



## Multidimensional Investigation of Source Port 0 Probing

*By*

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# MULTIDIMENSIONAL INVESTIGATION OF SOURCE PORT 0 PROBING

**Elias Bou-Harb, Nour-Eddine Lakhdari, Hamad Binsalleeh and  
Mourad Debbabi**

# Motivation

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Deep cyberattacks cost U.S.  
banks millions

Google Warns Thousands Of Users About  
Potential State-Sponsored Cyber Attacks

Syria, aided by Iran, could strike back at  
US in cyberspace

Cyber attacks hit Twitter and New York  
Times

Senate website, CIA.gov reportedly  
hacked. LulzSec claims responsibility.

Facebook computers compromised by zero-  
day Java exploit

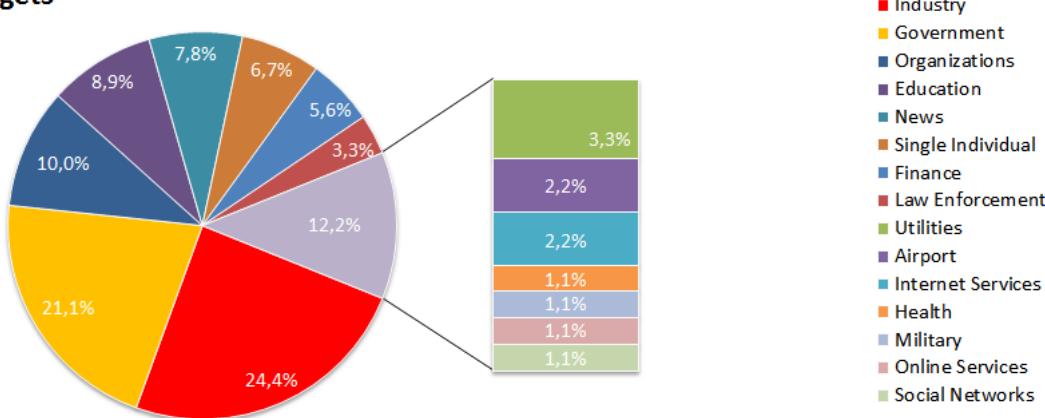
Chinese authorities say massive DDoS attack  
took down .cn domain

Hack Attack: Sony Confirms PlayStation  
Network Outage Caused By 'External Intrusion'

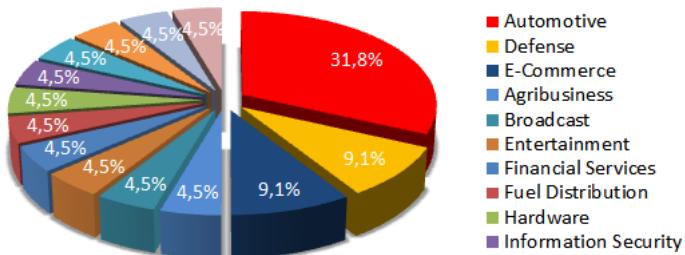
# Motivation

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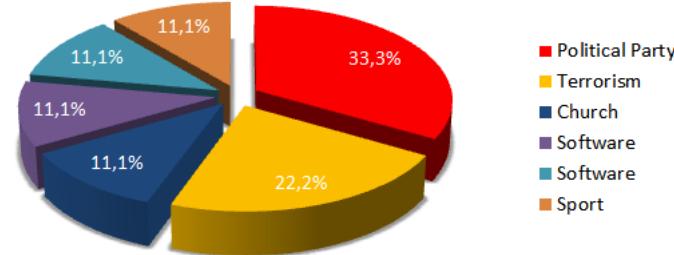
Distribution Of Targets



