

# Improve DDoS Botnet Tracking with Honeypots

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# Agenda



- About DDoS botnet tracking
- DDoS botnet families and their PGAs (Packet Generation Algorithm)
- Backscatter collection and analysis
- PGA analysis
- Experiments

# DDoS botnet tracking

- It's aimed to learn botnet assisted DDoS attacks
  - **4w**: **w**ho is being attacked by **w**hat botnet families under **w**hich C2 controllers with **w**hat set of attacking parameters (e.g., attack type)

```
2016/11/23 15:15:07 mirai securityupdates.us 5.188.232.103 23 ddos tcp_ack_flood, target=109.163.224.34, mask_bits=32, atk_time=60, payload_size=1
2016/11/23 15:15:08 mirai timeserver.host 188.209.49.106 23 ddos tcp_ack_flood, target=109.163.224.34, mask_bits=32, atk_time=60, payload_size=1
2016/11/23 15:50:27 mirai cnc.routersinthis.com 93.158.212.81 23 ddos udp_flood, target=217.68.245.94, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 15:50:27 mirai ftp.xenonbooter.xyz 93.158.212.81 23 ddos udp_flood, target=217.68.245.94, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:18:10 mirai cnc.routersinthis.com 93.158.212.81 23 ddos udp_flood, target=82.144.163.26, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:18:10 mirai ftp.xenonbooter.xyz 93.158.212.81 23 ddos udp_flood, target=82.144.163.26, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:26:37 mirai cnc.routersinthis.com 93.158.212.81 23 ddos udp_flood, target=94.14.175.22, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:26:37 mirai ftp.xenonbooter.xyz 93.158.212.81 23 ddos udp_flood, target=94.14.175.22, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:51:30 mirai cnc.routersinthis.com 93.158.212.81 23 ddos udp_flood, target=90.221.219.57, mask_bits=32, port=80, atk_time=100, port=80
2016/11/23 17:51:30 mirai ftp.xenonbooter.xyz 93.158.212.81 23 ddos udp_flood, target=90.221.219.57, mask_bits=32, port=80, atk_time=100, port=80
```

time

family

C2 domain

C2 IP/port

command type

attack target & parameters

# Stats on our tracking



- Our tracking started in 2014
- 30+ botnet families
- 6,000+ successfully tracked botnets
- 800+ million received attack commands
- 250K+ checked attack targets
- Our data has been shared many times with colleagues outside of our company

# How to evaluate it?



- For evaluation purpose, we need to know:
  - what *family-unknown* botnets are active in the wild?
  - what *family-known* C2 controllers are outside of our tracking list?
- Therefore we need information about the real attacks, and a method to connect them to the used botnet families

# DDoS backscatter



- It's generated due to the use of spoofed source IPs in attacking packets
  - e.g., TCP SYN-ACKs acknowledged to spoofed SYNs
- It's known as a cause of dark space traffic in parallel with scanning and network misconfigurations
- Solutions to detect & monitor DDoS attacks based on backscatters have been proposed in the past years

# Darknet? Or honeypot?



	Pros.	Cons.
Darknet	<ul style="list-style-type: none"><li><input type="checkbox"/> Collect a large number of packets destined to a block of unused addresses</li></ul>	<ul style="list-style-type: none"><li><input type="checkbox"/> Non-trivial deployment</li></ul>
Honeypot	<ul style="list-style-type: none"><li><input type="checkbox"/> Cost effective</li><li><input type="checkbox"/> Easy to deploy</li></ul>	<ul style="list-style-type: none"><li><input type="checkbox"/> Less packets collected</li></ul>

# Our scheme



- Full traffic captures are taken on our dozens of low-interaction honeypots
- A special mechanism is designed to separate the **wanted** traffic from the **unwanted**
  - *wanted*: traffic generated by honeypot applications
  - *unwanted*: scans, backscatters, etc.



