

A Study of Intrusion Detection System using Efficient Data Mining Techniques

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Abstract- IDS is a software consequence monitors the humiliation or behavior plus investigate any immoral operation suggest itself. Fantastic increase and tradition of internet raises concerns in relation to how to defend and communicate the digital in order in a safe approach. Nowadays, hackers use different types of attacks for getting the valuable information. In the proposed Fast Hierarchical Relevance Vector Machine (FHRVM), Analytical Hierarchy Process Method (AHP) is used to select the input weights and hidden biases. Simulation has been carried out using Math works MATLAB R2012a. KDD Cup 1999 dataset is taken for testing the performance of the proposed work and the results indicate that FHRVM has achieved higher detection rate and low false alarm rate than that of existing SVM algorithm. This research evaluates the efficiency of machine learning methods in intrusion detection system, together with classification tree and support vector machine, with the expect of given that reference for establishing intrusion detection system in future. Compared with further interrelated works in data mining-based intrusion detectors accuracy, detection rate, false alarm rate. It moreover shows improved act than KDD Winner, particularly used for two types of attacks namely, U2R type and R2L type. Comparison results of C4.5, SVM. we find that C4.5 is superior to SVM in accuracy and detection; in accuracy for Probe, Dos and U2R attacks, C4.5 is also better than SVM and FHRVM; but in false alarm rate FHRVM is better. In this paper enhance that FHRVM is better than c4.5 and SVM for U2R attack & R2L attack.

Keywords: Classification tree, SVM, FHRVM, Internet attack, Intrusion detection system (IDS)

I. INTRODUCTION

The Internet has become a part of daily life and a vital role today. Internet has been used as an important component of industry models. For the industry users it can be used for both industry and customers apply the Internet application such as website and e-mail on industry performance. Therefore, information security of using Internet as the media needs to be carefully concerned [1]. Intrusion detection is one major research problem for business and personal networks. As there are many risks of network attacks under the Internet environment, there are various systems designed to block the system. IDS aid the network to resist outside attacks. The primary goal of IDS is used to provide a wall of defense to confront the attacks of computer systems on the network. It can be used to distinguish between the dissimilarity between the types of malicious network communications and computer systems usage, Whereas the conventional firewall cannot perform this task. Intrusion detection is based on the assumption that the behavior of intruders is different from a legal user. Nevertheless while internet brings concerning expediency and concurrent lines, consequently comes in sequence protection difficulty. For example: servers are attacked interior data and information is stolen. In the event of such cases, big losses in network may be caused in cash and industry credit. With the growth of Internet there have seen a tremendous increase in the number of attacks, the intrusion detection system has become a main stream of information security. With the help of the firewall it can be used to provide some protection but they do not provide full protection. The purpose of the intrusion detection system is to help computer systems to deal about attacks. There are two kinds of IDS that can be used to base on the types of operations used to detect intrusions [2]. Anomaly detection system creates a database of normal behavior and any deviations from the normal behavior are occurred an alert is triggered regarding the

occurrence of intrusions. Misuse Detection system stores the predefined attack patterns in the database if a similar data and if similar situations occur it is classified as attack. Based on the source of data the intrusion detection system are classified to Host based IDS and Network based IDS. In network based IDS the individual packet flowing through the network are analyzed. The host based IDS analyzes the activities on the single computer or host [5].

At current, hackers are unnecessary to have a wide knowledge of specialized knowledge, and yearly internet attack cases are increasing to a great extent. Common enterprises adopt firewall as the first line of defense for safety in network to supervise accessing behaviors of internet, and it owns restricted detection capability for internet attacks. Therefore, Intrusion Detection System, IDS is always applied to detect internet encapsulation, to improve protecting capability of internet safety. IDS appears like internet supervision and alarm device, to survey and consider whether the internet attacks may suggest itself, timely send alarm before risks are caused by attacks, execute corresponding response measures, and reduce rate of bigger losses. Moreover, some technologies are based on pattern check, with low mis-judgment rate, but the pattern-based should be upgraded on a normal basis, such technology does not have enough detection capacity for unknown and renewed attack manners.

