EVALUATION OF WEB SECURITY MECHANISMS USING VULNERABILITY ANALYSIS & PATTERN MINING

MAINPROJECT PHASE 1 REPORT

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CERTIFICATE

This is to certify that this main project phase 1 report entitled "EVALUATION OF WEB SECURITY MECHANISMS USING VULNERABILITY ANALYSIS & PATTERN MINING" by BIMAL VARGHESE (82904), submitted in partial fulfilment of the requirements for the award of the degree of Master of Technology in Computer Science and Engineering (Specialization in Information Systems) of Mahatma Gandhi University, Kottayam during the academic year 2014-15, is a bonafide record of work carried out under our guidance and supervision.

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DECLARATION OF ORIGINALITY OF WORK

I, BIMAL VARGHESE ,University Reg. No. 82904, student of M.Tech CSIS 2013-2015, hereby declare that the project work entitled "EVALUATION OF WEB SECU-RITY MECHANISMS USING VULNERABILITY ANALYSIS & PATTERN MINING" is an original one and has neither been submitted earlier to this institution nor submitted by me to any other institution for fulfillment of the requirement of a course of study. .

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ABSTRACT

Internet and web applications have become very common these days. Web applications are accessible by anyone from any part of the world and hence is prone to more attacks. Due to limited time and resources, web application engineers need support in identifying vulnerable code which can be utilized for attacks. A practical approach to predicting vulnerable code would enable them to prioritize security auditing efforts. To evaluate web application security mechanism, a methodology and a prototype tool is proposed. The methodology is based on the idea that injecting realistic vulnerabilities utilizing pattern matching in a web application and attacking them automatically can be used to support the assessment of existing security mechanisms and tools in custom setup scenarios. The system tries to evaluate applications utilizing vulnerabilities in real web applications. In addition to the generic methodology, the paper proposes the implementation of the Vulnerability & Attack Injector Tool (VAIT) that allows the automation of the entire process.

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Chapter 1

INTRODUCTION

Web applications are becoming common these days. The users of web application range from individuals to organizations and corporate users. Web applications plays an important role in many of our daily activities such as social networking, email, banking, shopping, registrations etc. Since a web applications accessibility is very high, the impact of vulnerability in it will also increase dramatically compared to a normal software. Since web applications have huge number of users compared to that of other applications, it becomes a high potential target for attackers.

Developers of the web applications are having the direct responsibility for the security of web applications. But due to heavy pressure to meet the deadline or lack of knowledge or experience and time constraint limits developers focus on security issues of web applications. A web developer must have a thorough understanding about the magnitude and relevance of the assets they are supposed to protect. Some common reasons why securing a web application become a tricky are 1) availability of a number of frameworks and languages for the development 2) exposure to large number of audience 3) inexperience of developers and 4) need for accessing organizational resources remotely.

So in order to secure a web application, their is a need to have security standards and tools to evaluate the security of them. Also the necessary counter measures have to be taken against the detected attacks. For implementing this, new tools and procedures must be developed and a proper training must be conducted in accordance with them. The testing procedures must be thorough and the application must be verified and validated. The existing legacy applications must be audited from time to time and must be patched or updated timely.

In order to test and validate the security mechanism of web applications a methodology and a tool to inject vulnerabilities and attack the web applications is proposed. The methodology is based on the idea that, it is possible to assess different attributes of existing web application security mechanisms by injecting realistic vulnerabilities in a web application and attacking them automatically. The methodology have evolved from the existing fault injection techniques. The set of "vulnerability" + "attack" represents the space of the "faults" injected in a web application, and the "intrusion" is the result of the successful "attack" of a "vulnerability" causing the application to enter in an "error" state [15]. A vulnerability can be considered as a weakness whose presence do not cause harm by itself but can be utilized for an attack.

The attack injection consists of the introduction of realistic vulnerabilities that are afterwards automatically exploited. Vulnerabilities are considered realistic because they are derived from the extensive field study on real web application vulnerabilities [16], and are injected according to a set of representative restrictions and rules. The attack injection methodology is based on the dynamic analysis of information obtained from the runtime monitoring of the web application behavior and of the interaction with external resources, such as the backend database. This information, complemented with the static analysis of the source code of the application, allows the effective injection of vulnerabilities that are similar to those found in the real world. The use of both static and dynamic analysis is a key feature of the methodology that allows increasing the overall performance and effectiveness, as it provides the means to inject more vulnerabilities that can be successfully attacked and discarded those that cannot.

This methodology can be applied to various types of vulnerabilities. The project focus on only some common exploits namely SQL Injection (SQLi), Cross Site Scripting(XSS), Remote Code Execution (RCE) and File Inclusion (FI). These kinds of attacks occur mainly due to improper validation of the input which allows the attacker to manipulate commands.

The proposed methodology provides a practical environment that can be used to test countermeasure mechanisms (such as intrusion detection systems (IDSs), web application vulnerability scanners, web application firewalls, static code analyzers, etc.), train and evaluate security teams, help estimate security measures (like the number of vulnerabilities present in the code), among others. This assessment of security tools can be done online

by executing the attack injector while the security tool is also running; or offline by injecting a representative set of vulnerabilities that can be used as a testbed for evaluating a security tool. The methodology proposed will be implemented in a concrete Vulnerability & Attack Injector Tool (VAIT) for web applications. The tool will test on top of widely used applications in two scenarios. The first to evaluate the effectiveness of the VAIT in generating a large number of realistic vulnerabilities for the offline assessment of security tools, in particular web application vulnerability scanners. Second, how it can exploit injected vulnerabilities to launch attacks, allowing the online evaluation of the effectiveness of the counter measure mechanisms installed in the target system, in particular an intrusion detection system

The rest of this report is organized as follows. Chapter 2, presents the literature survey. Chapter 3 describes the proposed methodology and attack injections, and Chapter 4 summarizes the conclusion of the survey.