# PGA: Packet Generation Algorithm



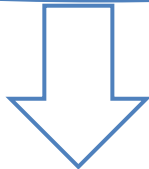
- In modern botnets, attacking packets are usually generated by the bots according some specific algorithm which we call PGA
- PGA attributes:
  - It's attack type specific
  - It's usually family specific
  - Fixed patterns usually exist in the generated packets
- Botnet families can be identified by PGA signatures

# MIRAI's PGA for *stomp* attack



[\*] copied from `attack_tcp_stomp()` of `attack_tcp.c`

```
00472:         iph->check = 0;
00473:         iph->check = checksum_generic((uint16_t *)iph, sizeof (struct iphdr));
00474:
00475:         tcp->seq = htons(stomp_data[i].seq++);
00476:         tcp->ack_seq = htons(stomp_data[i].ack_seq);
00477:         tcp->check = 0;
```



fixed “**0x0000**” can be found in **`tcp->seq`** and **`tcp->ack_seq`**

# MIRAI's PGA for *gre\_eth* attack



[\*]copied from *attack\_gre\_eth ()* in *attack\_gre.c*

```
00271:         if (ip_ident == 0xffff)
00272:         {
00273:             iph->id = rand_next() & 0xffff;
00274:             greiph->id = ~(iph->id - 1000);
00275:         }
00276:         if (sport == 0xffff)
00277:             udph->source = rand_next() & 0xffff;
00278:         if (dport == 0xffff)
00279:             udph->dest = rand_next() & 0xffff;
00280:
00281:         if (!gcip)
00282:             greiph->daddr = rand_next() & 0xffff;
00283:         else
00284:             greiph->daddr = iph->daddr;
```

*greiph->id* is bound to *iph->id*

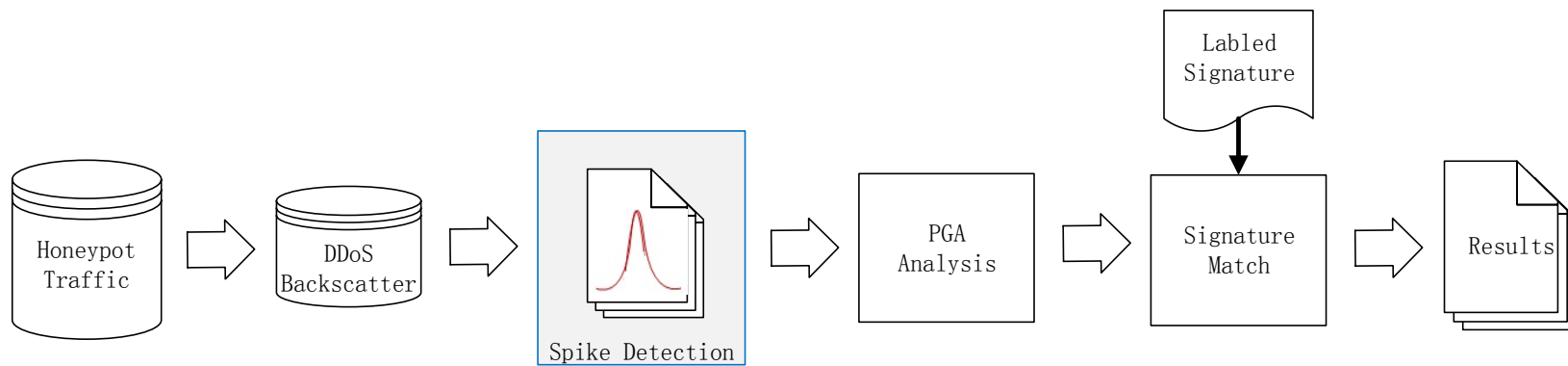
*greiph->daddr* is bound to *iph->daddr*

# From packets to bot families



- Buggy implementation and design flaws lead to PGA signatures which can be characterized by their packets
- PGA signatures can also be concluded by reverse engineering the bot sample
- It's possible to correlate an DDoS attack to the used botnet families by PGA signature matching