The research process is shown in Fig. 1.

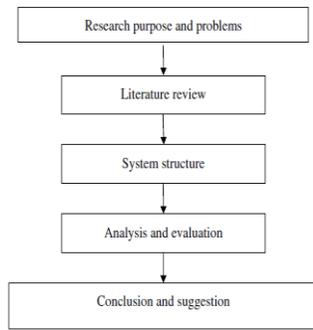


Fig. 1. Research flow.

Recently, many researches applied the technology of data mining and machine learning, which can analysis bulk data, and such technologies own better detection capacity for unknown attacks. Though some research achievements have been scored, there is a lot of development potential. Under such situation with most same conditions, how is the efficiency of different machine learning methods applied in intrusion detection. In addition the said manners, what methods are there? Therefore, the research intends to compare the efficiency of different machine learning methods applied in intrusion detection, include classification tree, support vector machine, and so on, with the hope of providing possible suggestion for improvement, as the reference for IDS.

II. REVIEW OF LITERATURE

A) AN INTRODUCTION ABOUT IDS:

An **intrusion detection system (IDS)** is a device or software application that monitors network or system activities for malicious activities or policy violations and produces reports to an organization location. Some systems may try to end an intrusion effort but this is neither required nor expected of a monitoring structure. Intrusion detection and prevention systems (IDPS) are primarily focused on identifying possible incident, sorting in order about them, and exposure attempts. In addition, organizations use IDPS for other purpose, such as identify troubles with protection policies, document existing threats and deterring individuals from violating security policies. This method goes one step further than a firewall and gives you additional security to ensure that your data is safe and protected, by combining the protection of the IDPS with a firewall. Network IDS (NIDS) and Host-based IDS (HIDS) systems. The NIDS analyses the data through the network. It does this by analyzing the audit logs in the system and intrusion detection system with various patterns was put forward. Analyze any signal arising from related safety problems, send alarms when safety tribulations crop up, and inform interconnected personnel units to take relevant measures to reduce possible risks [8].

Its framework includes three parts:

1. Information collection: Data collection: the source of these collected data can be separated into host, network and application, according to the position.
2. Analysis engine: Analysis engine is able to analyze whether or not there are symptom of any intrusion.
3. Response: Take actions after analysis, record analysis results, send real-time alarm.

B) Types of intrusion detection system:

There are two kinds of classification methods for intrusion detection system:

1. According to different data sources, intrusion detection system includes host-based IDS and network-based IDS.
2. According to different analysis methods, intrusion detection system includes Misuse Detection and Anomaly Detection.

The advantage and disadvantage of the intrusion detection systems.

a) *Host-based IDS*: A host-based intrusion detection system (HIDS) is a system that monitors a computer system on which it is installed to detect an intrusion and/or misuse, and responds by logging the activity and notifying the designated authority. Whether internal or external, has circumvented the system's security policy.

C) Pros and cons:

A) It can judge whether or not the host is intruded more accurately: Because its data comes from system audit records and system logs of hosts, comparing with network-based intrusion detection system, it can more accurately judge network attacks or intrusion on hosts.

B) It can detect attacks under encrypted network environment: Because the data comes from system files and transmitted encrypted data in network.

C) It does not need additional hardware: It just needs monitoring system installed in specified hosts, without additional hardware.

D) Higher cost: Monitoring systems must be installed in each host; and because of different hosts, the audit files and log pattern are accordingly different, thus different intrusion detection systems are required in each host.

E) It may affect system efficiency of monitored hosts: Intrusion detection system in monitoring state may occupy system sources of hosts.

F) Network-based IDS:

Its data is mainly collected network generic stream going through network segments such as Internet packets.

G) Pros and Cons in IDS:

1. Low cost: Only network-based IDS are able to identify all attacks in a Local Area Network, and the cost is just for the device.
2. It can detect attacks that cannot be done by host-based IDS, such as: Dos, DDos.
3. The flux is large, and some packets may be lost, and it cannot detect all packets in network.
4. In large-scale network, it requires more rapid CPU and more memory space, to analyze bulk data.