Industry Fragmentation



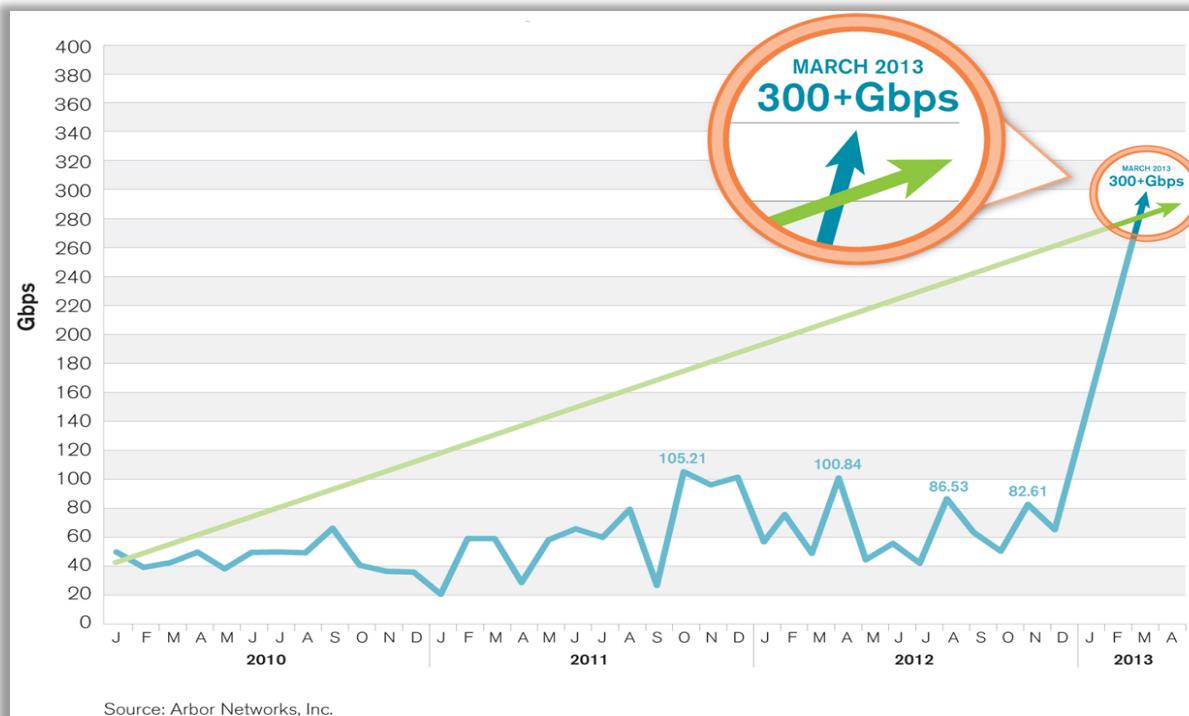
Organization Fragmentation



# Motivation

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- Attacks on cyber physical systems rose 52% in 2013
- The surge of severe DDoS attacks



# Motivation

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Daily tens of thousands of threats (NCFTA Canada 2014)

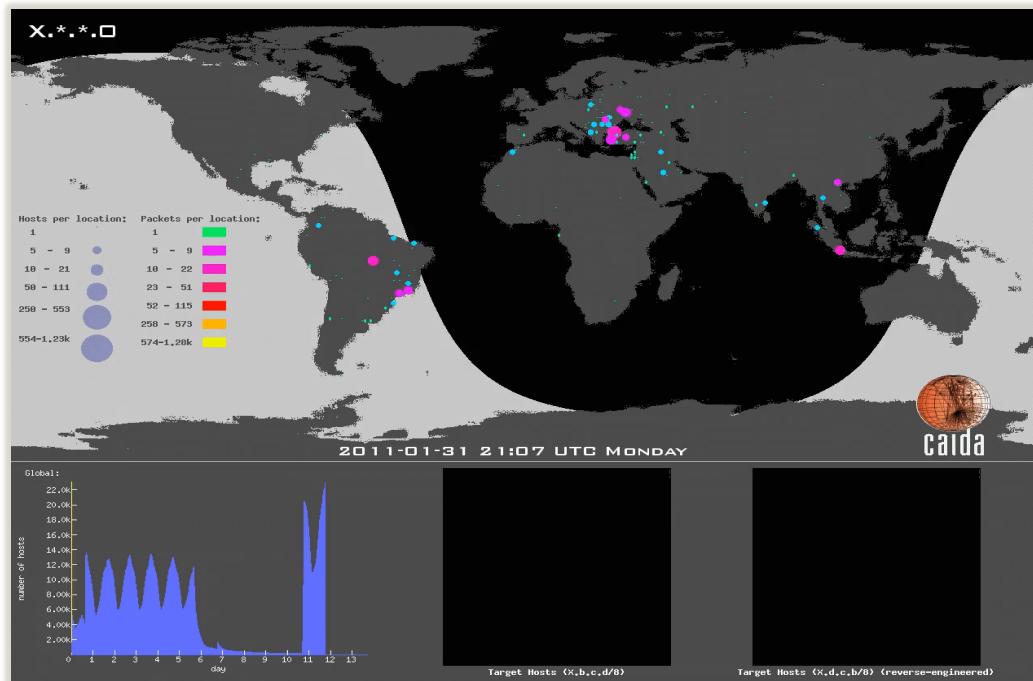
# Motivation

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## □ Probing:

- Scan organizational networks or Internet wide services
- Primary stage of an intrusion attempt
- Facilitates more than 50% of cyber attacks

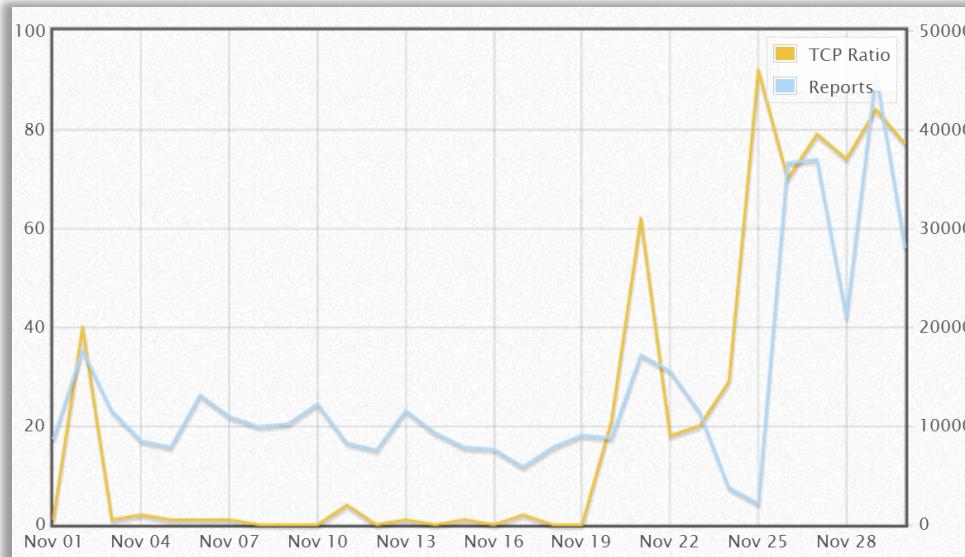
## □ Large-scale orchestrated probing campaigns



# The event

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- Traffic originating from TCP source port 0
- Investigated on November 24th and 25th, 2014



Inferred & Validated by Internet Storm Center (ISC)

# Objectives

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- Investigate the nature of such unprecedented increase of traffic originating from source port 0
- Infer the maliciousness of the sources
- Attribute the event to a certain malware infection