Chapter 2

LITERATURE SURVEY

Fault injection techniques have traditionally been used to inject physical (i.e., hardware) faults [18] into a complex system. The method utilizes the use of fault injection for explicitly removing design or implementation faults in a complex fault tolerant system. It explicitly aims in reducing, by verification, the presence of faults in the design or implementation. Here faults are injected to uncover potential issues and thus to determine the most appropriate action for improving the system. Compared to a fault injection system, a fault forecast system can use a feedback loop to impact the design of the system. Usually, fault-injection based attempts to validate systems that consist of test sequences where the input patterns (the injected faults) are selected according to fault or error models intending to simulate the consequences of activating real faults. Heavy ion radiation, pin-level fault injection, software-implemented fault injection, failure acceleration, fault injection in simulation models are typical techniques to perform this objective in the context of physical- or software-fault injection experiments. The fault-tolerance algorithms & mechanisms (FTAM) formalism enables an execution tree to be generated, where each path from the root to a leaf of the tree is a well-defined formula. The set of well-defined formulas constitutes a useful framework that fully characterizes the test sequence. The input patterns of the test sequence (fault & activation domains) then are determined to cover specific structural criteria over the execution tree (activation of proper sets of paths). This provides a framework for generating a functional deterministic test for programs. The main advantage of this system include generation of causing actual hardware faults, which may be close to a realistic fault model.

The increasing complexity of systems has lead to the replacement of hardware-based techniques by software implemented fault injection (SWIFI), in which hardware faults are

emulated by software eg. Xception [20]. The high complexity and the very high speed of the processors available today make the design of the special hardware faults techniques very difficult, or even impossible. It is very difficult to control and observe the fault effects inside the processor compared to injecting the actual problem to the hardware. Even the detection of the activated faults is very complex. So to overcome these difficulties, simulation based fault injection has been proposed. The injection of realistic software faults (i.e., software bugs) has been absent from fault injection effort for a long time. In this method, faults are injected into a simulation model of the target system which allows to control the injection experiment. First proposals were based on ad-hoc code mutations [22], [23]. Software Implemented Fault Injection techniques (SWIFI), also known as fault emulation is a common way for alternate implementation of fault injection method. In this method the application execution is interrupted some way and executing some specific fault injection software code, which emulates hardware faults by inserting errors in different parts of the system such as the processor register, the memory, or in the application code. The main advantages of software fault injection are the low complexity, low development effort, and low cost. In addition, software fault injection tools have increased portability, can be easily expanded (e.g., for new classes of faults), and do not have problems with physical and electrical interferences which are very common in physical fault injection tools. The disadvantage of these method include fail to inject faults in peripheral devices and unable to check accuracy of address specific logic system if the hardware. In Xception by directly programming the debugging hardware inside the target processor, system can inject faults with minimum interference with the target application without modifying it.

More recent works focus on the injection of representative software faults based on comprehensive field studies on the most common types of software bugs [4]. The study shows that a clear predominance of software faults as the root cause of computer failures . Given the huge complexity of today's software, the weight of software faults on overall system dependability will tend to increase. The complete elimination of software defects during software development process is very difficult to attain in practice. In addition to well-known technical difficulties of the software development and testing process [5], practical constraints such as the intense pressure to shrink time-to-market and cost of software contribute to the difficulties in assuring 100 percent defect-free software. So the current scenario in the computer industry is having systems in which software defects do exist but no one knows exactly where they are, when they will reveal themselves, and, the possible consequences of the activation of the software faults. Trend in the software industry toward a component-

oriented development model, compels the software vendors to consider the use of commonly available general-purpose components more and more, which leads to the software products as a collection of small components from a variety of sources. These kinds of software have the problems like when one of the component software behave erroneous, the entire system become faulty and how to estimate this kind of situations. In order to validate a component software system, an approach to inject residual software faults at the executable code of the targets in an accurate manner has been proposed [5]. The establishment of a utilization scenario for the injection of software faults from the beginning is important to help in identifying the requirements put on the accurate emulation of software faults. The software fault are injected according to the following principle:

Faults are injected in a given component to evaluate the behavior of the overall system in the presence of that faulty component. This help to have a separation between target component and system under observation. The behavior of the system under the presence of one faulty component is observed. Using this scenario three major uses can be identified

- 1. Validation of fault-tolerant mechanisms.
- 2. Prediction of worst-case scenarios and experimental risk assessment.
- 3. Dependability benchmarking.

The realistic emulation of residual software faults by fault injection at the target executable code is much more difficult. In fact, the problem of emulating software faults is intrinsically difficult. Software faults are by nature human-made faults (at the design, implementation, etc.) and it is extremely difficult to model human errors.

