## 行政院國家科學委員會專題研究計畫 期中進度報告

### 護套型即時入侵偵測系統之研製(2/3)

計畫類別: 個別型計畫

計畫編號: NSC93-2213-E-009-034-

<u>執行期間</u>: 93 年 08 月 01 日至 94 年 07 月 31 日 執行單位: 國立交通大學資訊工程學系(所)

計畫主持人:蔡文能

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#### 一、中文摘要

以攔截系統呼叫為基礎之入侵偵測系統提供即時的入侵防禦能力,在攻擊尚未造成損害之前即提供攔截制止以確保系統安全。但是這類藉由特徵比對方式來偵測攻擊的安全系統,在遭受刻意安排的攻擊模式時,常面臨準確度下降的問題。

除了惡意攻擊外,外來的應用程式也是一個安全上的隱憂。基於日益複雜的軟體功能與架構,軟體開發人員常需要使用現有的、他人已開發的模組來完成一個複雜的新應用程式,這類模組一般稱爲Commercial Off-The-Shelf (COTS)應用程式。不管是COTS應用程式,還是龐大、程式碼不公開的應用程式(如微軟的Word),都會有一個安全上的疑慮:即這些軟體是否有私底下執行不爲人知的竊取行爲或破壞行爲。

這類程式如有漏洞(通常都有),入侵值 測系統可能無法發揮效用,所以本計畫採取 攔截程式的系統呼叫以檢核應用程式是否 做的不該做的事。

**關鍵詞**:網路攻擊、系統呼叫攔截、即時入 侵偵測、擬態攻擊、人體免疫系統

#### Abstract

There are many security systems, such as firewalls, anti-virus engine and Intrusion Detection System (IDS), can be used to prevent the system from malicious attacks on network. Those tools are designed by experts and used to detect and/or to prevent intrusion behavior. However, no matter how powerful or complicated they are, the intruders can always sneak through and bypass the

security checking after analyzing these tools from top to toe. Fortunately, the experts always try to push forward new defending technology as soon as possible to resist new attack methods.

Based on system call interception technique, we have developed a prototype of real-time intrusion detection and prevention system. In our prototype system, we did intercept those important system calls invoked by application and tries to match any penetration scenarios. Once there is an evidence showing some penetration is undertaking, the system can terminate the penetration process before injury. This wrapper system can also wrapping COTS (Commercial Off-The-Shelf) component to provide robustness and security.

**Keywords**: Network Attack, System call interception, real-time IDS, Mimicry Attacks, Human-immunity

#### 二、緣由與目的

單一種入侵偵測系統並無法偵測出所有的的入侵行為,所以電腦系統通常會結合各種入侵偵測技術來確保其最大安全性。本計畫的主要目的在護套型入侵偵測系統 (Intrusion Prevention System using Wrapper; IPSW)。因為我們主要是把應用程式的系統呼叫攔截下來,檢查後如果沒問題再幫忙完成系統呼叫工作,有如應用程式被包裝起來。為了防止外來攻擊者進行未授權的入侵行為以及內部網路使用者濫用其權限,內部網路節點通常可以採用"入侵偵測系統(I

3

ntrusion Detection System — IDS) " 來加強其安全防護。

入侵偵測系統需要其寄生的系統所產生的稽核記錄來作分析。因此大部分入侵偵測系統最大的缺點,就是只能做到"偵測(Detection)",而沒有達到"預防 (Prevention)"。入侵偵測系統只能站在第二防線上,做事後追蹤的工作,而沒有辦法達到即時防護的作用。因此我們需要一個能夠在攻擊行爲發生時,即時發現並通知管理人員或終止執行的"入侵預防系統"。

除了惡意攻擊外,外來的應用程式也是一個安全上的隱憂。基於日益複雜的軟體功能與架構,軟體開發人員常需要藉助軟體再利用以及軟體模組化的方式來完成一個複雜的新應用程式。也許是自行開發模組,但比較常見的是使用現有的、他人已開發的模組來組合,這類模組一般稱爲 Commercial Off-The-Shelf (COTS)應用程式。

不管是 COTS 應用程式,還是龐大、程式碼不公開的應用程式(如微軟的Word),都會有一個安全上的疑慮:即這些軟體是否只有單純地完成其任務,還是,私底下執行不爲人知的竊取行爲或破壞行爲。這樣的假設對於政府組織或者是企業團體都是相當重要的問題,因爲一個軟體設計師很容易在其研發的應用軟體中加入後門,就算在程式碼公開的情形下,光是數十萬行的程式(Windows NT 號稱有一千多萬行的程式)就很難分析出是否留有潛在的後門,更別論一向不公開程式碼的大型應用程式。

除此之外,應用軟體在實作時必定有一些程式上的疏失。如微軟的 IIS 網頁伺服器,從早期的主程式 inet info.exe 具有暫存區溢位的問題外,還有後來的 Un icode/Double decode的問題,這些都造成惡意攻擊者能夠取得管理者權限甚至是後來的 Code Red 病毒的大量擴散。雖然軟體設計師不願見到這類的漏洞發生,但軟體終究是人類所設計的產物,百密總有一疏,軟