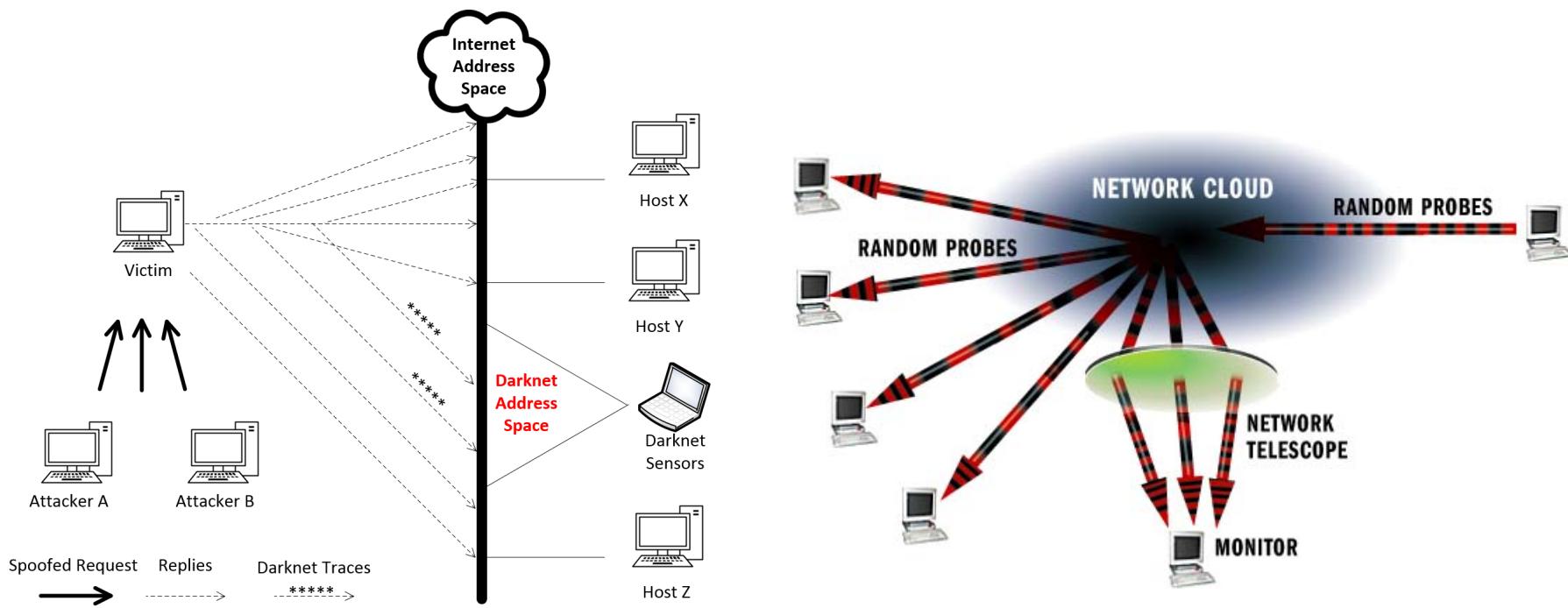
# Approach

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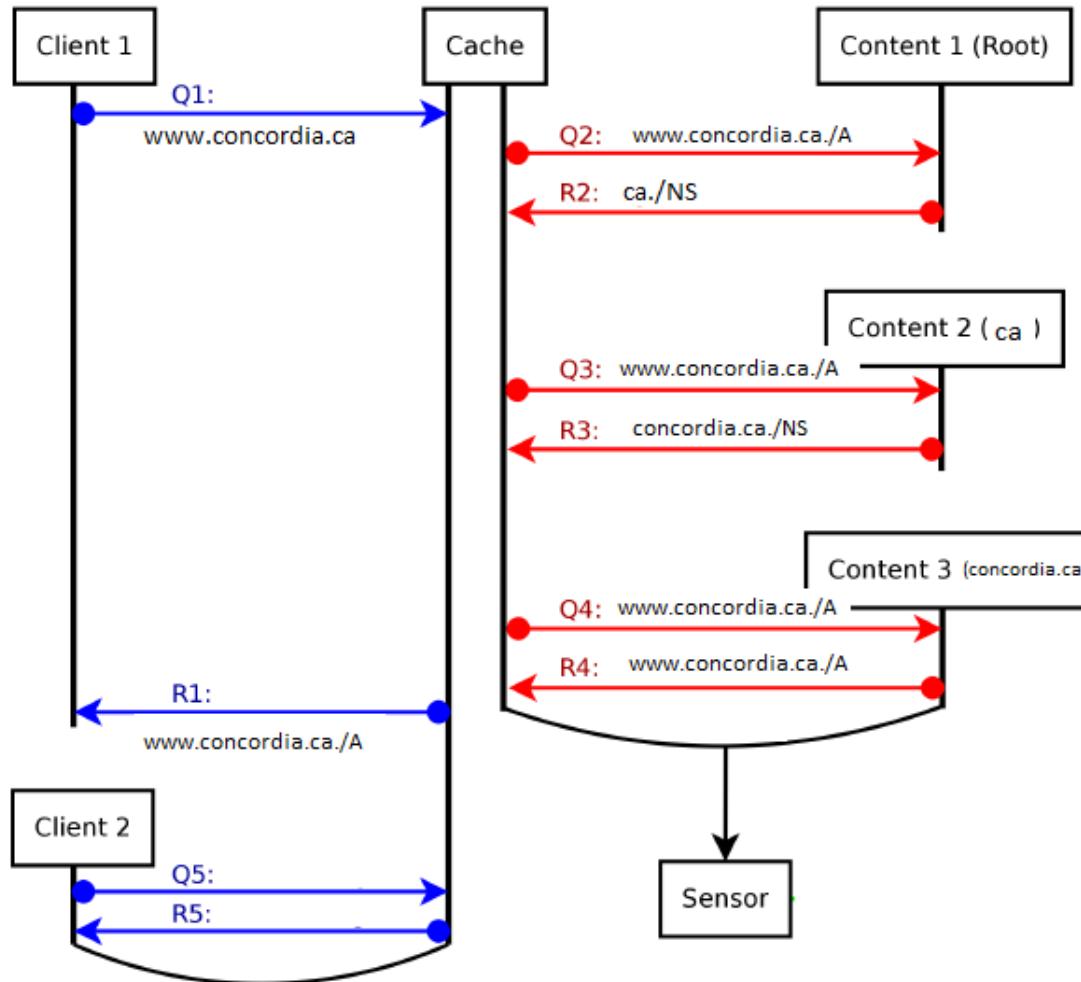
# Darknet