Fault injection techniques to assess the security is a particular case of software fault injection, focusing on software faults that represent security vulnerabilities. The existence of a vulnerability may not cause a security hazard, and in many times they can remain dormant for many years until right attack is discovered and applied to exploit that vulnerability. After an intrusion, the system might or might not fail, depending on the kind of capabilities it possesses to deal with errors introduced by the attacker. Intrusions would never arise if all vulnerabilities could be eliminated. Vulnerability removal [7] can be performed both during the development and operational phases. Vulnerability removal in the operational phase helps to identify programming flaws which can later be corrected. It also assists the discovery of configuration errors and other similar problems and can reduce the accessibility of the attacker by reducing the number of entry points into the system. Nuno

Neves et all [7] presents a tool called AJECT (Attack inJECtion Tool) that can be used for vulnerability detection and removal. It simulates the behavior of an adversary by injecting attacks against a target system. Then, it observes the execution of the system to determine if the attacks have caused a failure. If a failure occurs then there exist a vulnerability in the system. If a bug is identified, a developer can use a traditional debugging method and can eliminate the presence of it. AJECT targets network servers and local demons. It performs a blackbox testing knowing only the protocol specifications. Experiments with AJECT was conducted with IMAP servers and was able to detect identified bugs in the bug tracking system as well as new bugs which are not yet identified.

Security of Web applications has become increasingly important in the recent time. Nearly all information systems and business applications are now built as web-based database applications. The exposure of web application to a wide user audience make it more prone to attacks. Hence an existing vulnerability in web application will most probably be uncovered and will be exploited. Traditional defense strategies such as firewalls do not protect against Web application attacks, as these attacks rely solely on HTTP traffic, which is usually allowed to pass through firewalls unhindered. In recent years strongly typed languages like Java [10], has emerged as the language of choice for building large complex Web-based systems mainly due to language safety features that restrict direct memory access and eliminate problems such as buffer overruns. But, however secure the language is, a logical error can cause a vulnerability in the application which can lead to the failure of the system. Software faults can be detected by performing a static analysis to the code [10]. This is a labor intensive job, usually done with automated tools, although they lack the precision of the manual counterpart.

One of the aspects that contribute to security problems seems to be related to how bad different programming languages are in terms of propensity for mistakes. Clowes [9] discussed common security problems related to the easiness in programming with PHP and its features, but this affects many other programming languages. The choice of the type system (strong or weak) and the type checking (static or dynamic) of the programming language also affects the robustness of the software. For example, a strong typed language with a static type checking can help deliver a safer application without affecting its performance [21]. Scholte et al. [19] presented an empirical study on a large set of input validation vulnerabilities developed in six programming languages. However, that work focused on the relationship between the specific programming language used and the vulnerabilities

that are commonly reported, not going into details in what concerns the typical software faults that originate vulnerabilities.

The use of software code inspections, has been found to increase software quality and lower software development costs. Prior studies indicate that inspections can detect as little as 20% to as much as 93% of the total number of defects in a software. To improve the software quality and to help predict software failures, a new defect classification scheme was proposed in [13]. Automated software inspection (ASI) tools are usually utilized as static analysis tools, coding standard analysis tools, and source code analysis tools. These tools produce error messages similar to those of a compiler. However, they identify additional faults, such as coding standard non-compliance, uncaught runtime exceptions, security vulnerabilities, redundant code, division by zero, and memory leaks. ASI tools are intended to identify faults which allow the software engineers to recode before they surface more publicly as manual inspections faults or as test and field failures. the removal of the defects found by the ASI can allow the labor-intensive manual reviews to be more efficient and to focus on more complex, functional and algorithmic defects.

Measuring significance of software vulnerability can done by analyzing the likelihood of vulnerability discovery. So in-order to understand the software security, the vulnerability discovery's model(VDM) is created. Software security is the ability of a system to perform its required functions without software-caused violations of its explicit or implicit security policy. For a better understanding software security, two natures of software systems are considered.

- 1. Engineering nature: characterizing features like when was a vulnerability introduced, when was it discovered, how is the source code of a system changing, etc. This approach employs statistical analysis of vulnerabilities that have already been discovered and characteristics of the systems in which they were discovered.
- 2. **Economic nature:** characterizing features like what is the auction-ascertained price of a previously-unreported vulnerability in a specific system. Entities offer a steadily increasing reward for a vulnerability in a system: the first person to report such a vulnerability receives the reward. The reward serves as both an incentive to find a vulnerability and a measurement of the perceived value of that vulnerability

These two approaches provide insight into the number of vulnerabilities in a system, the rate at which they are detected, and the difficulty in doing so. Unfortunately neither of the

approach can fully provide information on how many vulnerabilities exist in a system.

The industry uses fuzzing and mutation testing to automate penetration testing of web applications. They rely on web application vulnerability scanner tools that also generate reports compliant with security regulations. Some of the best known of such tools are HP WebInspect, IBM Watchfire AppScan, Acunetix web application security scanner and WebSphinx. In spite of their continuous development, these tools still have many problems related to the high number of undetected vulnerabilities and high percentage of false positives, as shown by several studies [8]. To address these problems, it was proposed a method to benchmark these scanners [8]. The method starts by identifying all the points where each type of bug can be injected, then injecting the bug. Many of these bugs injected are vulnerabilities that can be used to test and compare the performance of the scanners.