# The architecture overview



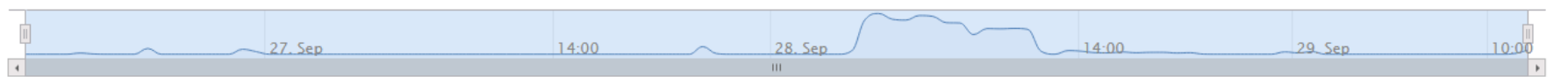
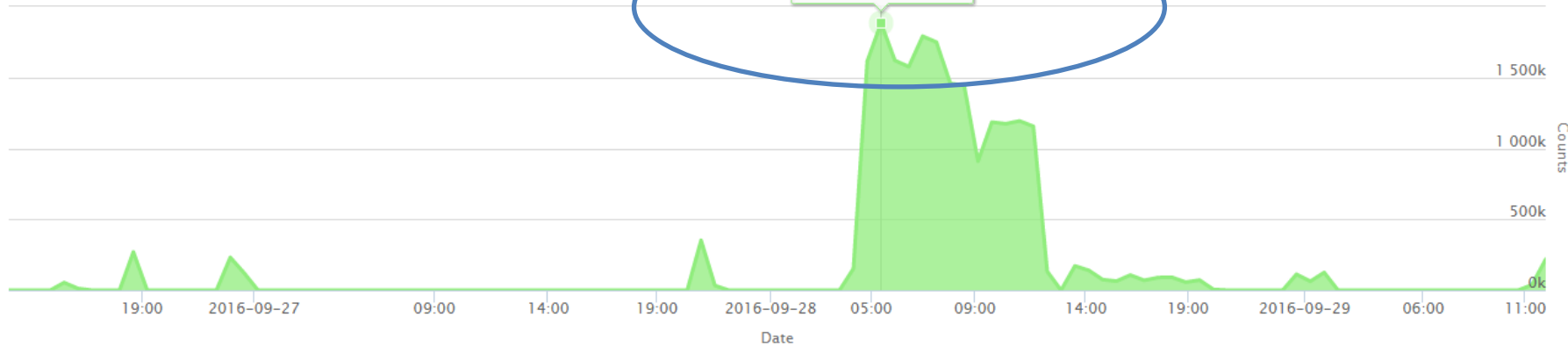
# A TCP-SYN spike example

start: 2016-09-26 12:00:00 end: 2016-09-29 12:00:00 ip: 122.228.30.11 port: 80 proto: tcp update