10



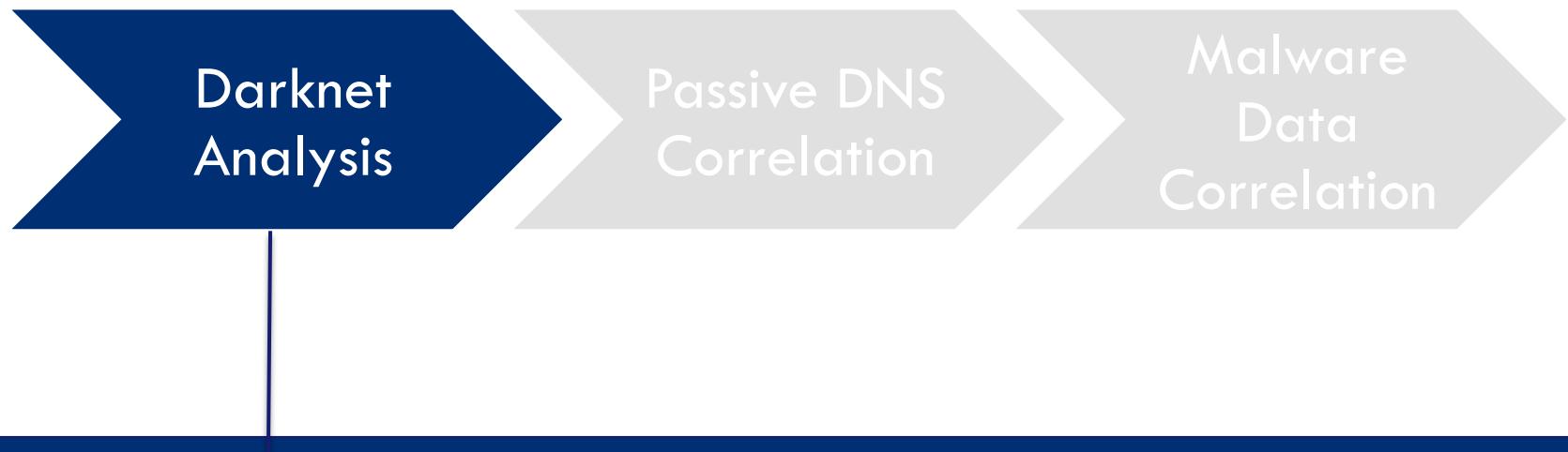
# Passive DNS

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# Approach

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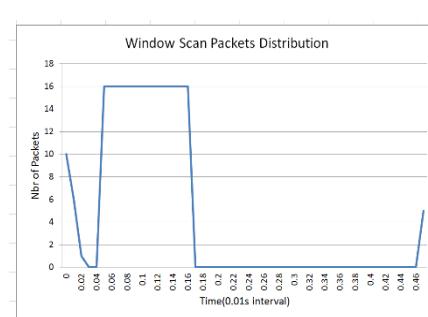
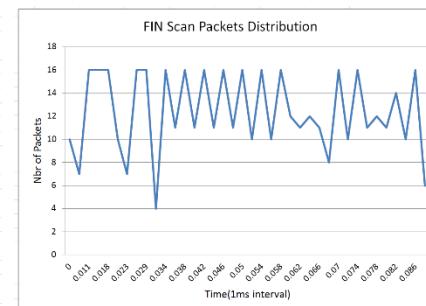
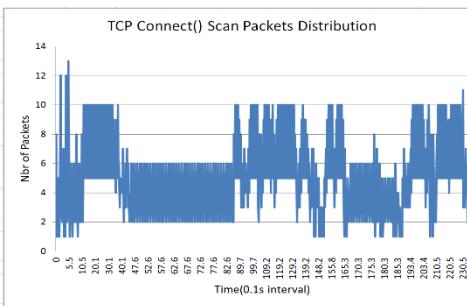
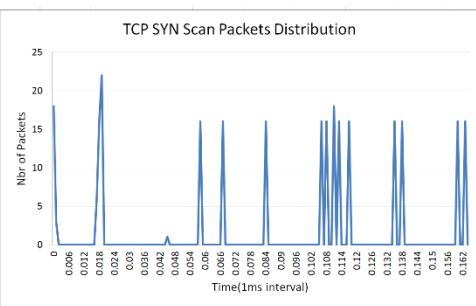