Web applications usually are not monolithic but consist of several distributed components. During the development of the use communication protocols and the web components, different tools and programming languages may be used. White-box penetration testing tools usually require that all applications are developed in the same language (e.g., PHP ,Java etc) which is usually not the case in distributed environments. Black-box penetration testing tools are not really effective due to the weaknesses of the crawling step that misses lots of potential interaction with the user So the use of a model checkers for security analysis was proposed [11]. A formal model M for the specification of the System Under Validation (SUV) is used. In this case, the vulnerability is injected by mutating the formal model of the web applications. First, the model mutated to introduce specific vulnerabilities present in web applications. Then, a model checker outputs attack traces that exploit those vulnerabilities. Next, the attack traces are translated into concrete test cases by using a 2-step mapping. Finally, the tests are executed on the real system using an automatic procedure that may request the help of a test expert from time to time. The model is also used to generate test cases that are used to attack the web application in a semi-automatic way.

In a competitive commercial software market release of softwares must meet the strict deadlines [12]. A companies survival depends on the time at which the software is released to the market. In such a situation the question arise is "Is the software good enough to release now?". An easiest ways to judge whether a program is ready for release is to measure its defect density the number of defects per line of code. Suppose the first version of your product consists of 100,000 lines of code. Further suppose that you detected 650

defects prior to the software's release, and that 50 more defects were reported after release. The software therefore had a lifetime defect count of 700 defects, and a defect density of 7 defects per 1,000 lines of code (KLOC).

Another simple defect prediction technique is to separate defect reports into two groups; say Pool A and Pool B, and then track the defects in these two pools separately. The distinction between the pools is arbitrary ie. it is possible to put all the defects discovered on Mondays, Wednesdays, and weekends into Pool A, and the rest into Pool B. or split the test team down the middle and put each subgroup's reported defects into its own pool. It doesn't matter how the group is divided as long as both subgroups operate independently and both test the full scope of the product.

After grouping, track the number of defects reported in each pool and the number of defects reported. The number of unique defects reported at any given time is

$$Defects_{unique} = Defects_A + Defects_B - Defects_{(A+B)}$$

The number of total defects can then be approximated by the simple formula

$$Defects_{total} = \frac{Defects_A * Defects_B}{Defects_{(A+B)}}$$

The attacker's perspective has also been of some focus in the literature [9], [17], [23], but mainly through empirical data gathered by the authors highlighting social networking and what could be obtained from attacking specific vulnerabilities. Some studies analyzed the attacks from the victim's perspective, including the proposal of a taxonomy to classify attacks based on their similarities [2] and the analysis of attack traces from HoneyPots to separate the attack types [24]. There is, however, a lack of knowledge about existing exploits and their correlation with the vulnerabilities.

The list of possible types of vulnerabilities affecting web applications is enormous, but XSS and SQLi are at the top of that list, accounting for 32 percent of the vulnerabilities observed [3],[6].

An SQLi attack consists of tweaking the input fields of the webpage (which can be visible or hidden) in order to alter the query sent to the back-end database. SQL injection

attacks pose a serious security threat to Web applications [14]: they allow attackers to obtain unrestricted access to the databases underlying the applications and to the potentially sensitive information these databases contain. This allows the attacker to retrieve sensible data or even alter database records. In some cases, attackers can even use an SQL injection vulnerability to take control of and corrupt the system that hosts the Web application. SQL injection refers to a class of code-injection attacks in which data provided by the user is included in an SQL query in such a way that part of the users input is treated as SQL code. By leveraging these vulnerabilities, an attacker can submit SQL commands directly to the database. These attacks are a serious threat to any Web application that receives input from users and incorporates it into SQL queries to an underlying database. Most Web applications used on the Internet or within enterprise systems work this way and could therefore be vulnerable to SQL injection.

There are many types of SQLIAs and countless variations on these basic types. The different types of attacks are generally not performed in isolation; many of them are used together or sequentially, depending on the specific goals of the attacker. Some representative examples include

- Tautologies: used for Bypassing authentication, identifying injectable parameters, extracting data.
- 2. **Illegal/Logically Incorrect Queries**: used for Identifying injectable parameters, performing database finger-printing, extracting data.
- 3. Union Query: used for Bypassing Authentication, extracting data.
- 4. **Piggy-Backed Queries**: used for Extracting data, adding or modifying data, performing denial of service, executing remote commands.
- 5. **Stored Procedures**: used for Performing privilege escalation, performing denial of service, executing remote commands.
- 6. **Inference**: used for Identifying injectable parameters, extracting data, determining database schema.
- 7. Alternate Encodings: used for Evading detection.

An SQLi attack can be dormant for a while and only be triggered by a specific event, such as the periodic execution of some procedures in the database.

A XSS attack consists of injecting HTML and/or other scripting code (usually Javascript) in a vulnerable webpage. It exploits the common utilization of the user input (without sanitizing it first) as a building part of a webpage. When this occurs, by tweaking the input, the attacker is able to change some of its functions, allowing him to take advantage of users visiting that webpage. This attack exploits the confidence a user (victim) has on the website, allowing the attacker to impersonate these users and even execute other types of attacks such as cross site request forgery (CSRF) [1]. The injection of XSS can also be persistent if the malicious string is stored in the back-end database of the web application, therefore potentiating its malicious effects in a much broader way. Cross-site scripting vulnerabilities date back to 1996 during the early days of the World Wide Web (Web). Hackers found that when unsuspecting users visited their Web pages they could forcibly load any Web site (bank, auction, store, Web mail, and so on) into an HTML Frame within the same browser window. Then using JavaScript, they could cross the boundary between the two Web sites, and read from one frame into the other. They were able to pilfer usernames and passwords typed into HTML Forms, steal cookies, or compromise any confidential information on the screen.

