

BotHunter

Detecting Malware Infection Through IDS-Driven Dialog Correlation



Guofei Gu¹, Phillip Porras², Vinod Yegneswaran², Martin Fong², Wenke Lee¹

> ¹College of Computing Georgia Institute of Technology

> ²Computer Science Laboratory SRI International









Emerging Internet Threats What Are Bots & Botnets? **Detection Difficulty**

Botnets Are Emerging Threats to Internet Security



НОМЕ	Security								
RESEARCH CENTERS	Whitepapers	Guides and Reports	Webcasts	Buyer's Guide					
Security	NetworkWorld.	<u>com</u> > <u>Security</u> >							
Anti-Virus / Spyware / Spam	Why we	e're losing tl	ne botn	et battle					
Compliance & Regulation	By Joaquim P. Menezes, CIO, 07/25/07								

The New Hork Times

nytimes.com

January 7, 2007

Attack of the Zombie Computers Is Growing Threat

By JOHN MARKOFF





Emerging Internet Threats What Are Bots & Botnets? Detection Difficulty

What Are Bots & Botnets Today?

- Bots: malware that has
 - a remote control facility (C&C)
 - IRC, HTTP, P2P
 - a spreading mechanism to propagate
 - Remote vulnerability scan, Email, Drive-by download, IM
- Botnets networks of bots
- Bots/Botnets are used for
 - DDoS, Spam, Click fraud, Data theft, ...







Detecting Bots/Botnets Is Difficult

- Bots are actively evolving
 - Infection vectors
 - Binary updates
 - C&C servers/communications
 - Scanning strategies
- Traditional IDSs/IPSs are less helpful in identifying bots (too many false positives)
- Only looking at one specific aspect is probably
 not enough







A Real Case Study Behavior-based Diaglog Correlation Architectural Overview

BotHunter Sensors Example botHunter Output

Bot infection case study: Phatbot





A Real Case Study BotHunter Sensors
Behavior-based Dialog Correlation
Architectural Overview

What Is BotHunter?

- **BotHunter** an IDS-Driven *Dialog* Correlation Engine
 - Protect enterprise/campus network
 - Monitors <u>two-way communication</u> flows between internal networks and the Internet for signs of bot and other malware
 - Correlates dialog trail of inbound intrusion alarms with outbound communication patterns
 - Produces a comprehensive 'bot' *Profile* that captures
 - Infection source/methods/pattern
 - identity of the locally infected host
 - most likely C&C address
- all related dialog warning summaries





A Real Case Study BotHunter Sensors
Behavior-based Dialog Correlation
Architectural Overview

Dialog-based Correlation

BotHunter employs an Infection Lifecycle Model

to detect host infection behavior

- Egress point (internal external)
- Search for duplex communication sequences that map to I.L. model
- Stimulus does not require strict ordering, but does require temporal locality







A Real Case Study Behavior-based Dialog Correlation Example botHunter Output Architectural Overview

BotHunter Sensors

BotHunter - Correlation Framework

Int. Host	Timer	E1 🕒	E2	E3	E4	E5
192.168.12.1	Θ	A _a A _b				
192.168.10.45	e	1 86 <i>4</i>	AcAd		A _e A _f	
192.168.10.66	e		Ag			6
192.168.12.46	¢				$A_h \ldots A_i$	$A_j \ldots A_k$
82 C						2
192.168.11.123	0 4	Aı	A _m A _n	Ao		

Network Dialog Correlation Matrix

Characteristics of Bot Declarations

- External stimulus alone cannot trigger bot alert
- •2 x internal bot behavior triggers bot alert





A Real Case Study Behavior-based Dialog Correlation **Architectural Overview**

BotHunter Sensors Example botHunter Output

BotHunter: Architecture Overview





A Real Case Study Behavior-based Dialog Correlation Architectural Overview BotHunter Sensors Example botHunter Output