(H) Different Types of analysis method in IDS:

Misuse Detection:

Intrusion is well-defined attacks on known weak points of system. All Intrusion which object is to misuse system resources and break it, are fall in this categories. Misuse intruder can be detected by watching for certain action being performed on certain objects and also by doing the pattern matching on audit trail information. Its advantage is high detection rate and low false alarm rate for known attacks.

Anomaly Detection: Anomaly-based signatures are typically geared to look for network traffic that deviates from what is seen normally. It is based on an supposition that intruder's behavior is different from normal users' behavior.

The Detection rate of the method is high, and it is more likely to detect un-known attacks, but mis-judgment rate is also high [7].

Hybrid: The advantage of misuse detection is low misjudgment rate, as well as low detection capacity for unknown attacks; comparatively, anomaly detection owns the capacity of detecting unknown attacks, but with high mis-judgment rate [8].

Current analysis method

The current analysis methods are mainly applied in intrusion detection system. Some of the types of current analysis methods are, State transition: State transition is applied to describe the relation of arising events, which is usually used for misuse detection.[10]

Statistical models: Statistics method is applied to construct normal behavior mode, including: threshold measures, mean and standard deviation, multivariate model, clustering and outlier detection which is usually used for anomaly detection.

Neural network: In computer science and related fields, artificial neural networks are computational models inspired by animals' central nervous systems (in particular the brain) that are capable of machine learning and pattern recognition.[11] They are usually presented as systems of interconnected "neurons" that can compute values from inputs by feeding information through the network.

Bayesian network: Graph method is applied to express the relation among variables[12] when performing detection, conditional probability is used to calculate proper detection value.

Rule-based: Behavior or mode is expressed by rule method, and those conforming to rule can be judged to be attack behavior.[9] It's commonly used for misuse detection.

Data mining (Machine learning) methods: It concludes Markov process model classification tree support vector machine, association rule, link analysis, sequence analysis, and so on.

Machine learning:

Machine learning is widely applied in various areas such as: Biological signature differentiation, search engine, medical diagnosis, and bond market analysis, some of the common machine learning technologies:

- Bayesian decision theory
- Multivariate methods
- Clustering
- Classification trees
- Linear discrimination
- Multilayer perceptions
- Local models
- Hidden Markov models
- Reinforcement learning

I) Classification tree

Classification tree is a prediction mode in machine learning and it is also called Decision tree [4]. The most fundamental and common algorithm used for classification tree is FHRVM, C4.5 and SVM.

Three types of tree construction methods are Top-down tree construction, Bottom-up pruning, FHRVM belongs to top-down tree construction.

III. SYSTEM STRUCTURE

System structure graph

The proceeding flow of the research is

KDD Cup 99 dataset:

The data applied in the research comes from KDD Cup 99 dataset, which was initially used for The Third International Knowledge Discovery and Data Mining Tools Competition. It was proposed to assess the efficiency of intrusion detection algorithm. Therefore, the research also applies the dataset.[13] There are approximately 4,940,000 kinds of data in training dataset, 10% of

which is provided; there are 3,110,291 kinds of data in test dataset, and there are totally 47 types of network connection characteristic.

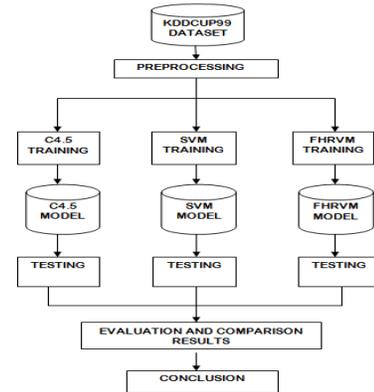


Fig.2

Data) in each kind of network connection record. And its property can be divided into three major types: Basis characteristic of network connection, characteristic of network connection content, network transmission characteristic; Data pattern include nominal, binary and numeric. There are 23 types of attacks contained in training information, and 37 types of attacks contained in test information, 14 types of attacks more than training information,[14] thus test information can be used to assess the detection capacity for unknown attacks.[3] The attacks contained in test information can be separated into the following major types:

Prob. Attackers usually apply probe catch information, to determine the targets and the type of operation system.