An XSS attack manipulates content of a Web application and trick users into opening that page. A typical XSS attack work as follows:

- 1. Form on the page asks user for clicking a link, or entering username or password.
- 2. User takes the data submitted by the victim and store it in a database
- 3. User displays that data on the screen to other users.
- 4. Malicious user submits Script in their form submission, which performs an action when other users visit the page displaying the data they submitted

XSS vulnerabilities can be divided into following types:

- 1. Injection via URL
- 2. Injection by exploiting client side code
- 3. Injection by exploiting external feed displayed on a website
- 4. Injection via permanently displayed data

Cross-site scripting poses severe application risks as the users can unknowingly execute malicious scripts while viewing dynamically generated pages or content provided by an attacker. An attacker can take over the user session before the user's session cookie expires.

An attacker can connect users to a malicious server of his choice. An attacker who can convince a user to access a URL supplied by the attacker could cause script or HTML of the attacker's side to be executed in the user's browser.

A contribution to better understand the most common vulnerabilities in web applications was presented in a field study that classified 655 XSS and SQLi security patches of six widely used Linux, Apache, MySQL and PHP (LAMP) web applications [16]. When application vulnerabilities are discovered, software developers correct the problem releasing application updates or patches. These patches correcting vulnerabilities were used to understand which code is responsible for security problems. With this approach the code which caused security flaws can be classified.

For each web application tested, the methodology to classify the security patches is the following:

- 1. Verification of the patch to confirm if the version of the web application is available.
- 2. Analysis of the code with the vulnerability and of the code after being patched.
- 3. Classification of each code fix that is found in the patch.
- 4. Loop through the previous steps until all available patches of the web application are analyzed.

The study only deals with code defects and hence only use the Orthogonal Defect Classification (ODC) defect types that are directly related to the code are considered. These defect types are: **Assignment** (errors in code initialization), **Checking** (errors in program logic and validation), **Interface** (errors interacting among components), and **Algorithm** (errors related to the need of algorithm change without a design change).

Remote Code Execution (RCE) vulnerability refers to an attacker's ability to execute arbitrary program code on a target server. It is caused by user inputs in security sensitive functions such as file system calls (e.g., fwrite), code execution functions (e.g., eval), command execution functions (e.g., system), and directory creating functions (e.g., mkdir). It allows a remote attacker to execute arbitrary code in the system with administrator privileges. It is an extremely risky vulnerability, which can expose a web site to different attacks, ranging from malicious deletion of data to web page defacing. The following code depicts an RCE vulnerability.

```
$comments = $_POST['comments'];
```

```
$log = fopen('comments.php', 'a');
fwrite($log,'<br />'.'<br />'.'<center>'.'Comments::'.'<br />'.
$comments); //remote code execution possibility
```

The above code retrieves user comments and logs them without sanitization. This means that an attacker can execute malicious requests, ranging from simple information gathering using phpinfo() to complex attacks that obtain a shell on the vulnerable server using $shell_exec()$. Other sensitive PHP functions and operations associated with this vulnerability type include header, $preg_replace()$ with "/e" modifier on,

```
fopen , vassert , create_function , unserialize ,
$_GET['func_name'] , and $_GET['argument'].
```

File Inclusion vulnerability refers to an attackers ability to include a file that originates from a remote (possibly an attackers) server or ability to access/include a local file that is not intended to be accessed without proper authorization. It is caused by user inputs being part of filenames or the use of un-initialized variables in file operations. Consider the following code:

```
include($_GET['file']); //remote file inclusion possibility
```

An attack may conduct a file inclusion attack using the following values:

```
/include.php?file=http://evil.com/malicious.php
```

This attack causes the vulnerable PHP program to include and execute a malicious PHP file that may cause dangerous program behaviors. Similar PHP commands that may cause FI vulnerability includes *include_once*, *require*, and *require_once*. Moreover, an FI vulnerability may also appear with PHP operations that involve file accesses and file operations in which the attacker may be able to view restricted files, or even execute malicious commands on the web server that can lead to a full compromise of the system. For example, consider the following code:

```
$handle = fopen($_GET['newPath'], "r");
//local root file access possibility
```

In the above case, the input newPath is received from the HTTP GET parameter. An attacker could provide a value like

```
newPath \rightarrow "../../../etc/passwd\%00.txt"
```

in order to access the password file from the file system. The expression dot - dot - slash(.../) instructs the system to go one directory up. The attacker has to guess how many directories

he has to go up to find the user confidential folder on the system, but this can be easily done by trial and error. This vulnerability is also known as *directory traversal*

2.1 METHOD COMPARISON

Table 2.1: Comparison of various vulnerability analysis methods

Paper Name	Method Used	Implemented on	
Fault Injection and Dependability Evaluation of Fault-Tolerant Systems	Fault Injection	Hardware Level	
Xception: Software Fault Injection and Monitoring in Processor Func- tional Units	Fault Injection	Software Simulation	
Emulation of Software Faults: A Field Data Study and a Practical Approach	Bug Injection	Software Components	
Using Attack Injection to Discover New Vulnerabilities	Server Software	IMAP	
Finding Security Vulnerabilities in Java Applications with Static Analysis	Static Code Analysis	Java	
Preliminary Results on Using Static Analysis Tools for Software Inspection	Source Code Analysis	Coding Standard	
Semi-Automatic Security Testing of Web Applications from a Secure Model	Modal Analysis	Web Application Model	
Gauging Software Readiness with Defect Tracking	Defect Density	Software Defects	

Chapter 3

METHODOLOGY

The evaluation methodology is based on the injection of realistic vulnerabilities and the subsequent controlled exploit of those vulnerabilities in order to attack the system. This provides a practical environment that can be used to test counter measure mechanisms (such as IDS, web application vulnerability scanners, firewalls, etc.), train and evaluate security teams, estimate security measures (like the number of vulnerabilities present in the code, in a similar way to defect seeding [12]), among others. To obtain a realistic environment, true to life vulnerabilities will be consider. As mentioned before, results from a field study presented in [16] that classified 655 XSS and SQLi security patches of six widely used LAMP web applications are utilized. This data will help to define where a real vulnerability is usually located in the source code and what is the piece of code that is responsible for the presence of such vulnerability.