# Traffic Fingerprinting Technique

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## □ Observation:

- Probing techniques (TCP SYN, UDP, ACK, etc.) demonstrate a similar temporal correlation and similarity when generating their corresponding probing traffic



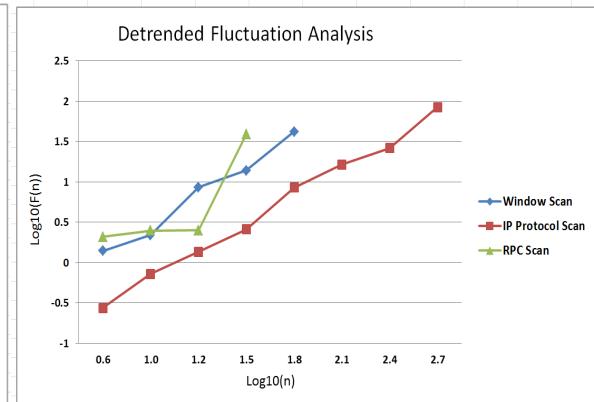
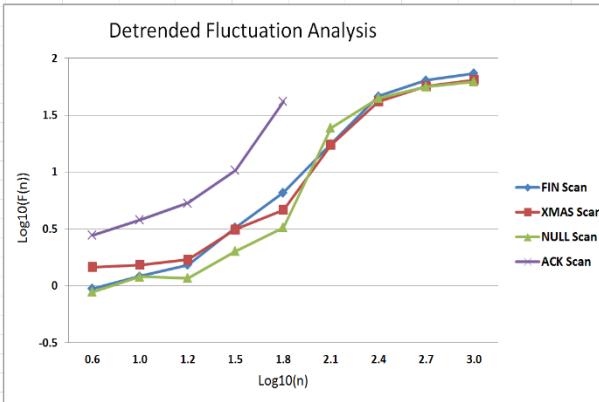
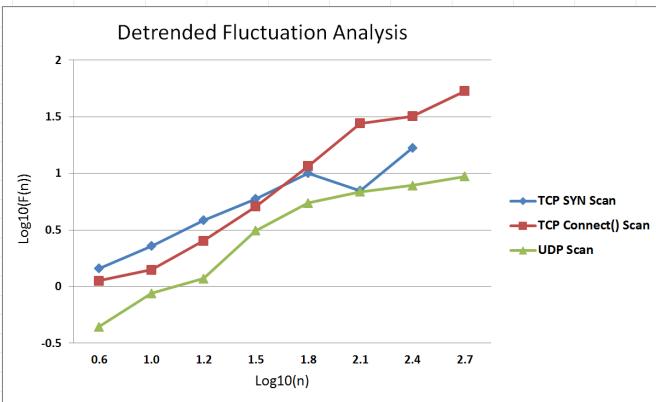
# Traffic Fingerprinting Technique

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- Detrended Fluctuation Analysis (DFA)
  - To determine the statistical self-affinity of a signal
  - Excessively used in medicine, economy and geology
  - 2 works related to cyber security, none related to probing
- The fluctuations are characterized by a scaling exponent  $\alpha$ :
  - $\alpha < 0.5$ : anti-correlated
  - $\alpha \approx 0.5$ : uncorrelated or white noise
  - $\alpha > 0.5$ : correlated
  - $\alpha \approx 1$ :  $1/f$ -noise or pink noise
  - $\alpha > 1$ : non-stationary, random walk like, unbounded
  - $\alpha \approx 1.5$ : Brownian noise

