An overview of Intrusion Detection within an Information System: The Improvment by Process Mining

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Abstract

Information Systems handle big amount of data within enterprises by offering the possibility to collect, treat, keep and make information avail- able. To realize these tasks, it is important to secure data from intrusions that can affect confidentiality, availability and integrity of information. Un- fortunately, with the time, technologies are more used and various types of attacks act on it to create intrusion or misuses within Information Systems. Research in intrusion detection field is still looking for solutions of such relevant problems. The purpose of this paper is to present an overview of existing intrusion detection techniques compared to a new issue based on process mining used for event logs analysis to detect abnormal events that occurs on the system. events are classified accordingly to security policy etablished with fuzzy logic to build a set of fuzzy rules, for the definition of normal and abnormal events and then reduce the high level of false alerts.

Keywords: intrusion detection, fuzzy logic, false alerts, process mining, secu-rity policy

1. Introduction

Nowadays, enterprises use different technologies to enhance their business processes, by boosting the quality of service, in order to be more competitive on the market where needs of users or customers are permanently growing. Nevertheless, like a law of the nature, advantages usually generate some problems. In this case, while the quality of service is improved by the using of powerful technologies, security of data manipulated within information systems appears like a big challenge. All the actions that affect confidentiality, integrity and availability of information are considered as intrusions. Confi- dentiality concerns rights and authorizations of users while integrity is about the reliability of information and of course, every time, data must be accessible in real time by authorized users, this is availability. Every day information systems are the cible of several IT attacks. It can be made by internal or external attackers. All actions that are not authaurized are considered as intrusive and naturally lead to a loss of quality of service. Moreover, wars in the world are actually managed mainly thanks to IT systems. We remember for instance an intrusion realized by the virus called Stuxnet in the Iranian nuclear program. It has affected that program during 2 years and has imposed big financial dam- age. Another example of intrusion is the one realized by the American Edward Snowden in NSA system. His action was considered as intrusive because, he has performed some actions like accessing to certain sensible data without hav- ing permissions. Similar situations are legion in the world, appear every day, every hour and generate several bad effects within organizations. These situ- ations show that intrusion detection is still a big issue in Information System management. A big amount of papers exists on the topic of intrusion detection, each of them using a specific approach and presenting some advantages and certain limits. The aim of this paper is to provide an overview of intrusion detection techniques used and how it can be improved on the basis of process mining (Van der Aalst, 2011) and fuzzy logic (Atre & Singh, 2016). This paper is organized as follows. Sections 2 and 3 respectively describe intrusion detection techniques and systems. Section 4 shows big challenges addressed by intrusion detection, while section 5 justify and presents the use of process mining for intrusion detection and how fuzzy logic is used to define security policy. The last section conludes the paper.

2. Intrusion Detection Techniques

2.1 Signature-Based Intrusion Detection

(Roger et al., 2013) The signature-based detection technique also known as misuse detection technique is used in detecting and catching intrusions in terms of the char- acteristics of known attacks or system vulnerabilities. Therefore, any action conform to the pattern of a known attack or vulnerability is considered as in- trusive. This

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technique refers to techniques that use patterns of known intru- sions or weak spots of a system to match and identify intrusions. The sequence of attack actions or activities, the conditions that compromise an information system security, as well as the damage left behind by intrusions can be rep- resented by a number of general pattern matching models. Signature based intrusion detection uses regular expressions. Known signature are stored in a database and every event is compared to this base. If there is a matching, then an alert is generated. The attack must be known to be detected. But, the rate of false positive is low. The power of an Intrusion Detection System using this technique depends on the management of the database containing signatures, it is not the case with Anomaly-based intrusion detection.

2.2 Anomaly-Based Intrusion Detection

(Roger et al., 2013) Anomaly detection is based on the normal behavior of an actor within an information system, for this end any action that significantly deviates from the normal behavior is considered like intrusion. The proposed approach is fo- cused on a formal and sound description of resources that participate in the execution of identified activities. The anomaly based intrusion detection tech- niques allows to detect unusual behavior and thus have the ability to detect symptoms of attacks without specific knowledge of details. They also help in producing information that can in term be used to define signatures for misuse detectors. However, these techniques usually produce a large number of false alarms (Roger et al., 2013)(Kruegel, Valeur, & Vigna, 2004) due to the unpredictable behaviors of users and networks; more- over, they often require extensive training sets of system event records in order to characterize normal and abnormal behavior patterns.