A typical web application is referenced, with a web front-end and an access to a back-end database to store the dynamic content and business data (Fig. 3.1). The vulnerabilities are injected in the web application following a realistic pattern. The information about what was injected is fed to the injection mechanism in order to improve the attack success rate.

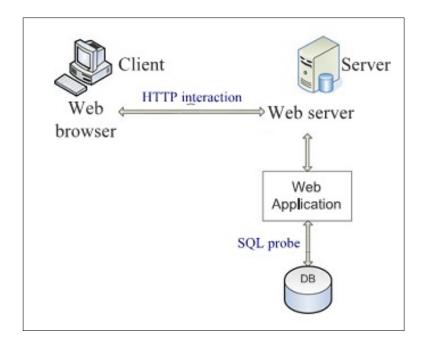


Figure 3.1: A normal Web Application Setup

The attack injection tool uses two external probes as shown in Fig 3.2: one for the HTTP communication and other for the database communication. These probes monitor the HTTP and SQL data exchanged, and send a copy to be analyzed by the attack injection mechanism.

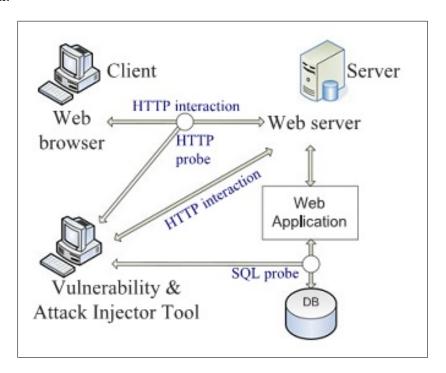


Figure 3.2: VAIT setup

This is a key aspect of the methodology to obtain the user interaction and the results produced by such interaction for analysis, so they can be used to prepare the attack. Therefore, the attack injection mechanism is aware of important inner workings of the application while it is running. For example, this provides insights on what piece of information supplied to a HTML FORM is really used to build the correlated SQL query and in which part of the query it is going to be inserted. The entire process is performed automatically, without human intervention.

For example, consider the evaluation of an IDS: during the attack stage, when the IDS inspects the SQL query sent to the database, the VAIT also monitors the output of the IDS to identify if the attack has been detected by the IDS or not. Only the final results of the attack injection has to be collected, which also contains, the IDS detection output.

3.1 ATTACK PROCEDURE

The attack procedure mainly consist of 4 stages

- 1. Preparation stage
- 2. Vulnerability injection stage
- 3. Attackload generation stage
- 4. Attack stage

3.1.1 Preparation Stage

In the preparation stage, the web application is interacted (crawled), executing all the functionalities that need to be tested (Fig.3.3). Both HTTP and SQL communications are captured by the two probes and processed for later use. The interaction with the web application is always done from the client's point of view. The outcome of this stage is the correlation of the input values, the HTTP variables that carry them and their respective source code files, and its use in the structure of the database queries sent to the back-end database (for SQLi) or displayed back to the web browser (for XSS).

Later, in the attack stage, the malicious activity applied is based on tweaking the values of the variables, which correspond to the text fields, combo boxes, etc., discovered in this preparation stage.

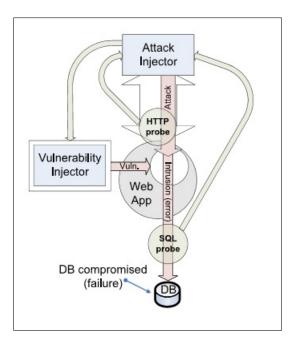


Figure 3.3: VAIT internal components

3.1.2 Vulnerability Injection Stage

In the vulnerability injection stage, the vulnerabilities are injected into the web application. For this purpose, it needs information about which input variables carry relevant information that can be used to execute attacks to the web application. This stage starts by analyzing the source code of the web application files searching for locations where vulnerabilities can be injected (Fig. 3.3). The injection of vulnerabilities is done by removing the protection of the target variables, like the call to a sanitizing function. This process follows the realistic patterns resulting from the field study presented in [16]. Once it finds a possible location, it performs a specific code mutation in order to inject one vulnerability in that particular location. The change in the code follows the rules derived from [16], which are described and implemented as a set of Vulnerability Operators.

The Vulnerability Operators are built upon a pair of attributes: the Location Pattern and the Vulnerability Code Change. The Location Pattern defines the conditions that a specific vulnerability type must comply with and the Vulnerability Code Change specifies the actions that must be performed to inject this vulnerability, depending on the environment where the vulnerability is going to be injected.