IP Flow Chart

Zoom **ID** 3D All

From 2016-09-26 12:51:01 To 2016-09-29 11:55:39

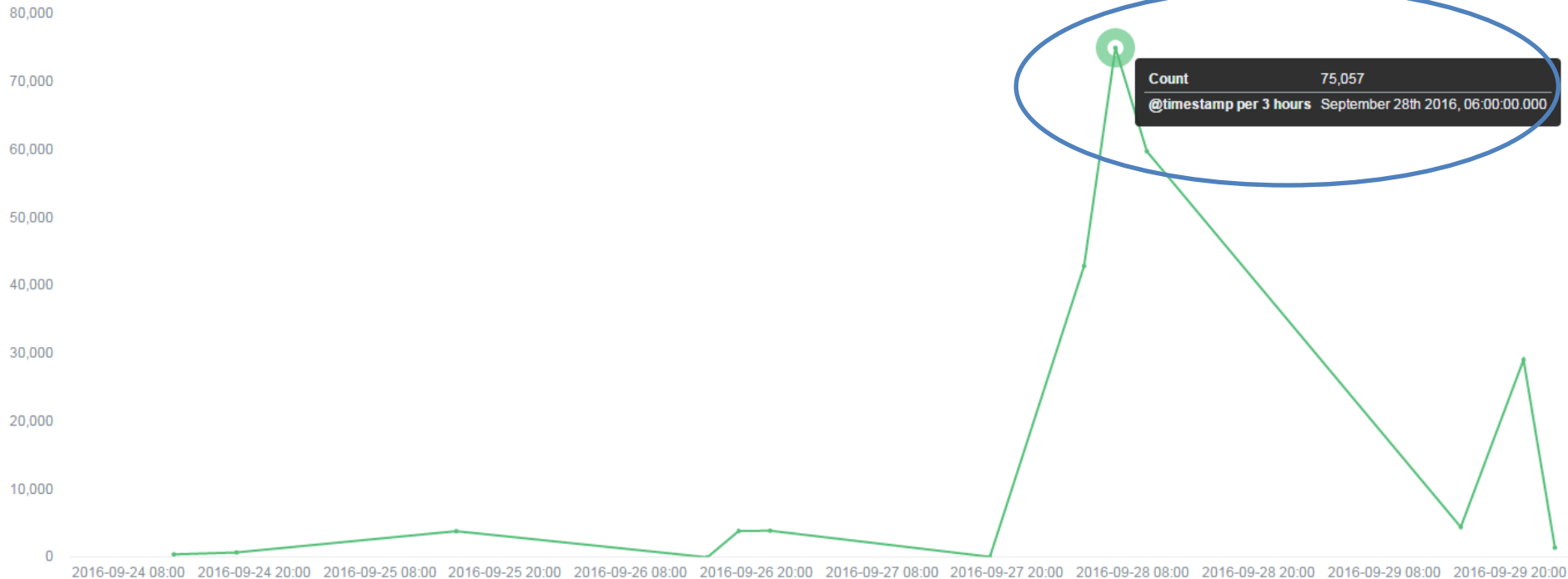


flows packets uip bps

# The reflected spike



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# Our spike detection scheme



- Backscatters are sub-grouped based on:
  - {packet type, source IP, source port}
  - or {packet type, queried domain} in case DNS responses

Policy name	Description
PACKET_TIME_INTERVAL	If 2 packets' interval is less than this value, they are grouped to the same spike.
LEAST_NUMBER_OF_PACKETS	The least number of packets a valid spike MUST have.
LEAST_NUMBER_OF_HONEYPOTS	The least number of honeypots a valid spike MUST hit.



# 3 supported backscatters



- TCP SYN-ACK packets for detecting SYN flood
- DNS response packets for detecting query flood
- ICMP unreachable messages
  - ICMP type=3, code=3
  - The original attacking packets could be restored

# Restoring attacking pkt fields



Backscatter type	Restored attacking packet fields
TCP SYN-ACK	<ul style="list-style-type: none"><li><input type="checkbox"/> source/destination IP/port</li><li><input type="checkbox"/> initial sequence number</li></ul>
DNS response	<ul style="list-style-type: none"><li><input type="checkbox"/> source/destination IP</li><li><input type="checkbox"/> source port</li><li><input type="checkbox"/> transaction ID (tid for short)</li><li><input type="checkbox"/> queried domain</li></ul>
ICMP unreachable message	<ul style="list-style-type: none"><li><input type="checkbox"/> sip/dip/sport/dport/ISN for SYN</li><li><input type="checkbox"/> sip/dip/sport/tid for DNS query</li></ul>