BotHunter Sensor Suite : SCADE

SCADE: Statistical sCan Anomaly Detection Engine

- Custom malware specific weighted scan detection system for inbound and outbound sources
- Bounded memory usage to the number of inside hosts, less vulnerable to DoS attacks
- Inbound (E1: Initial Scan Phase):
 - suspicious port scan detection using weighted score
 - failed connection to vulnerable port = high weight
 - failed connection to other port = low weight
- Outbound (E5: Victim Outbound Scan):
 - S1 Scan rate of V over time t
 - S2 Scan failed connection rate (weighted) of V over t
 - S3 Scan target entropy (low revisit rate implies bot search) over t
 - Combine model assessments: Or, Majority voting, AND scheme





A Real Case Study Behavior-based Dialog Correlation Architectural Overview BotHunter Sensors Example botHunter Output

BotHunter Sensor Suite : SLADE

SLADE: Statistical payLoad Anomaly Detection Engine

- Suspicious payload detect: new "lossy" n-gram byte distribution analyzer over a limited set of network services
- Implements a lossy data structure to capture 4-gram hash space: default vector size = 2048. (Versus n=4, 256⁴ = 2³² ≈ 4Gb).
- Comparable accuracy as full n-gram scheme: low FP and FN
- General performance comparable to PAYL [Wang2004]: to detect all 18 attacks, the false positive of PAYL is 4.02%, SLADE is 0.3601%

Ke Wang, Salvatore J. Stolfo. "Anomalous Payload-based Network Intrusion Detection", RAID'04





A Real Case Study Behavior-based Dialog Correlation Architectural Overview

BotHunter Sensors Example botHunter Output

BotHunter Sensor Suite : Signature Engine

• Signature Set

• Replaces all standard snort rules with five custom rulesets: e[1-5].rules

• Scope: Dialog content

• Known worm/bot exploit signatures, shell/code/script exploits, malware update/download, C&C command exchanges, outbound scans

- Rule sources
 - Bleeding Edge malware rulesets
 - Snort community rules
 - Cyber-TA custom bot-specific rules
- Current Set
 - 1383 rules, operating on SRI/CSL and Georgia Tech networks, low FP







A Real Case Study Behavior-based Dialog Correlation Architectural Overview BotHunter Sensors
Example botHunter Output

Example BotHunter Infection Profile

Score:	1.95 (>= 0.8)
Infected Target:	192.168.166.40
Infector List:	192.168.166.20
C & C List:	192.168.166.10 (27)
Observed Start:	01/19/2007 17:15:27.60 EST
Report End:	01/19/2007 17:18:26.22 EST
Gen. Time:	01/19/2007 17:18:26.22 EST

Example VMWare RBot Experiment

 Initial Bot Infector:
 192.168.166.20

 Victim System:
 192.168.166.40

 Coordination Center:
 192.168.166.10

INBOUND SCAN

EXPLOIT

192.168.166.20 (2) (17:15:27.60 EST) E2[rb] SHELLCODE x86 0x90 unicode NOOP

EXPLOIT (slade)

192.168.166.20 (2) (17:15:27.60 EST) E2[sl] Slade detected suspicious payload exploit with anomaly score 2312.725576.

EGG DOWNLOAD

192.168.166.20 (2) (17:15:27.96 EST) E3[rb] TFTP GET .exe from external source 1028->69 (17:15:27.96 EST)

C and C TRAFFIC

192.168.166.10 (27) (17:15:46.56 EST-17:18:26.22 EST) E4[rb] BLEEDING-EDGE TROJAN IRC NICK command 1029->6668 (17:15:46.56 EST) E4[rb] BLEEDING-EDGE TROJAN BOT - potential scan/exploit command

OUTBOUND SCAN

192.168.166.20 (17:16:42.18 EST)

E5[sc] scade detected suspicious scanner [192.168.166.40] scanning 30 IPs at ports [0 135 ...]