The vulnerability and attack injection uses both dynamic analysis and static analysis to

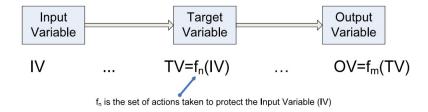


Figure 3.4: Chain of variables from input to output of the Web Application.

gather the data needed to apply the vulnerability operators. This analysis obtains not only the input variables (IV) that will be part of an output variable (OV), but also the chain of variables in between. If the web application is secured, one of the variables in the chain is sanitized or filtered (Fig. 3.4). This variable is called target variable (TV), because it is the one that the vulnerability injection stage will try to make vulnerable by removing or changing the protection scheme, according to the Vulnerability Operators. To inject a vulnerability using the Vulnerability Operators, information about the target variable and the code location (CL) where it is sanitized or filtered {TV, CL} is needed.

The preparation stage obtains the pairs $\{IV_{(dynamicanalysis)}; OV_{(dynamicanalysis)}\}$, which are the set of input variables $(IV_{(dynamicanalysis)})$ whose values come from the HTTP interaction or the SQL communication and their mapping with output variables $(OV_{(dynamicanalysis)})$. On the other side, the vulnerability injector tool performs a static analysis on the source code and finds the input variables $(IV_{(staticanalysis)})$ that are expected to be seen in the output $(OV_{(staticanalysis)})$ as part of the HTML response, SQL queries, etc. It also provides the target variable $(TV_{(staticanalysis)})$ and the code location $(CL_{(staticanalysis)})$ of the place in the file where the target variable is sanitized or filtered. Overall, the static analysis provides the following set of attributes: $\{IV_{(staticanalysis)}; OV_{(staticanalysis)}TV_{(staticanalysis)}, CL_{(staticanalysis)}\}$

The correlation of variables resulting from both static and dynamic analysis originates a more precise set of locations where the Vulnerability Operators may be used. The outcome of this correlation is an improved collection of vulnerabilities that has a higher rate of exploitability by the attack injection mechanism. The data must be provided by the set of attributes that come from the static analysis $\{IV_{(staticanalysis)}, OV_{(staticanalysis)}, OV_{(staticanalysis)}, TV_{(staticanalysis)}, CL_{(staticanalysis)}\}$, but improved by the pair of attributes that come from the preparation stage $\{IV_{(dynamicanalysis)}, OV_{(dynamicanalysis)}\}$ (Fig. 3.5). It considers the data from the set of attributes $\{IV_{(staticanalysis)}, OV_{(staticanalysis)}, TV_{(staticanalysis)}, TV_{(staticanalysis$

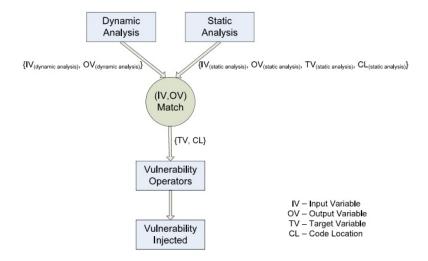


Figure 3.5: Using data from dynamic and static analysis to apply the vulnerability operators and inject a vulnerability.

 $CL_{(staticanalysis)}$ but only whose pairs {IV(staticanalysis), $OV_{(staticanalysis)}$ } are equivalent to any of the { $IV_{(dynamicanalysis)}$, $OV_{(dynamicanalysis)}$ }. The procedure to process the data from dynamic and static analysis to obtain the match outcome consisting of the pair of target variable and code location {TV, CL} needed to apply the vulnerability operators

3.1.3 AttackLoad Generation Stage

After having the set of copies of the web application source code files with vulnerabilities injected, the collection of malicious interactions (attackloads) that will be used to attack each vulnerability need to be generated. This is done in the attackload generation stage. The attackload is the malicious activity data needed to attack a given vulnerability. This data is built around the interaction patterns derived from the preparation stage, by tweaking the input values of the vulnerable variables.

The value that is assigned to the vulnerable variable, in order to attack it, results from a fuzzing process. In this process, the malicious value is obtained through the manipulation of the data provided by the good values of the vulnerable variable, the prefix (>,), ', ",...) and the suffix (<, #, ", ", ...), the use of attackload strings and predefined functions (Fig. 3.6). The fuzzing process consists of combining the available collection of prefixes, attackload strings and suffixes.

Figure 3.6: Fuzzer generated malicious variable value.

This stage also generates the payload footprints that have a one to one relationship with the attack payloads. The payload footprints are the expected result of the attack. They can be the malicious SQL queries text sent to the database, for the case of an SQLi attack; or the HTML of the web application response, for the case of a XSS attack. These payload footprints are fundamental, since they are used to assess the success of the attack.

3.1.4 Attack Stage

In the attack stage, the web application is, once again, interacted. However, this time it is a "malicious" interaction since it consists of a collection of attack payloads in order to exploit the vulnerabilities injected. The attack intends to alter the SQL query sent to the database server of the web application (for the case of SQLi attacks) or the HTML data sent back to the user (for the case of XSS attacks).

The vulnerable source code files (from the vulnerability injection stage) are applied to the web application, one at a time. Once again the two probes for capturing the HTTP and SQL communications are deployed and the collection of attackloads is submitted to exploit the vulnerabilities injected (Fig. 3.3). The interaction with the web application is always done from the web clients point of view (the web browser) and the attackload is applied to the input variables (the text fields, combo boxes, etc., present in the webpage interface). At the end of the attack, it is assessed for success. The detection of the success of the attack is done by searching for the presence of the payload footprint in the interaction data (HTTP or SQL communications) captured by the two probes. The process is repeated until all the injected vulnerabilities have been attacked.