Dos (Denial of service). A distributed denial-of-service (Dodos) attack is one in which a multitude of compromised systems attack a single target, thereby causing denial of service for users of the targeted system. The attack usually occupies all system source of server, or occupies the band width and disables system resource and makes operation stop.

U2R (User gain root): In the attack, users take advantage of system leak to get access to legal purview or administrator's purview, such as: Buffer Overflow is among them.

R2L (Remote file access): The attack is to apply the advantage of server providing services, to get related safety setting or user's encrypted files, such as: Unicode leak, SQL Injection, and so on.

Preprocess of data

The research intends to compare the efficiency of C4.5, SVM and FHRVM under different circumstances, sample training dataset (10% kddcup.data_10_percent.gz) and test dataset. Based on the normal proportion, select each 10,000 group of data where normal proportion is 10%, 20%, 30% . . . 90% in training dataset and test dataset.

Training and testing

Training stage of SVM also requires setting parameter helpful to provide python program seeking optimization parameter.

IV. ANALYSIS AND EVALUATION

True positive (TP): The amount of attack detected when it is incorrectly identified.

True negative (TN): The amount of normal detected when it is incorrectly identified.

False positive (FP): The amount of attack detected when it is incorrectly rejected.

False negative (FN): The amount of normal detected correctly rejected.

When it is attacks can be detected by IDS it requires high detection rate and low false alarm rate.

The make inquiries compares accuracy, detection rate and false alarm rate, and lists the Assessment outcome of various attacks.

Assessment of accuracy

Accuracy refers to the proportion of data classified an accuracy type in total data in the situation TP and TN, thus the accuracy is

$$\text{Accuracy} = \frac{TP+TN}{TP+TN+FP+FN} * 100\%$$

B) Assessment of detection rate

Accuracy refers to the proportion of attack detected among all attack data in the TP, thus detection rate is

$$\text{Detection rate} = \frac{TP}{TP+FN} * 100\%$$

Measurement of false alarm rate

False alarm rate refers to the proportion that normal data is falsely detected as attack behavior FP, thus false alarm rate is

$$\text{False alarm rate} = \frac{FP}{FP+TN+1} * 100\%$$

D) Accuracy measurement between different attacks: Accuracy of various attacks refers to the quantity that the type of data is correctly classified.

There are four types compared in the research. They are Probe, Dos, U2R, and R2L [6].

Dos attack: When the proportion of normal data is low, FHRVM is better.

U2R attack: Integrally FHRVM is better than C4.5 and SVM.

R2L attack: In proportion to the average among two methods related in accuracy. [15] In proportion to the average value, except that these two methods are similar in accuracy in R2L attack, FHRVM is greater to C4.5 and SVM in accuracy otherwise. Evaluate to the average results got in the research is compare with the results obtained through KDD Cup 99 winner.

V. CONCLUSION:

The probe compares accuracy, detection rate, false alarm rate and accuracy of other attacks below different proportion of normal information. KDD Cup 99 dataset is current standard dataset in intrusion detection. Compared with further interrelated works in data mining-based intrusion detectors accuracy, detection rate, false alarm rate. It moreover show improved act than KDD Winner, particularly used for two types of attacks namely, U2R type and R2L type Comparison results of C4.5, SVM. find that C4.5 is better-quality to SVM in accuracy and detection; in accuracy for Probe, Dos and U2R attacks, C4.5 is also better than SVM and FHRVM; but in false alarm rate FHRVM is better. In this paper enhance that FHRVM is better than c4.5 and SVM for U2R attack

& R2L attack. As a future work, numerous training algorithms are utilized to enhance its performance.

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