# Packet feature vector & matrix

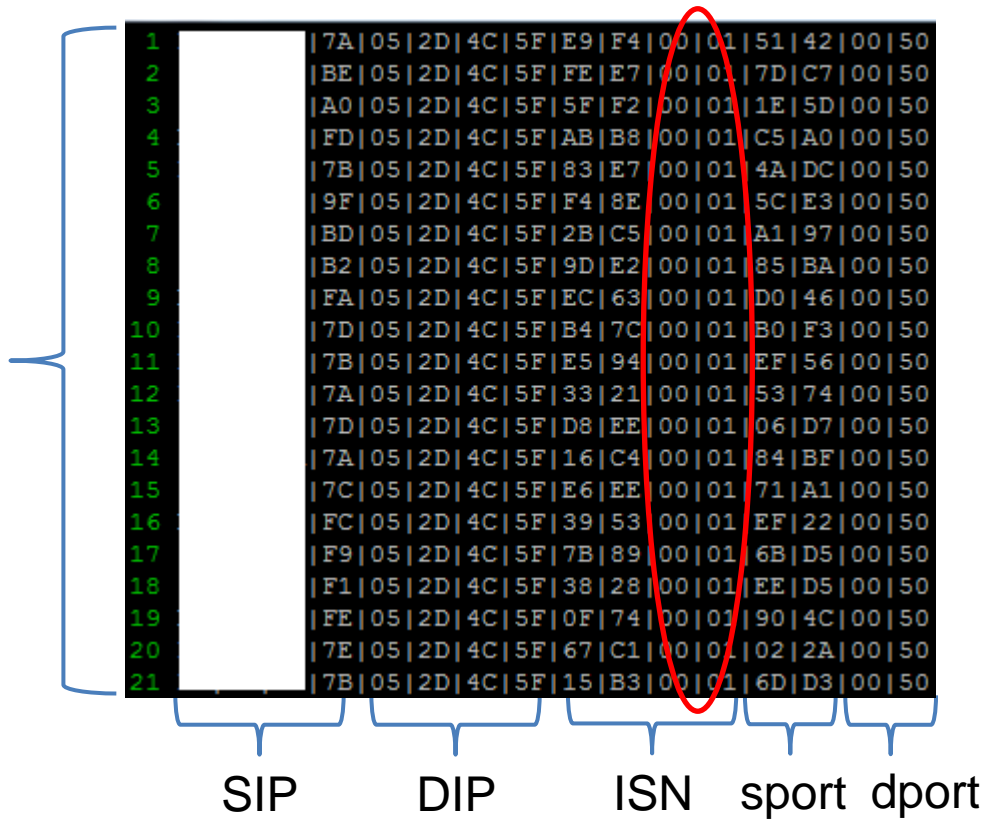


- They are defined to find the fixed patterns in attacking packets
  - And to calculate the spike feature vector
- The vector is constructed by restored field bytes
  - A 16-dimension vector for SYN packet
    - {sip, dip, ISN, sport, dport}
  - A 12-dimension vector for DNS query packet
    - {sip, dip, sport, transaction-id}

# A real SYN packet feature matrix

fixed patterns

21 packets



1	7A	05	2D	4C	5F	E9	F4	00	01	51	42	00	50
2	BE	05	2D	4C	5F	FE	E7	00	01	7D	C7	00	50
3	A0	05	2D	4C	5F	5F	F2	00	01	1E	5D	00	50
4	FD	05	2D	4C	5F	AB	B8	00	01	C5	A0	00	50
5	7B	05	2D	4C	5F	83	E7	00	01	4A	DC	00	50
6	9F	05	2D	4C	5F	F4	8E	00	01	5C	E3	00	50
7	BD	05	2D	4C	5F	2B	C5	00	01	A1	97	00	50
8	B2	05	2D	4C	5F	9D	E2	00	01	85	BA	00	50
9	FA	05	2D	4C	5F	EC	63	00	01	D0	46	00	50
10	7D	05	2D	4C	5F	B4	7C	00	01	B0	F3	00	50
11	7B	05	2D	4C	5F	E5	94	00	01	EF	56	00	50
12	7A	05	2D	4C	5F	33	21	00	01	53	74	00	50
13	7D	05	2D	4C	5F	D8	EE	00	01	06	D7	00	50
14	7A	05	2D	4C	5F	16	C4	00	01	84	BF	00	50
15	7C	05	2D	4C	5F	E6	EE	00	01	71	A1	00	50
16	FC	05	2D	4C	5F	39	53	00	01	EF	22	00	50
17	F9	05	2D	4C	5F	7B	89	00	01	6B	D5	00	50
18	F1	05	2D	4C	5F	38	28	00	01	EE	D5	00	50
19	FE	05	2D	4C	5F	0F	74	00	01	90	4C	00	50
20	7E	05	2D	4C	5F	67	C1	00	01	02	2A	00	50
21	7B	05	2D	4C	5F	15	B3	00	01	6D	D3	00	50

SIP      DIP      ISN      sport      dport

# Spike feature vector



- It's used to find the bound relations among attacking packet fields, and to do spike clustering
- It's obtained by calculating the *Shannon Entropy* of each column of packet feature matrix