# Traffic Fingerprinting Technique

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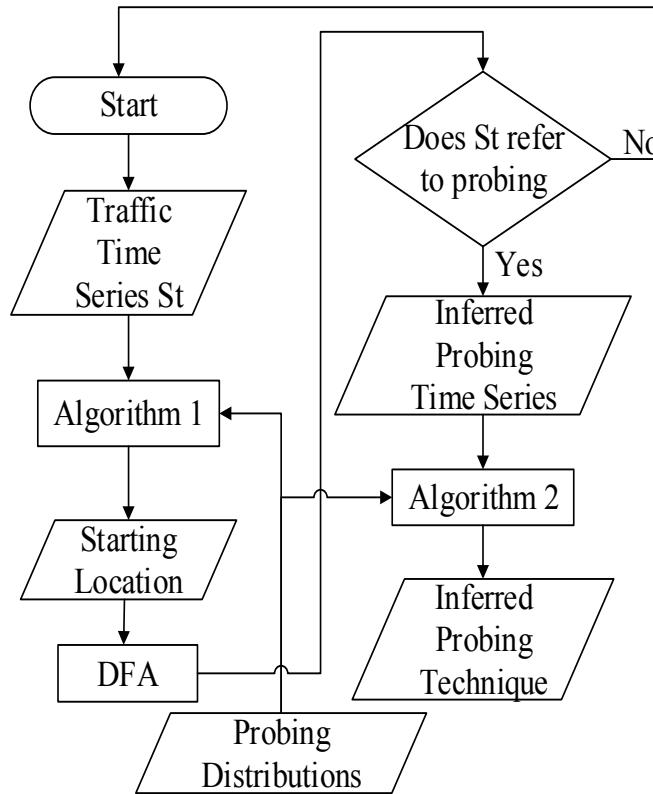


Probing Technique	Exp1: $\alpha$	Exp2: $\alpha$
TCP SYN	0.57	0.74
TCP Connect()	0.87	0.69
FIN	0.31	0.24
Xmas	0.30	0.27
Null	0.37	0.41
UDP	0.66	0.58
IP Protocol	1.13	1.22
ACK	0.44	0.29
Window	1.24	1.18
RPC	1.31	1.29
ICMP Echo	0.25	0.29

Correlation Status	Probing Techniques
Anti-Correlated	FIN Probing Xmas Probing Null Probing ACK Probing ICMP Echo Probing
Correlated	TCP SYN Probing TCP Connect() Probing UDP Probing
Non-Stationary	IP Protocol Probing Window Probing RPC Probing

# Traffic Fingerprinting Technique

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**input** : A time series  $S_t$  of the distribution under testing; the set of time series  $S_{cp}$  of the distributions of the scanning techniques.

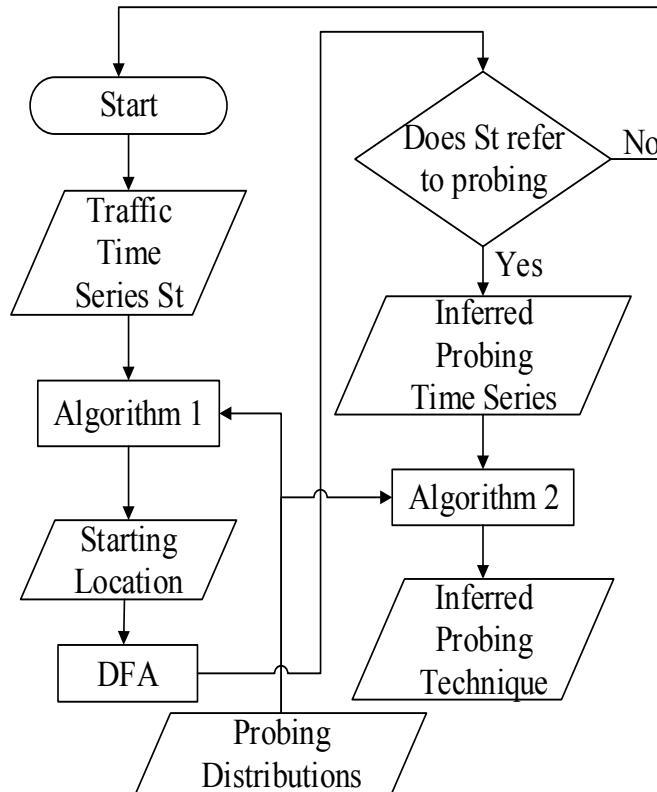
**output**:  $X$ , reflecting the starting location on where to apply DFA in  $S_t$

```
m=length( $S_t$ );
for every  $S_{cp}$  do
  n=length( $S_{cp}$ );
  for  $i=1 \rightarrow (m - n)$  do
    s[i]=compare[ $S_t(1 + i, \dots, n + i)$ ,  $S_{cp}(1, \dots, n)$ ];
  end
  S[p]=min(s[]);
  end
  X=min(S[]);
  return (X);
```

```
compare(A, B)
for  $i=1 \rightarrow n$  do
  K[i]=||E|| = d(A(i), B(i));
  sum+=K[i];
  return (sum);
end
```

# Traffic Fingerprinting Technique

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**input** : A time series  $S_b$  of the probing distribution that DFA was previously applied on; a cluster of time series  $S_{cb}$  of the distributions of the scanning techniques related to the correlation status.