體測試過程無法將所有可能的測試情境都 走過一次。所以一個適時偵測異常行為的系 統不僅可以保護本身的安全,還可作為強化 COTS 應用程式的屏障。

所有的攻擊行爲均需要系統資源,而系統資源則需要使用系統呼叫(system call)來取得。因此透過攔截系統呼叫的方式來偵測異常行爲,不僅可以達到較高的準確度,也可以將注意力集中在監督系統呼叫上,並且具有執行效能上的優勢。我們將稱這套稽核系統爲"wrapper",因爲它就像一個防護單圍繞在作業系統外圍,根據設定過濾每一個存取系統資源的要求,讓攻擊者無所遁形,達到"non-bypassibility"。。

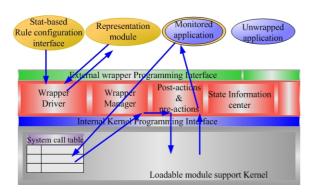
#### 三、結果與討論

本計畫在去年已經設計出一個以攔截系統呼叫(system calls)爲基礎的入侵偵測系統雛型,證實這種方法是可行的。我們並且將成果發表到去年的國際計算機會議(ICS2004, Taipei): Tsung-Yi Tsai, Kuang-Hung Cheng, Chi-Hung Chen, and Wen-Nung Tsai, "An Intrusion Prevention System using Wrapper," Proc. Of ICS2004, International Computer Symposium, Taipei, December 2004, pp. 1218-1223.

今年,藉由攔截系統呼叫型之入侵系統的基礎,我們加強了解決繞道攻擊所可能帶來的問題,並且降低系統誤判率。根據自動機理論,我們將攻擊樣版經過轉換後,除了可偵測原先所定義的攻擊行爲外,還能偵測出相關的變種攻擊行爲,這對於偵測入侵者的詭變攻擊方式有極大幫助。

這項成果也已經發表在今年(2005 年) 的全國計算機會議上(NCS2005, Tainan) : Tsung-Yi Tsai, Kuang-Hung Cheng, and <u>Wen-Nung Tsai</u>, "IPSdNA: an Intrusion Prevention System disputing No-op Attacks," Proc. Of NCS2005, International Computer Symposium, Tainam, December 2005, ISE1-1. 4

目前我們是以 Linux 系統為平台, 系統架構如下圖所示。



主要包括四大元件,使用 Linux 可 載入式核心模組 (Loadable kernel module) 製作。分述如下:(1) Wrapper Driver (WD). 爲程式與 Wrapper Manager 之間的橋接程式(bridge)。(2) Wrapper Manager (WM).負責接受指示以監控程 式的系統呼叫行爲,此模組會用到 WIC(見下一項)的資訓。(3) Wrapper Information Center (WIC).主要包括兩種 表,一爲 penetration template table, 另一 爲代表被監控之程式的狀態機(state machine)之 penetration table.(4) **State-based Rule Configuration Interface** (SRCI).提供使用者把認爲有問題的執行 流程(scenario)用有限狀態機(FSM)表示 出來存於 WIC。

#### 四、成果自評

本計畫在培育人才方面,去年和今年分別有一位碩士班同學以此相關題目爲研究論文畢業服國防役,我們也將成果分別發表於去年(2004)國際計算機會議以及 2005 年的全國計算機會議。下表爲我們系統與其他三個類似系統(GSW, KLW, STAT 各系統參見References)在功能上的比較表:

	Our approach	GSW	KLW	STAT
Real-time intrusion	YES	YES	YES	NO

prevention				
Graphical rule	YES	NO	NO	YES
configuration				
Customized	YES	YES	NO	YES
rule				
configuration				
Transparency	YES	YES	YES	YES
Non-root usage	YES	NO	NO	NO
mode				
Partial	YES	NO	NO	N/A
interception				
Timmer support	YES	NO	NO	NO

在程式效能方面,我們分別測試 I/O bound 的和 CPU bound 的程式在有被監控 與沒被監控的效能比較。先列 I/O bound 的再列 CPU bound 的:

	1000 times	10000 times	50000 times
No PVIW	75756 µs	726339 µs	3353957 µs
PVIW	81892 µs	800281 µs	3710352 μs
installed			
Penalty	8.10 %	10.1%	10.6%

以上是 I/O bound 程式的結果;以下則為測試 CPU bound 程式的結果。

	1000 times	10000 times	50000 times
No PVIW	192970 µs	1922763 μs	9620897 μs
PVIW	199106 <i>µs</i>	1986736 μs	9840510 μs
installed			
Penalty	3.18%	3.32%	2.28%

以下附上今年(2005)發表於 NCS2005 之論 文。

### IPSdNA: an Intrusion Prevention System disputing No-op Attacks

### 預防繞道攻擊之入侵偵測防禦系統\*

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#### Abstract

In this paper, we present a real-time Intrusion Prevention System named IPSdNA (an Intrusion Prevention System disputing No-op Attacks), which is based on system call interception technique. In this system, users can describe attacking models in forms of state machine through a well-designed GUI interface. This system intercepts every system call invoked by application programs and tries to match any penetration pattern. Once there is an evidence showing some penetration is undertaking, the system can terminate the penetration process before injury. To improve detection accuracy, we developed an inspection model based on automata theorem and human-immunity concept. With the help of this enhancement, IPSdNA can solve several kinds of mimicry issues that are destined for pattern-matching IDS.