2.3 Hybrid-Based Intrusion Detection

It is the association of misuse and anomaly detection techniques, like in (Yoo et al., 2014). The goal is to detect unknown intrusion by analysing and catching abnormal be-havior occurring in the system without generating a big amount of false alerts, and at the same time, detect and catch intrusive activities by analyzing and verifying if their signatures are present in the database of the system, contain- ing the list of signatures that represents non authorized activities. Mainly, the aim of hybrid-based intrusion detection technique is to combine advantages of the precedent techniques and substantially reduce their limits. Research con- tinues in this field and, actually, there is not a perfect hybrid-based intrusion detection model.

3. Intrusion Detection Systems

Intrusion Detection within an Information System consists on the monitoring of different events that occur in the considered system (Marinova-Boncheva, 2007). Intrusive events are the ones that containts irregular informations, in order not in conformity with security policy etablished on the base of the organizational strategy. Steps of intrusion detection process are (Marinova-Boncheva, 2007) a) Monitoring and analyzing traffic; b) Identifying abnormal activities; c) Assessing severity and raising alarm. These steps are executed permanently by the intrusion detection system in a cyclic way. It exists two main types of intrusion detection systems HIDS and NIDS.

3.1 HIDS

HIDS: Host-based Intrusion Detection System - Controls activities of a single equipment, like a computer. It helps the monitoring of abnormal activities occuring in a specific machine used in the information system. It can be a server or the computer of an administrator for instance. The task here is more axed on activities of different users. The interest of HIDS can be oriented on the monitoring of the operating systems or the applications.

3.2 NIDS

NIDS: Network-based Intrusion Detection Systems - Analyzes traffic existing between computers present in a network. It can detect irregularities like sur- charge of the network or bad information present in transferred data.

3.3 HONEYPOT

It is a computer connected to the network implementing willingly a low level of security. The goal is to distract attackers in order to protect more sensitive computers. Moreover, a honeypot is a good way of discovering new techniques of attack and new tools.

4. Big Challenges of Intrusion Detection

Many kind of attacks can occur in an information system, and thus are con-sidered as intrusive. These attacks disturb confidentiality, availability and in-tegrity of information which are core characteristics of a secure system.

Confidentiality: Different users, resources in general have not the same access to data. Some of them are
not intended to be known publicly. Many level of rights are implemented within an information system.
Nev- ertheless, an attack can make accessible sensitive information to an unau- thorized person or resource.

- Availability: Every time, data, resources, the whole system must be ac- cessible and able to produce good results.
- 3) Integrity: It implies that data are not modified or destroyed by an unau-thorized action.
- 4) Authentication: Different users of the system must provide personnal codes, proving their identity. The aim of authentication is to check pro- vided information in other to be sure that the user of the system is allowed to have a certain view on it.
- 5) Non-repudiation: It is always possible to know the authors of all the tasks realized within the Enterprise The main categories of attacks founded in the litterature are: DoS, DDoS, Scan, U2R (Marinova-Boncheva, 2007), Probe, zero-day attacks

4.1 DoS and DDoS Attacks

The goal of Denial of service (DoS) is to attack a system and saturate its re-sources such that, the considered system become unavailable. DDos refers to Distributed Denial of Service.

4.2 U2R: User to Root Attacks

For this type of attack, the attacker has an access to a normal user account on the system and exploits vulnerabilities to illegally have a root access to the system. With a root access, the attacker can create several damages in the system and then disturb confidentiality, integrity or availability of data in the system.

4.3 R2L: Remote to Local attacks

In the class R2L attack, the attacker sends packets to a machine via the net- work to illegally get a local access. Thus, a remote machine considered as the attacker, has the possibility to send packets via the network and takes advantage of some weaknesses of another machine to gain access to a local account on that machine.

4.4 Probe Attacks

In a probing attack, the attacker scans a network to amass information suitable (to exploit vulnerabilities).

4.5 Zero-Day Attacks

Such attacks are discovered when it appears, because the system has not knowl- edge about it.

From the above mentionned categories of attacks, the following table shows different types of specific attacks founded in the litterature and that can be detected by a network or a host based Intrusion Detection System (Proctor, 2000).