3.2 VULNERABILITY & ATTACK INJECTOR TOOL

To demonstrate the feasibility of the proposed attack injection methodology, a prototype tool is developed; Vulnerability & Attack Injector Tool (VAIT). The VAIT prototype targets Linux, Apache, MySQL and PHP web applications, which is currently one of the most commonly used solution stack to develop web applications.

VAIT can injects vulnerabilities into the web application code and attacks them in a seamlessly manner. As explained earlier, the process of attacking the web application consists of 4 stages: the preparation stage, the vulnerability injection stage, the attackload generation stage and the attack stage (Fig 3.7). All this vulnerability and attack injection process will be done with minimum human intervention. The VAIT is configured with the web application folder location. Then the preparation stage is executed while the web application is being interacted. At the end, the vulnerability injection stage automatically generates the vulnerabilities, followed by the attackload generation stage that generates the attack payloads. At this point, the attack stage can be executed to attack the vulnerabilities, collect the results and calculate the attack success.

During the preparation stage, the web application is executed. This interaction can be made either manually, by someone executing every web application procedure that should be tested, or automatically using an external tool, such as a web application crawler. During this interaction, the VAIT monitors the HTTP communication between the web browser and the web server and all the SQL communications going to and from the database server.

Monitoring is implemented using built-in proxies specifically developed for the HTTP and for the SQL communications. These proxies send a copy of the entire packet data traversing them through the configured socket ports to the HTTP Communication Analyzer and MySQL Communication Analyzer components. Proxies run as independent processes and threads, so they are relatively autonomous. To guarantee synchronization with other components of the VAIT, a Sync mechanism was also built-in (Fig.3.7). The synchronism is obtained by executing each web application interaction in sequence without overlapping (i.e., without the common use of simultaneous threads to speedup the process) and gathering the precise time stamps of both the HTTP communication and respective SQL query. The interaction starts with the client actor (the browser of the user of the web application)

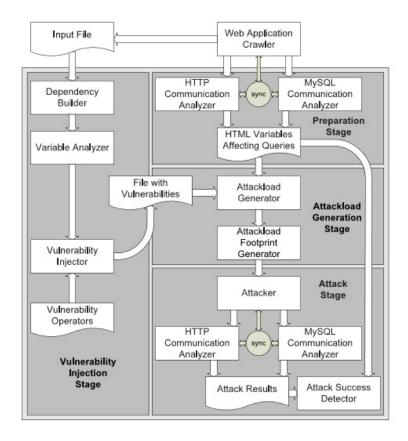


Figure 3.7: VAIT architecture.

sending one HTTP request that may lead SQL query requests to be sent to the database server. Next, the database server responds to the SQL query requests and sends the response back to the web application server. Finally, the application server sends the HTTP response back to the client actor. When the HTTP and SQL proxies capture these serialized operations they also register their time stamps, which allows the Sync mechanism to group this distributed set of actions into meaningful causeeffect sequences.

The information gathered by both proxies contains the structure of each webpage, the associated input variables, typical values and the associated SQL queries where these variables are used. During this interaction, the list of the web application files that are being run is also sent to the integrated Vulnerability Injector as input files. The vulnerability injector component is executed for each one, delivering the respective group of files with injected vulnerabilities.

The current paper detects only the SQL injection(SQLi) attack and Cross Site Scripting (XSS) attacks. These two are the most common vulnerability found in the web application world. These two attacks attack the application data and the user information available

with the system. But there are some other forms of attacks, targeting the server machine which runs these application itself. Attacks like Remote Code Execution (RCE) and File Inclusion (FI) attacks target the vulnerability in the web application and attacks the server machine instead of the web application. These kinds of attack can not only cause damage to the web application, but can even trouble the entire applications and services running on the main hardware and can even damage the normal working of the server operating system.

The VAIT tool proposed in the paper can be extended in order to identify the Remote Code Execution (RCE) and File Inclusion (FI) attack. Since these attacks does not necessarily need to have a communication with database, the attack cannot be identified by analyzing HTTP proxies and SQL proxies. Hence to identify these kinds of attack other methods have to be utilized. Static code analysis can identify these kinds of vulnerabilities easily but is very ineffective due to high false positive rates and low precision. One of the common way to identify these attacks are by analyzing the http data packets and performing a pattern matching analysis in it in order to identify erroneous patter.

A pattern mining approach based on dynamic analysis on input data and available information on method execution can easily identify attack injections of these kinds. So by utilizing a pattern mining algorithm and integrating it with the VAIT tool, the web application evaluation capability of the tool will be extended.

Chapter 4

CONCLUSION

The paper proposes a methodology to automatically inject realistic attacks in web applications. This methodology consists of analyzing the web application and generating a set of potential vulnerabilities. Each vulnerability is then injected and various attacks are mounted over each one. The attack injection consists of the introduction of realistic vulnerabilities that are afterwards automatically exploited. The success of each attack is automatically assessed and reported. To understand the feasibility of the method an attack injection tool VAIT is proposed which will try to automate the process with less human effort. The proposed tool can highlight and overcomes implementation specific issues. The system emphasized the need to match the results of the dynamic and the static analysis of the web applications. The toll will uses Linux, Apache, MySQL and Php for the evaluation purpose. The VAIT tool can be used as a practical environment that can be used to test counter measure mechanisms (such as IDS, web application vulnerability scanners, firewalls, etc.), train and evaluate security teams, estimate security measures.

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