**Keywords:** IPS, Wrapper, Mimicry Attacks,

human-immunity

#### 中文摘要

以攔截系統呼叫為基礎之入侵偵測系統提供即時的入侵防禦能力,在攻擊尚未造之前即提供攔截制止以確保系統安全。這類藉由特徵比對方式來偵測攻擊模式時,在遭受刻意安排的攻擊模式時,常呼受到意安排的攻擊模式時,然不應度系統的基礎,我們加強了繞道面叫可不養的問題。根據自動機理論,我們將攻擊樣版。除門題,並且降低誤判將攻擊樣人。除我們將大擊行為外,還能偵測出關擊攻擊行為外,這對於偵測入侵者的詭變攻擊方

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式有極大幫助。

關鍵字: 入侵防禦、擬態攻擊、人體免疫系統

#### 1. Introduction

There are many security systems, such as firewalls, anti-virus engine and Intrusion Detection System (IDS), can be used to prevent the system from malicious attacks on network. Those tools are designed by experts and used to detect and/or to prevent intrusion behavior. However, no matter how powerful or complicated they are, the intruders can always sneak through and bypass the security checking after analyzing these tools from top to toe. Fortunately, the experts always try to push forward new defending technology as soon as possible to resist new attack methods.

IDS can be divided into two categories according to their detection methods, including the Anomaly IDS and the Misuse IDS. The Misuse IDS is the prevalence one and it will use given and occurred attacking scenarios to build up an intrusion characteristics database. So, the Misuse IDS is also called the Signature-based IDS. When the monitored behavior is compared and matched against some intrusion pattern, this action will be judged as an intrusion. In this manner, the Misuse IDS has the benefits of low false alarm rate. But it will also suffer from the drawbacks of low detection rate to new kinds of intrusions, since it does not have the patterns of new attacking scenario in its signature database.

The Anomaly IDS has a database which is used to store templates of normal program behaviors. The Anomaly IDS will compare the monitored action with normal models in database and identify it as abnormal when it has lots of divergence comparison result. Although the Anomaly IDS can detect new attacking methods, it also has to bear high erroneous judgments rate. That is because it is quite hard

and uncertain to exactly define what the normal behaviors are in this complicated computing world.

Exactly as mentioned in the design goal and principals of STBIPW (State-Transition-Based Intrusion Prevention using Wrapper)[1], only when the intruder have accessing privilege to system resource can he cause certain degree of damage to victim system, and the only possible way to access system resource is via system call interface provided by OS. Therefore, system call interface is an area of strategic importance. With the help of wrapper-based IPS, we can intercept and analyze the system call sequence invoked by process to detect intrusions.

In recent years, most of the researches regarding IDS are mainly focused on the improvements of detection rate and erroneous judgments rate. However, there are also some articles trying to give a warning to the potential attacks of IDS, such as Mimicry Attacks [5].

In order to reduce the possibility of false positive rate and to enhance the capability of wrapper-based IDS, we proposed the IPSdNA (Intrusion Prevention System disputing No-op Attacks) based on the STBIPW which we built before. In STBIPW, user can define intrusion templates in the form of finite state machine (FSM) and those templates are similar to the patterns in traditional signature-based IDS, which can be used to detect intrusion actions and stop its execution before damage occurred. However, STBIPW is a signature-based IPS and it also has to resolve the problem of low detection rate caused by new kinds of attacking scenarios. Therefore, against STBIPW, there are two major improvements in IPSdNA. First, we analyze and transform user-defined intrusion templates according to Automaton theorems. After transformation, these modified templates will assist IPSdNA to detect not only original intrusion behaviors, but also the No-op attacks. Seconds, we adopted the concept Human-Immunity in our system. We negative selection mechanism user-defined templates and filter out improper ones to lower down false alarm rate.

In this paper, we will first introduce several related works regarding intrusion detection systems (IDS), and then give an overview of human-immunity system in section 2. Then, we will talk about mimicry attacks that give several challenges to signature-based IDS. In section 3, we describe how the IPSdNA conquers several issues that are destined in signature-based IDS, followed by the detail architecture of IPSdNA in section 4. In section 5, we use plenty of experiments results to show the intrusion detecting capability and to evaluate the system efficiency of IPSdNA. Afterwards, we will give

a brief discussion and conclusion in the last section.

#### 2. Related Works

In this section, we first introduce two intrusion detection systems related to this paper. One is the system-call-based IDS that intercepts and monitors the sequence to detection intrusion. And the other is the state-based IDS that use states and state transitions mechanisms to find out the evidence of intrusions. Afterwards, we present the human immunity concepts and introduce one intrusion detection system designed and implements based on this concept. Finally, we talk about some possible attacks to host-based IDS and ways to pass by its detection.