August 9, 2007





Detection Performance at SRI Detection Performance at Georgia Tech False Positive Test

Detection Performance at SRI Honeynet

	3 Month Infection Count Number of Unique Attackers Number of DNS lookups		7, 6, 2,	7,204 6,650 2,859		-	Live Internet Monitoring Apparatus examines BotHunter detection coverage (TP analysis)										
L	Infections missed by BotHunter					14 Detection rate > 99.8% so far											
	Population			Analyses				Foroneice			Analysis						
	F		ynain				Alla	iy se	;5		F		 		larys	12	=
<u>Time</u>	Victim OS	Infection Source	C&C Server	DNS Lookups	Infection Port	Packet Trace	Detection Signatures	Infection Chatter	BotHunter Score	BotHunter Profile	Forensic Logs	Antivirus Labels	Packed egg.exe	Unpacked egg.exe	Unpacked egg.asm	Data Strings	Syscall Trace
00:26:00	WinXP	US: 130.13.160.76	n/a		445	pcap	raw alerts	ftp 12 lines	Yeah : 0.8	profile	summary tarball	<u>10 of 29</u>	<u>c4709f16a6</u>	<u>none</u> [4]	none:none	none	trace
00:47:00	WinXP	TW: 59.104.41.147	n/a	UA:citi-bank.ru	445	pcap	raw alerts ruleset	<u>http</u> <u>1 line</u>	Yeah : 1.3	profile	<u>summary</u> <u>tarball</u>	<u>29 of 29</u>	<u>d6df3972a0</u>	<u>15d31ff96b</u> [0]	ASM:Graph	<u>lines=149</u>	trace
01:14:00	Win2K-f	US: 65.141.157.211	n/a		445	pcap	raw alerts ruleset	<u>http</u> 118 lines	Yeah : 0.8	profile	summary tarball	<u>25 of 29</u>	<u>a7c70c4cbc</u>	a7c70c4cbc [1]	ASM:Graph	<u>lines=697</u>	trace
02:11:00	WinXP	US: 71.70.215.119	n/a	DE:siliconfireware.ru US:ebookfinaltrash.ru :wpad	445	pcap	<u>raw alerts</u> <u>ruleset</u>	<u>http</u> <u>1 line</u>	Yeah : 0.8	profile	<u>summary</u> <u>tarball</u>	<u>29 of 29</u>	al2cab51ef	<u>none</u> [4]	none:none	none	trace
02:46:00	Win2K-f	CA: 216.167.252.64	n/a		445	pcap	<u>raw alerts</u> <u>ruleset</u>	<u>http</u> <u>1 line</u>	Yeah : 0.8	profile	<u>summary</u> <u>tarball</u>	none	none	none	none	none	none
02:52:00	WinXP	US: 71.121.157.247	n/a	UA:citi-bank.ru	445	pcap	<u>raw alerts</u> <u>ruleset</u>	<u>http</u> <u>1 line</u>	Yeah : 1.3	profile	<u>summary</u> <u>tarball</u>	<u>29 of 29</u>	8ae2cc2e80	f <u>1ed53cb52</u> []]	ASM:none	lines=2	trace
eorgia Tech		lege of nputing	http://	www.cyber-ta	org	/rel	ruleset ease	<u>1 line</u>	alwai	re-ar	alys	is/p	ublic			(







Detection Performance at SRI Detection Performance at Georgia Tech False Positive Test

Detection Performance at Georgia Tech

- Virtual network, detect all 10 bots, including
 - AgoBot, Phatbot
 - RBot, RxBot
 - WisdomBot/SdBot/SpyBot
 - GTBot
- Real capture in live network
 - Feb. 2007, Georgia Tech, CoC network
 - BotHunter declared a bot infection via dialog warnings E1, E4, E5
 - E4 (C&C Server) address seen in both Shadow Server and the botnet mailing list





Detection Performance at Georgia Tech Detection Performance at SRI **False Positive Test**

False Positive Test

- Georgia Tech, college of computing, live deployment
 - Less than 1 (false profiles) per day in a 4 month real-time operation
- SRI computer science lab
 - 1 false positive in a 10-day trace





Summary

- New network perimeter monitoring strategy: dialog correlation
- New bot detection system: BotHunter
- Free Internet release at



http://www.cyber-ta.org/BotHunter/



Georgia

Collegeof

Tech Computing



17