# A real DNS spike feature vector

21 packets

1	32	7C	6E	4D	8A	D2	68	36	7B	32
2	1A	7B	D2	E9	18	21	8E	2B	7A	1A
3	32	7C	24	4D	34	3C	68	36	7B	32
4	1A	7E	CB	7F	3D	A6	8E	2E	7D	1A
5	7F	E8	D2	B1	7C	A6	D8	D6	E7	7F
6	8E	7C	54	34	6E	B2	08	5E	7B	8E
7	32	7E	4F	8E	32	1E	68	38	7D	32
8	32	7E	45	02	02	4B	68	38	7D	32
9	8E	7B	B9	08	18	20	08	5D	7A	8E
10	8E	7C	D5	F1	32	7B	08	5E	7B	8E
11	DA	F9	D8	44	A6	A1	B0	29	F8	DA
12	DA	F9	C8	9E	0E	AD	B0	29	F8	DA
13	1A	7C	D8	DB	23	11	8E	2C	7B	1A
14	1A	7C	3D	C1	EE	C7	8E	2C	7B	1A
15	32	7C	B1	7C	60	0A	68	36	7B	32
16	32	7A	5B	6D	F1	82	68	34	79	32
17	8E	7E	58	F7	1A	E4	08	60	7D	8E
18	1A	7E	01	22	DB	BD	8E	2E	7D	1A
19	32	7E	18	72	F2	A9	68	38	7D	32
20	32	7B	CB	0D	44	37	68	35	7A	32
21	32	7C	B7	3F	A1	1A	68	36	7B	32

sip.o3=tid.low

sip.o4=tid.high+1

SIP

DIP

sport

tid

{e1=1.52, e2=1.52, e3=1.52, e4=1.87, e5=4.16, e6=4.65, e7=4.60, e8=4.60, e9=1.52, e10=2.81, e11=1.87, e12=1.52}

# Spike clustering & PGA profiling



- Spike clustering is to find the similar spikes that are probably generated by the same family
- PGA is profiled in 2 ways:
  - fixed patterns are detected by checking element of 0.0
  - bounds are detected by checking the same elements
- The profiling result is used for signature matching

# About the bound relation



- One field is derived from another one:

$$field\_n = f(field\_m)$$

- While the simplest bound relation is simple byte sharing, the real situation is complicated
- Our approach only detects the bound relations, with the exact relations left for manual analysis



# About the evaluation



- If a detected spike is not successfully correlated, it means there are family unknown botnets in the wild
- If a spike is successfully correlated, we just check our tracking list to see whether the attack has been tracked or not

# Experiments

- 2,333 SYN-ACK spikes and 1,835 DNS spikes are checked
  - from August, 2015 to October, 2016
- 4 large PGA clusters are found

Cluster	PGA signatures	Spikes	Botnet family
sa_cls1	$\{(p_9=p_{13}), (p_{10}=p_{14})\}$	1318	XOR.DDoS
sa_cls2	$\{(p_{13}=0x00), (p_{14}=0x01)\}$	131	<i>unknown</i>
dns_cls1	$\{(p_4=p_{11}+1), (p_3=p_{12})\}$	626	<i>unknown</i>
dns_cls2	$\{(p_3=p_9), (p_4=p_{10})\}$	21	<i>unknown</i>

# About dns\_cls1



- It can be connected to a family-unknown attack tool which supports DNS random subdomain attack

```
2015-11-20 13:04:04 resolver=125.132.239.21, sport=36395, tid=31258, qname=olslix.quanshuwu.com
2015-11-20 13:20:10 resolver=85.46.222.186, sport=2144, tid=32142, qname=irozuz.quanshuwu.com
2015-11-20 13:32:41 resolver=118.125.92.160, sport=2141, tid=31374, qname=wxctwb.quanshuwu.com
2015-11-20 13:36:47 resolver=82.101.215.69, sport=2142, tid=31630, qname=ahwdozqhqbujoyx.quanshuwu.com
2015-11-20 13:36:51 resolver=190.0.1.171, sport=30766, tid=32026, qname=ibwnexgnwxurcd.quanshuwu.com
2015-11-20 13:38:42 resolver=31.165.247.192, sport=26680, tid=32050, qname=fydrgrw.quanshuwu.com
2015-11-20 13:47:12 resolver=94.232.149.33, sport=2144, tid=32142, qname=mlmfyzav.quanshuwu.com
2015-11-20 13:51:27 resolver=182.255.72.235, sport=26678, tid=31538, qname=qzgngvcncfkbczwn.quanshuwu.com
```

- It shares the same subdomain pattern with Elknot/BillGates, but has different PGA signature
- It's still active, and mainly used to attack China online-game domains

# Conclusions



- A backscatter collection scheme with honeypots
- A spike based attack detection scheme from DDoS backscatters
- A PGA analysis approach based on recovered attacking packet fields

# Q&A

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