#### 2.1 System-call based Detection Methods

In modern operating systems, user process has to use system calls to access system resource through kernel. In this way, kernel can schedule each request and ensure fairness among multi processes. To provide security checking, it is quite practical to do examination on system calls invoked by suspected process. There are many IDS systems designed with this concept, such as STBIPW[1] and N-Gram [18] [23].

N-gram was proposed by Stephanie Forrest and other team members in 1996. They used system call tracing technology to build their IDS system and finally presented the pH-IDS[2] (process Homeostasis IDS) in year 2000. pH-IDS will verify each system call invoked by process and determine its status. It builds a "self database" for each privileged process which is used to represent this process's normal behavior under specific hardware architecture, software version and configuration.

The "N" in N-gram represents that it will examine N continuous system calls. For example, when N = 3, N-gram will observe each system call and check their relationship with the following three system calls. It will compare each fragment of system call sequence against database to detect intrusion. In this way, N-gram is simple and efficient, but the detection rate will depend on the window size N. When window size N is larger, it will be more precise to the comparison result since it has more evidence to prove it is an attack. However, it will decrease the detection rate with too large N. Therefore, choosing N is an important and tough job when using N-gram since every process has different adapted window size. The other drawback of N-gram is that it checks only system call sequence. It does not inspect the system call

parameters. There are some attacks that are carried out with valid system call sequence but harmful arguments to achieve the purpose of attacking. Furthermore, we can choose some valid system call fragment from normal database and insert it into intrusion sequence. In this way, the intrusion system calls are scattered into each fragments and beyond the scope of window size, thus successfully escaping the N-gram's check.

#### 2.2 FSM based Detection Methods

The finite state machine (FSM) is composed of states and transitions. Each state is used to record status of certain task and related to each other with transitions. Each transition will be triggered to make switch when some event happened. We can view each intrusion behavior as a sequence of states that each state represents some key action has been done. For example, Figure 1 represents the behavior of virus infection.

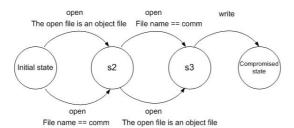


Figure 1 FSM of Virus Infection

The STAT (State Transition Analysis Tool) [15] [20] is one well-known IDS system that uses FSM to analyze intrusion. STAT is a log investigation system. It uses FSM to describe attack scenarios and then feeds system logs into intrusion detection engine to find whether the system has been attacked. However, attackers can make a detour to go on the offensive and leave without being aware of.

There are many researches that use the concept of STAT, such as STBIPW[1]. In that work, it decomposes a penetration into many states linked with critical system call transition. It uses graphical interface to describe intrusion behaviors. It would be more intuitive and easy to depict attacks, especially for complicated rules. Therefore, the STBIPW can provide real-time intrusion prevention, and the graphical models will not only decrease the complexity of rule maintenance but also raise the accuracy of detection rate.

#### 2.3 Immunity based Detection Methods

Human body is always being in touch with external materials, such as water and air. All these outside materials may contain harmfulness invaders to human bodies. It might be bacteria, virus, even the parasite. Fortunately, we have biological immune system that would detect and eliminate those foreign intruders. The major character of immune system is the lymphocyte, which is known as antibody. It is like a sentry that patrols around and ferrets out pernicious materials.

To produce antibodies, the immune system will first pick up a random segment from gene pool. This randomness is the main reason why human bodies can resist unknown diseases. However, not every gene segment is able to be used as lymphocyte. They have to be tested with both positive selection and negative selection. The positive selection will leave behind those abnormal lymphocytes that can not cooperate with other human cells. On the other hand, negative selection will let lymphocytes contact with human cells and filters out those active ones since these lymphocytes misjudge normal cells as enemies, producing the phenomenon of autoimmunity. The lymphocytes that pass both positive and negative selections are said to be mature and be able to shoulder the important duty of epidemic prevention.

There are many researches that proposed and designed IDS systems with the concept of human immunity [24] [25] [26]. The basic idea is to map certain computer characteristics as antibody, and then cultivate random-chosen antibody to be a mature one. For example, we can represent a network connection to be a byte stream in length L based on some basic information, such as IP addresses and port numbers. We also define the sentries of IDS system as byte stream with length L. Those sentries are corresponding to lymphocytes in immune system and responsible for the jobs of intrusion detection. When the representative byte stream of certain network connection matches some detectors, it means that this connection might be a dangerous one.

Another kind of immunity detector is described as a state machine, such as the work in IGSTAM [26]. In IGSTAM, it represents each kind of intrusion as sequence of states alternated with transitions. Consequently, it defines the antibody as state machine and calls it vaccine in the following format:

$$Vac = (S1, A1, S2, A2, ..., Sn).$$

Those vaccines also have to pass negative selection. They will be trained against normal database to see whether they are active to normal behaviors. If there is no match, those vaccines are said to be mature and can be spread to detect whether system is being attacked.