Table 1. Different attacks detected by HIDS/NIDS

N°	Challenge	Type of Detection
1	Unauthorized Access	NIDS
2	Unauthorized Login	NIDS
3	Jump-Off Point for Other attacks	NIDS
4	Data/Resource Theft	NIDS
5	Password Downloads	NIDS
6	Bandwidth Theft	NIDS
7	Denial of Service	NIDS
8	Malformed Packets	NIDS
9	Packet Flooding	NIDS
10	Distributed Denial of Service	NIDS
11	Abuse of Privilege Attack	HIDS
12	Contractors with Elevated Privileges	HIDS
13	Ex-Employee using Old Account	HIDS
14	Administrator Creates Back-door Accounts	HIDS
15	Inadvertent Privileges Granted	HIDS

16	Critical Data Access and Modification	HIDS
17	Students Changes Grades	HIDS
18	Employee Modifies Performance Evaluation	HIDS
19	Falsification of Results	HIDS
20	Unauthorized Disclosure	HIDS
21	Theft of Personnel	HIDS
22	Graffiti (modification of website data)	HIDS
23	Anonymous Users Browsing Critical Files	HIDS
24	Changes in Security Configuration	HIDS
25	Users disabling Locking Screen Savers	HIDS
26	Legal Notice Missing	HIDS
27	Guest Account Enabled	HIDS
28	Open Registry	HIDS
29	Nomadic Users with compromised Systems	HIDS

The Critical Data access and Modification problem can be addressed by process mining.

5. Process Mining

5.1 The goal of Process Mining

The purporse of Process Mining is to provide methods, and tools to analyze data related to process exection. Such data are stored in structured files called event logs, that keep the trace of different events associated to process execu- tion. It is the reason why, the father of Process Mining, Will Van der Aalst, wrote in (Jagadeesh Chandra Bose & Van der Aalst, 2009)(Van der Aalst,, 2011) that, event logs constitute the starting point of Process Mining. More, The Handbook of process mining (Van der Aalst,, 2011) clearly defines its purpose which is mainly about process discovery, conformance checking and process enhance- ment. Process discovery is about the way to build a process model based on event logs. Once the model is built, it is compared to a normative model, that describes how the model was supposed to be, this action is realize accordingly to conformance checking concept. The third use of process mining is process enhancement that provides solutions to improve business processes. With a se- curity challenge, the conformance checking is about security issues, such that, every intrusion is a violation of the security policy that constitutes the norma- tive model used to parse or check the decriptive one.

5.1 Fuzzy Logic for Security Policy

A set of rules is used to define Security Policy. The trace of task execution is kept in event logs to improve analysis. Then, fuzzy logic is used to categorize data and events occurring in the system (Atre & Singh, 2016). The way to categorize data on the basis of initial rules, event logs and fuzzy logic constitutes security policy.

5.2 Why Process Mining for Intrusion Detection?

Using anomaly, signature or hybrid based intrusion detection techniques, the big amount of interesting models proposed in the literature to detect intru-sion, are built with Artificial Intelligence, particularly thanks to classic Ma-chine Learning and data mining models: Neural Networks, SVM, Decision tree, KNN.

Process Mining can be more useful for Host Intrusion Detection and thus, can easily help to eradicate attacks for instance the 16th one listed in table 1, crit- ical data access and modification. The reason is simple: (Proctor, 2000) The interest of Network based Intrusion Detection is on the analyze of packets within the net- work while Host based Intrusion is orientated on logs, the starting point of Process Mining.

Process mining theory, for intrusion detection is more interesting than previ- ous Artificial Intelligence models because Its models of detection is not built with data examples, but with the security policy. It assures that Intrusion that are founded are really events that viols security policy. Then, alarms are only generated for real attacks, it solves the problem of false positive. But, at the same time, the use of Process Mining increases the rate of false negative if the rules are not enough to consider the different cases of security violations. This last issue

can be addressed by a good definition of important rules for the en-terprise, because the most important for an enterprise is not to provide the guaranty of 100 % of security, but to implement security mechanisms accordingly with the strategy of the enterprise.

6. Conclusion and Future Works

Information systems are usually the cible of various attacks, that can be made by internal or external attackers. Intrusion detection within such systems is one of the major issues tackled to manage security. Thus, many researchers continue to provide various solutions, for the improvment of existing ones. This paper shows a panoramic view of intrusion detection domain starting by presenting techniques used and most popular attacks. There still exists several relevant problems in intrusion detection depending on the type of considered IDS. This review presents Process Mining as a solution to tackle Host Intrusion Detection challenges, because it improves classic Machine Learning and Data mining technics used before by building the model of detection not on the basis of data examples, but on the basis of rules generated by the enterprise accord- ingly to its strategy.

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