged for further investigation, and potentially detect unknown attacks.

In “A Multi-Dimensional Deep Learning Framework for IoT Malware Classification and Family Attribution,” M. Dib *et al.* [item 5) in the Appendix] define a novel multi-dimensional classification approach using Deep Learning (DL) architectures to combine the features extracted from strings- and image-based representations of the executable binaries towards accurate IoT malware classification and family attribution with a significantly improved accuracy.

In “DETONAR: Detection of Routing Attacks in RPL-Based IoT,” A. Agiullo *et al.* [item 6) in the Appendix] design an intrusion detection system capable of dealing with multiple attacks while avoiding any RPL overhead. The proposed system is called DETONAR, standing for DETector of rOut-iNg Attacks in RPL networks, and relies on a packet sniffing approach. DETONAR uses a combination of signature- and anomaly-based rules to identify any malicious behavior in the traffic.

In “In-Network Volumetric DDoS Victim Identification Using Programmable Commodity Switches,” D. Ding *et al.* [item 7) in the Appendix] define an in-network DDoS victim identification strategy which has been implemented on a Tofino-based programmable switch using the domain-specific P4 language, proving that some limitations imposed by real hardware to safeguard processing speed can be overcome to implement relatively complex packet manipulations.

In “DNS Tunneling Detection by Cache-Property-Aware Features,” N. Ishikura *et al.* [item 8) in the Appendix] propose a DNS tunneling detection method using cache-property-aware features. In particular, it relies on a specific feature to efficiently characterize DNS tunneling traffic and exploits a Long Short-Term Memory (LSTM)-based filter using this feature that achieves high detection rate of the DNS tunneling client while maintaining low misdetection rate.

In “FlowPic: A Generic Representation for Encrypted Traffic Classification and Applications Identification,” T. Shapira and Y. Shavitt [item 9) in the Appendix] describe a novel approach for encrypted Internet traffic classification and application identification by transforming basic flow data into a picture, called a FlowPic, and then using known image classification deep learning techniques, such as CNNs, to identify the flow category (browsing, chat, video, etc.) and the application in use.

In “ α -MON: Traffic Anonymizer for Passive Monitoring,” T. Favale *et al.* [item 10) in the Appendix] introduce a flexible solution for privacy-preserving packet monitoring. It replicates input packet streams to different consumers, while anonymizing protocol fields according to flexible policies that cover all

protocol layers. Beside classic anonymization mechanisms, it supports z-anonymization, a novel solution to obfuscate rare values that can be uniquely traced back to limited sets of users.

In “Edge Blockchain Assisted Lightweight Privacy-Preserving Data Aggregation for Smart Grid,” W. Lu *et al.* [item 11) in the Appendix] define a blockchain-assisted lightweight privacy-preserving data aggregation schema for smart grids. It combines the homomorphic Paillier encryption and one-way hash chain techniques to ensure security performance, so that edge servers can reduce communication overheads by aggregating data from the same region and filter false data in advance.

B. Advances in Configuration and Mitigation

In security management, special attention should also be given to advanced configuration and mitigation techniques. In this section, the papers investigate the exploitation of novel methods to dynamically adapt to security threats and to benefit from network analytics to support the configuration of networked infrastructures.

In “Optimal Security Risk Management Mechanism for the 5G Cloudified Infrastructure,” G. Carvalho *et al.* [item 12) in the Appendix] introduce an optimal security risk management mechanism based on a semi-Markov decision process framework to holistically minimize the risks of a Denial of Service (DoS) attack and Service Level Agreement (SLA) violations that might unfold at the 5G edge-cloud ecosystem.

In “A New Mutual Authentication and Key Agreement Protocol for Mobile Client - Server Environment,” L. Tsobdjou *et al.* [item 13) in the Appendix] propose a mutual authentication protocol based on elliptic curve cryptography for mobile environments, intended to be lightweight as being designed for resource constrained mobile devices. They also introduce a formal and informal analysis of the security of the proposed protocol, by taking into account several security and performance properties.

In “Intrinsic Security and Self-Adaptive Cooperative Protection Enabling Cloud Native Network Slicing,” W. Qiang *et al.* [item 14) in the Appendix] design an intrinsic cloud security approach as a unified paradigm to align cloud native technology with mimic defense and MTD (moving target defense). It makes full use of the new service features introduced by cloud native technology to implement a proactive defense mechanism of cloud native environments.

In “On the Flow of Software Security Advisories,” L. Miranda *et al.* [item 15) in the Appendix] propose an analytical model to express the information flow through security advisories across multiple platforms. The model is based on a queueing network, where each platform corresponds to a queue which adds a delay in the information propagation and permits to collect temporal information about events associated with vulnerabilities from large-scale measurement campaigns.

In “From TTP to IoC: Advanced Persistent Graphs for Threat Hunting,” A. Berady *et al.* [item 16) in the Appendix] define a formal model that dissects and abstracts the different

elements of an attack from both the attacker and defender perspectives. This model allows to compare the gap in knowledge and perceptions between the defender and the attacker, and to improve the quality of the threat hunting process by identifying false positives, adapting the logging policy and orienting investigations.

In “Blocklist Babel: On the Transparency and Dynamics of Open Source Blocklisting,” A. Feal *et al.* [item 17] in the Appendix] perform an empirical analysis of the transparency and dynamics of the ecosystem of open blocklists providers. In particular, they look at the synergies between blocklists, observing a high overlap between specific providers, and finding that addition and removal of records is often propagated across those providers that have a high overlap.