#### 2.4 Weakness of Host-based IDS

To detect intrusions, signature-based IDS has to detect and match certain pattern exactly, and then it can judge it as an attack. For that reason, we can insert some useless operations (no-op) into penetration sequence to confuse the detectors. This kind of attack is called "no-op attack" . Take N-gram discussed above as an example, N-gram will inspect several continuous system calls to detect intrusions. If we know the trained database it uses and insert some normal system calls into detector pattern purposely, we can get away from detection since the attack sequence has been out of the window size. In the same way, we can disperse attacking steps to normal patters and accomplish invasion slowly and stealthily. These kinds of attacks are called Mimicry Attacks [5] and the no-op attack is one typical type of them.

Another kind of mimicry attacks is called the collaborative attack. In order to escape from examination, malicious process can fork another child process to carry out invasion. Most IDS systems will monitor fork related actions and apply equal inspections for child processes to prevent such attacks. However, if both the parent and child processes finished parts of intrusion steps and exchange their results through IPC, it will be undetectable by original methods. For example, if we define the following sequence of system calls as a simple intrusion patter:

```
open("/etc/passwd");
write("/etc/passwd");
close( );
```

It will be undetectable by general IDS systems if we let parent process do the *open* system call and let child process finish the *write*, as shown in Figure 2. Currently we will focus on detecting the No-operation attacks. To disputing the collaborative attacks would be our future work.

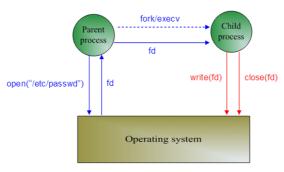


Figure 2 Collaborate Attacks

# 3. IPSdNA System Requirements and Design Issues

Detection rate and false positive rate have been challenges to intrusion detection systems all the time. Therefore, a well-designed IDS system should pay attention to both requirements. In this section, we first introduce how to use negative selection mechanism to inspire from immune system to filter out unsuitable detectors, and thus reduces the chance of false positive. In additions, we proposed solutions to against mimicry attacks.

#### 3.1 Examination of Improper templates

In this paper, the system architecture we proposed can be classified as a Misuse IPS. It can let users customize their own penetration templates so that it can be used to detect intrusions as required. In order to lower down the false positive rate, we collect normal system call sequences on a clean system and use this data to examine user-defined templates. There are two phases in this procedure, one is the training phase and the other is the testing phase.

In training phase, we collect system call sequences of normal actions to build the Normal Database. During this phase, it should be guaranteed that the testing environment is clear and there would be no any intrusion at all. This is much like the way used in Anomaly IDS. However, the normal database built in Anomaly IDS is used for intrusion detection. On the contrast, normal database is used to inspect user-defined patterns (as shown in Figure 3), just as lymphocytes and negative selection mechanism in the immune system.

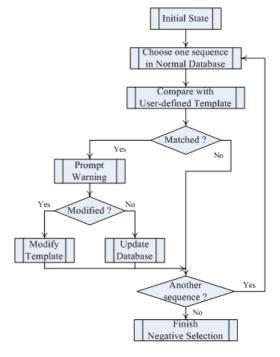


Figure 3 Procedure of Negative Selection

In testing phase, if the comparison gets positive reactions, it means that this template might misinterpret normal behavior as abnormal one. The system will make a warning prompt to user. In this way, users will have the opportunity to modify just-defined templates or let it be used in system even though it got positive result. Based on the testing procedure inspired from immune system, we can diminish lost caused by improper template detectors.

#### 3.2 Prevention the No-op attacks

In traditional signature-based IDS, it is easy to circumvent intrusion examination by inserting lots of useless system calls. However, those systems that specify intrusion as state machines have certain degrees of resistance against no-op attacks in nature. This is because the finite state machine would stay remained when it faces an unrelated event. However, it is not enough to defend no-op attacks with only such inborn gifts.

For example, we can define an intrusion template as shown in Figure 4 and suppose all those labels on arcs are system call numbers. This machine is a DFA (Deterministic Finite Automaton) and thus it must make a state transition when the current state and current system call satisfied its definition of transition function. To attack this template, we can make a system call sequence "a, c, e" and this sequence won't be detected by this machine. That is because the attacker can escape the inspection of "c, e" sequence by executing "a" first. We call this kind of attack as Evasion attack. It is one kind of no-op attacks since the system call "a" behaves like a no-op operation used to disturb detection.

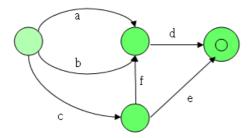


Figure 4 Original Template

In order to solve evasion problem, we have to reorganize the FSM. First, we decompose the complex parts of original FSM into several sub-FSMs as shown in Figure 5. Every two crotched paths that join before final state would be separated. Formally, we will do DFS search on original graph and take apart the graph into individual subgraphs represented by the paths from initial state to final state when we find a back edge.

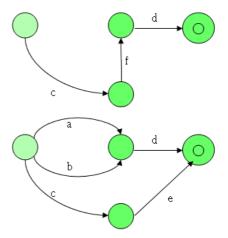


Figure 5 Template after first transformation

In this way, attackers can not insert evasion operation (unrelated but influenced) to escape inspection. For example, it would be undetectable for sequence "c, f, e" and become a suspect one after transformation. This algorithm is listed as follows:

```
G:graph (FSM)
V[G]:nodes in G
U[G]:edges in G
P[G]:path from initial node to final node in G
DFS(G)
    for each node u ∈ V[G]
       do color[u] <--WHITE
            \pi[u] \leq -NIL
    for each node u ∈ V[G]
       do if color[u] = WHITE
                 then DFS-VISIT(u)
DFS-VISIT(u)
   color[u] <--GRAY
   for each v ∈ Adj[u]
        do if color[v]=WHITE
                 then \pi[v] \leq -u
                       DFS-VISIT(v)
            if color[v]=BLACK and v!=final and \pi[v]!=u
                 then for each p \in P[G] that include (u,v)
                         do New a sub-FSM
                     discard (u,v) from G
   color[u] <--BLACK
   if Adj[u] = NIL and u is not final
        then discard ( \pi [u], u) from G
            discard u from G
```

In second step, we add an  $\varepsilon$ -transition for each non-final state back to previous fork state that has more than two possible transitions. It will become an  $\varepsilon$ -NFA (Nondeterministic Finite Automaton), as shown in Figure 6. In this way, no matter how far this machine has been to, it can go back to previous fork state and trace another path to the destination.

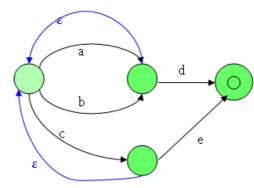


Figure 6 Template after second transformation

After this transformation, the enhanced FSM can detect any kind of no-op attacks, no matter how much the useless operations are and how dispersed those key events are. This algorithm is listed as follows:

```
G:graph (FSM)
V[G]:nodes in G
U[G]:edges in G
D[G] : crotched nodes in G
DFS(G)
    D[G]=NULL
    for each node u ∈ V[G]
        do color[u] <--WHITE
            \pi[\mathfrak{u}] \leq -N \coprod
    for each node u ∈ V[G]
        do if color[u] = WHITE
                 then DFS-VISIT(u)
DFS-VISIT(u)
   color[u] <--GRAY
   if Num(Adj[u]) \ge 1
      then Add u to D[G]
    for each v ∈ Adj[u]
        do if color[v]=WHITE and v!=final
                 then \pi[v] \leq -u
                       for each d ∈ D[G]
                            do Add (d, v) labeled ε
                       DFS-VISIT(v)
   color[u] <--BLACK
   if u \in D[G]
        then discard u from D[G]
```

Finally, we transform the  $\varepsilon$ -NFA into an equivalent DFA as shown in Figure 7. We do this transformation for the reason of simplicity and efficiency. In DFA, the system only has to pay attention to relative system calls that are critical to current state. However, in  $\varepsilon$ -NFA, it needs to guest all possible paths against happened events and search whether there is one path that reaches

the final state. Therefore, it would be much simpler and efficient in real-time execution when we use DFA to specify the intrusion. Even so, the transformed FSM does not lose its detection capability since they are equivalent according to automaton theorem. It can detect several variants of no-op attacks, including evasion attack.

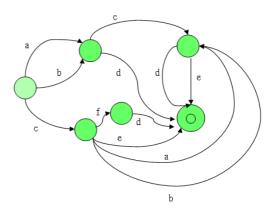


Figure 7 Final Template

#### 4. IPSdNA System Architecture

Based on STBIPW, our system is divided into two segments; one is the user level components and the other is the kernel-level components. We use a device driver to connect these two parts. The device driver acts as a bridge between these two segments. In one side, it will help to pass commands and data to underlying core engine for user configuration. And in the other side, it will also help to return execution information back to users. The architecture of the complete system is shown in Figure 8. We use the Kernel-Level Wrapper technique to build all the kernel components in the form of LKM (Loadable Kernel Module) and plug it into the Linux kernel in the run time.

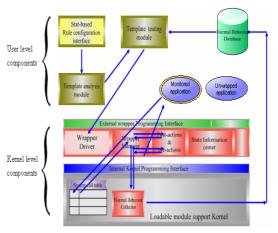


Figure 8 System Architecture of IPSdNA

#### 4.1 User Level Modules

The main function of the user level module is to pre-set the attack templates. This includes providing the interface for users to formulate attack templates, and analyzing the attack templates the users have defined. This can not only prevent no-op attacks, but can also verify the user-defined templates. The purpose is to make sure there are no inappropriate attack template monitoring programs that may cause a high false positive alarm rate.

First, we must analyze and verify the attack template defined by the user. Therefore, we might alert the user when he/she defines an inappropriate attack template to eliminate recognition errors, and also prevent hackers from inserting no-op system calls to avoid detection. These functions are accomplished by the Template Analysis Module and the Template Testing Module.

The Template Analysis Module first analyzes the original attack templates, divides them into several sub-FSMs according to the condition, transforms each sub-FSM into a  $\varepsilon$ -NFA, and last, transforms them into real attack templates that can actually be used to detect attacks. As in Figure 9, the upper part reveals the original attack template that the user has defined; after going through analysis and transformation via the Template Analysis Module, it will become the final attack template as revealed in the lower part.