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APPENDIX RELATED WORK

- 1) R. Badonnel, C. Fung, Q. Li, and S. Scott-Hayward, “Guest editors’ introduction: Special issue on cybersecurity techniques for managing networked systems: Special section on cybersecurity techniques for managing networked systems,” *IEEE Trans. Netw. Service Manag.*, vol. 17, no. 1, pp. 12–14, Mar. 2020.
- 2) C. Pontes, M. Souza, J. Gondim, M. Bishop, and M. Marotta, “A new method for flow-based network intrusion detection using the inverse potts model,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 26, 2021, doi: [10.1109/TNSM.2021.3075503](https://doi.org/10.1109/TNSM.2021.3075503).
- 3) I. Siniosoglou, P. Radoglou-Grammatikis, G. Efstathopoulos, P. Fouliras, and P. Sarigiannidis, “A unified deep learning anomaly detection and classification approach for smart grid environments,” *IEEE Trans. Netw. Service Manag.*, early access, May 7, 2021, doi: [10.1109/TNSM.2021.3078381](https://doi.org/10.1109/TNSM.2021.3078381).
- 4) C. Le and N. Zincir-Heywood, “Anomaly detection for insider threats using unsupervised ensembles,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 8, 2021, doi: [10.1109/TNSM.2021.3071928](https://doi.org/10.1109/TNSM.2021.3071928).
- 5) M. Dib, S. Torabi, E. Bou-Harb, and C. Assi, “A multi-dimensional deep learning framework for IoT malware classification and family attribution,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 23, 2021, doi: [10.1109/TNSM.2021.3075315](https://doi.org/10.1109/TNSM.2021.3075315).
- 6) Agiollo, M. Conti, P. Kaliyar, T. Lin, and L. Pajola, “DETONAR: Detection of routing attacks in RPL-based IoT,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 26, 2021, doi: [10.1109/TNSM.2021.3075496](https://doi.org/10.1109/TNSM.2021.3075496).
- 7) Ding, M. Savi, F. Pederzoli, M. Campanella, and D. Siracusa, “In-network volumetric DDoS victim identification using programmable commodity switches,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 15, 2021, doi: [10.1109/TNSM.2021.3073597](https://doi.org/10.1109/TNSM.2021.3073597).
- 8) N. Ishikura, D. Kondo, V. Vassiliades, I. Iordanov, and H. Tode, “DNS tunneling detection by cache-property-aware features,” *IEEE Trans. Netw. Service Manag.*, early access, May 10, 2021, doi: [10.1109/TNSM.2021.3078428](https://doi.org/10.1109/TNSM.2021.3078428).
- 9) T. Shapira and Y. Shavitt, “FlowPic: A generic representation for encrypted traffic classification and applications identification,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 6, 2021, doi: [10.1109/TNSM.2021.3071441](https://doi.org/10.1109/TNSM.2021.3071441).
- 10) T. Favale, M. Trevisan, I. Drago, and M. Mellia, “ α -MON: Traffic anonymizer for passive monitoring,” *IEEE Trans. Netw. Service Manag.*, early access, Feb. 9, 2021, doi: [10.1109/TNSM.2021.3057927](https://doi.org/10.1109/TNSM.2021.3057927).
- 11) W. Lu, Z. Ren, J. Xu, and S. Chen, “Edge blockchain assisted lightweight privacy-preserving data Aggregation for Smart Grid,” *IEEE Trans. Netw. Service Manag.*, early access, Jan. 1, 2021, doi: [10.1109/TNSM.2020.3048822](https://doi.org/10.1109/TNSM.2020.3048822).
- 12) G. H. S. Carvalho, I. Woungang, A. Anpalagan, and I. Traore, “Optimal security risk management mechanism for the 5G cloudified infrastructure,” *IEEE Trans. Netw. Service Manag.*, early access, Feb. 8, 2021, doi: [10.1109/TNSM.2021.3057761](https://doi.org/10.1109/TNSM.2021.3057761).
- 13) L. D. Tsobdjou, S. Pierre, and A. Quintero, “A new mutual authentication and key agreement protocol for mobile client-Server environment,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 5, 2021, doi: [10.1109/TNSM.2021.3071087](https://doi.org/10.1109/TNSM.2021.3071087).
- 14) W. Qiang, W. Chunming, Y. Xincheng, and C. Qiumei, “Intrinsic security and self-adaptive cooperative protection enabling cloud native network slicing,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 8, 2021, doi: [10.1109/TNSM.2021.3071774](https://doi.org/10.1109/TNSM.2021.3071774).
- 15) L. Miranda *et al.*, “On the flow of software security advisories,” *IEEE Trans. Netw. Service Manag.*, early access, May 10, 2021, doi: [10.1109/TNSM.2021.3078727](https://doi.org/10.1109/TNSM.2021.3078727).
- 16) Berady, M. Jaume, V. Triem Tong, and G. Guette, “From TTP to IoC: Advanced persistent graphs for threat hunting,” *IEEE Trans. Netw. Service Manag.*, early access, Feb. 3, 2021, doi: [10.1109/TNSM.2021.3056999](https://doi.org/10.1109/TNSM.2021.3056999).
- 17) Á. Feal *et al.*, “Blocklist babel: On the transparency and dynamics of open source blocklisting,” *IEEE Trans. Netw. Service Manag.*, early access, Apr. 26, 2021, doi: [10.1109/TNSM.2021.3075552](https://doi.org/10.1109/TNSM.2021.3075552).

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