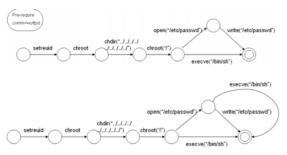


Figure 9 Template Transformation

After analyzed, the attack templates must be tested before being inserted into the kernel. The Template Testing Module will first select the normal system call sequence from the Normal Behavior Database, and then test to see if it could transform the attack template to the template's ultimate condition. The flow is shown in the figure below.

The template will be inserted into the Wrapper Driver after it is verified. Then the kernel level modules will execute the monitoring

program according to the user defined template, and detect attack behaviors which match with those ones that the users have defined.

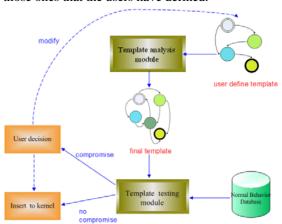


Figure 10 Template Analysis and Verification module

#### 4.2 Kernel Level Modules

The main function of the Kernel level module is to detect real-time attacks. This includes generating an FSM object, intercepting system calls, and executing the state-transition of the attack FSM object. Training the Normal Behavior Database is also a function of the Kernel level module.

The Normal Behavior Database used by the Template Testing Modules is constructed by the Normal Behavior Collector. The Normal Behavior Collector records the system call sequence while normally and securely used by a user. This training method could be used on any application program. Via the Wrapper Driver, a user could set up the requirements in the Wrapper Manager to record normal system calls. The Wrapper Manager could then call the Normal Behavior Collector according to the requirements, and train an exclusive Normal Behavior Database for any application program. The user could decide both the time of training and the size of the database. The longer the time, or the lager the size, the more accurate the attack template test would be, resulting in reduced false positive alarm rate.

#### **5. Experimental Results**

In this section, we will use the experimental results to illustrate the efficiency and practicability of the IPSdNA system we proposed. First, we will discuss the run-time performance overhead of our system; then we will show the results of the experiment on detecting improper attack templates by implementing the user-trained Normal Behavior Database. We use attack behaviors that can purposely avoid detection for the mimicry attacks to verify that our system can catch these attack behaviors, and detect the attacks more accurately.

#### 5.1 Runtime Overhead

The runtime overhead of our system is mainly caused by state-transition. We designed the first testing program as a copying program, which opens a text file and copies it to another file. All the read and write system calls will cause state-transition in the FSM object of the supervising program while it is executed. The result is shown in Figure 11. No matter how large the size of the copied file is, the state-transition time is a stable constant around  $1300~\mu$  s. Therefore, the lager the file is, the longer the time is used on the I/O operation, and relatively, the smaller the system's runtime overhead will be. This is shown in Table 1.

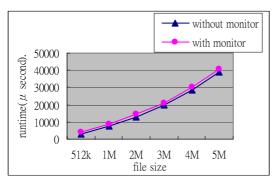


Figure 11 Program size vs. elapsed time

File Size (MB)	0.5	1	2	3	4	5
Overhead Rate	36%	18%	11%	8%	6%	4%

Table 1 Program size vs. System overheads

However, the combination of the first program and the attack template results in the worst state. That is, when a user formulates an attack template, the key system calls on the template seldom occurs. This is because comparing to the rate of normal behaviors, the rate of attack behaviors is much lower while executing a program. Therefore, in the second testing program, our program copies a 2M file in the experiment, modifies its behavior conditions and attack templates, and reduces the rate of the system calls that causes the state-transition in attack templates. The result is shown in Figure 12. From the figure, we can claim that the runtime overhead is approximately 0 while the rate of the system calls that causes the state-transition in attack templates is below 8%.

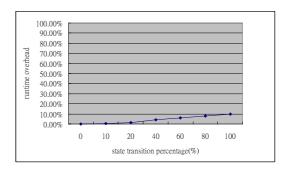


Figure 12 Overhead in State Transition

The experiences above merely show the state of a single attack template monitored by a single program. Next, we will use the program that copies a 2M file to experience the condition with attack templates and several monitor programs executed concurrently. Figure 13 reveals the relationship chart of one program being monitored by different numbers of attack templates. From the chart we can see that even if the program meets the monitoring conditions of several different attack templates, the executing efficiency will not reduce as long as the program is still normally running. Therefore, the runtime overhead can remain in a stable status. This is because even though the program is affected by being monitored under many monitoring conditions, it will not cause a lot of templates to do state-transitions constantly if normally executed. Hence, it will be able to stably retain a low runtime overhead.

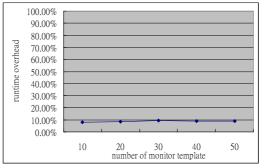


Figure 13 Number of Monitored Templates vs.

Overheads

Figure 14 shows the overhead when many programs that require being monitored are executing. We can see that while running many monitored programs at a time, the runtime overhead can also retain stable. This is because while a system call of a program is intercepted, the hash method is used to search for the FSM object of the monitoring programs. Therefore, running many programs concurrently would only increase the searching time, which is relatively little. This can retain a stable runtime overhead.

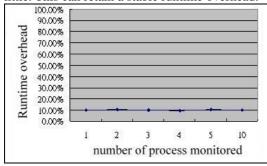


Figure 14 Number of Process vs. Overheads

Afterwards, we experienced running multiple programs at once, each program being monitored by many attack templates, as shown in Figure 15. In the figure, each line represents the number of programs that are executed at the same time. This shows that even under such a sophisticated monitoring condition, our system can still retain a low stable runtime overhead, and not be affected by the increased numbers of programs and templates.

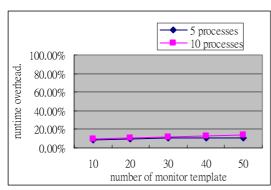


Figure 15 Runtime overheads

#### **5.2 The Attack-Detection Experiments**

First, we assume that the sequence of an attacking system call is as follows:

setreuid(0,0)

open("/etc/passwd")

write("/etc/passwd")

In the pH-IDS detection method, say that the window size is 3; we would only have to insert a no-op system call, such as read, to make the sequence of the attack system call as below:

> setreuid(0,0) open("/etc/passwd") read("/etc/passwd") write("/etc/passwd")

in order to avoid the pH-DS detection.

Based on the characteristic of STAT, our system assumes that the attacker already knows the attack template the user will define, as in Figure 16. However, our FSM would only do state-transition when a key system call occurs. Therefore, inserting unrelated no-op system calls would not affect our detection. As in the example above, while going through the *setreuid* system call and the *open* system call, the FSM will stay in state 3; if read, an unrelated system call, is inserted at this moment, it will not affect our detection. Our FSM will remain in state 3 until write, another system call, is intercepted; it then moves to the final state and the attack is caught.

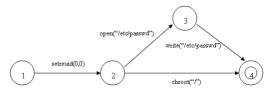


Figure 16 Original testing template

Besides, experienced attackers may use the weaknesses of STAT and try to insert onto the other system calls of the attack template to find another route to attack. The attacking system calls are as below:

setreuid(0,0)
open("/etc/passwd")
chroot("\")

The "open" is a no-op system call which attempts to use open as other-routed attacks. It first executes system calls setreuid and open to put the FSM in state 3; because FSM could not intercept chroot in state 3, it could avoid the detection. Yet, in our system, our Template Analysis Modules will first transform the original attack templates into no-op attack-evading attack templates, as shown in the figure below.

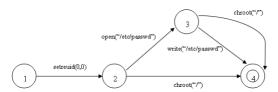


Figure 17 Testing template after transformed

We can detect the inserted No-op system call's rerouted attack, as shown in Figure 18. No matter how many no-op system calls the attacker inserts into the original attack template, or how many attacking routes it tries, we will be able to successfully detect it.

#### 5.3 Warning Test of Improper Templates

If we want to monitor the sftp-server program, we use the Normal Behavior Collector for two days of normal behavior trainings to generate a 2M sized Normal Behavior Database. This can prevent errors from occurring in the future, and also prevent high false positive rate templates.

r21686: #
r21686

Figure 18 No-op attacks detected

During the training phase, we only need to use the intranet to login and operate, in case of attack behaviors. Then we try to define an attack template, as in Figure 19, to prevent attackers from using the loophole of the sftp-server to get the root authority and leave some programs that would cause to the system.

The attack template we defined is to prevent attackers from using loopholes to get the root authority. They may create new file folders, modify authorities, write invading programs, etc. However, after going through Template Testing Modules, it will still move to the final state under a normally used condition. Because the system calls sequence shown in Figure 19, it

may still happen under another file with the same authority. This shows that the attack template is not accurate enough, casing false positive rate to enhance. Thus our system tests the templates first once they are defined, and report them to the users.

#### 6. Discussion and Conclusion

In this paper, based on the result of STBIPW[1] [1] we developed an intrusion prevention system, IPSdNA, which has the following four advantages:

- (1) It has the advantage of a kernel wrapper, and the monitoring job is done in the kernel. The runtime overhead is relative low. Our system can intercept all the system calls. Any application programs that requests services from the system will be monitored. Thus, before the system being harmed, malicious behaviors will be blocked in real-time.
- (2) It has the state-transition statement advantage of STAT. IPSdNA can use state-transition statement to generate graphical statement interface, so that the user may use direct sense to understand sophisticated behaviors.
- (3) Low false positive rate. We use the negative selection inspired from the concept of human immunity system to train a Normal Behavior Database to detect attack templates, in order to prevent users from defining inappropriate, easily mistaken attack templates. Therefore, the false positive rate will reduce.
- (4) It is able to go through the tricks of purposely avoiding IDS detects. To dispute the No-op attacks, we first analyze the original attack template that the user has defined, and then add an  $\varepsilon$ -transition for each non-final state that has more than two possible transitions. After that, we use the FSM transformation algorithm to transform the  $\varepsilon$ -NFA (Nondeterministic Finite Automaton) to an equivalent DFA so that every path can be traced, and thus can prevent no-op attacks.

In the near future, we will try to improve the IPSdNA to fight the collaborative attacks.

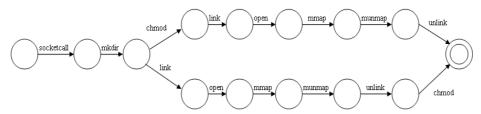


Figure 19 improper sftp-server attack template

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