**output**:  $S_{cbi}$ , reflecting one scanning technique that is estimated to be generating the probing activity found in  $S_b$ .

```
for every  $S_{cbi}$  do  
   $Bha_{bi} = \|Bha\| = d(S_{cbi}, S_b);$   
end  
 $d_i = \text{Min}(Bha_{bi});$   
return  $(S_{cbi}|i \text{ of } d_i);$ 
```

# Traffic Clustering

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Features	
<b>Data Link Features</b>	1 Delta time with previous capture packet 2 Packet Length 3 Frame Length 4 Capture Length 5 The flag 'frame' is marked
<b>Network Layer Features</b>	6 IP Header length 7 IP Flags. 8 IP Flags: reversed bit 9 IP Flags: do not fragment bit 10 IP Flags: more fragments bit 11 IP Fragment offset 12 IP Time to live 13 IP Protocol
<b>Transport Layer Features</b>	14 TCP Segment length 15 TCP Sequence number 16 TCP Next sequence number 17 TCP Acknowledgement number 18 TCP Header length 19 TCP Flags 20 TCP Flags: congestion window reduced 21 TCP Flags: ECN-Echo 22 TCP Flags: Urgent 23 TCP Flags: Acknowledgement 24 TCP Flags: Push 25 TCP Flags: Reset 26 TCP Flags: Syn 27 TCP Flags: Fin 28 TCP Window size 29 UDP Length

# Behavioral Analytics

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Statistical, heuristical, entropy, fuzzy hashing techniques

- Is the probing traffic random or does it follow a certain pattern?
- How are the targets being probed?
- What is the nature of the probing source?
- Is the probing targeted or dispersed?

# Darknet Inferences

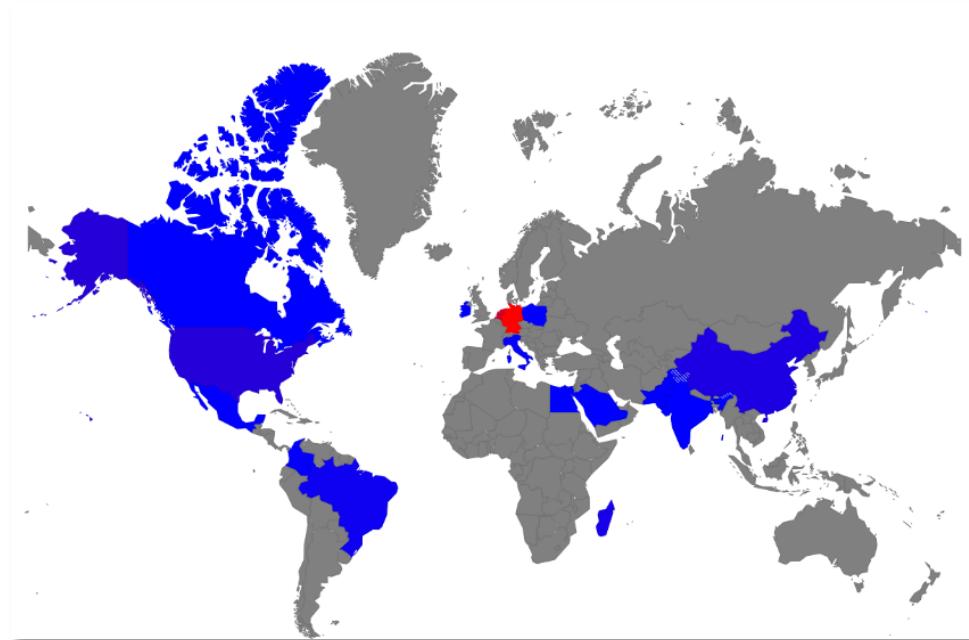
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- Peak:
  - Generating more than **1 million packets**
  - Similar traffic from other days is **less than 1000 packets**
  - **97% of traffic refer to probing activities**
- Overlapping observations by ISC and NCFTA:
  - The TTL of the packets changes with source IP address
  - Packets with a TCP header length of 0 or packets with odd flag combinations (i.e., URG, PSH, Reserved)
  - The packets arrival rate is slow, way far from DDoS levels
  - Xmas Tree-like probing in most TCP flags

# Darknet Inferences: Probing Sources

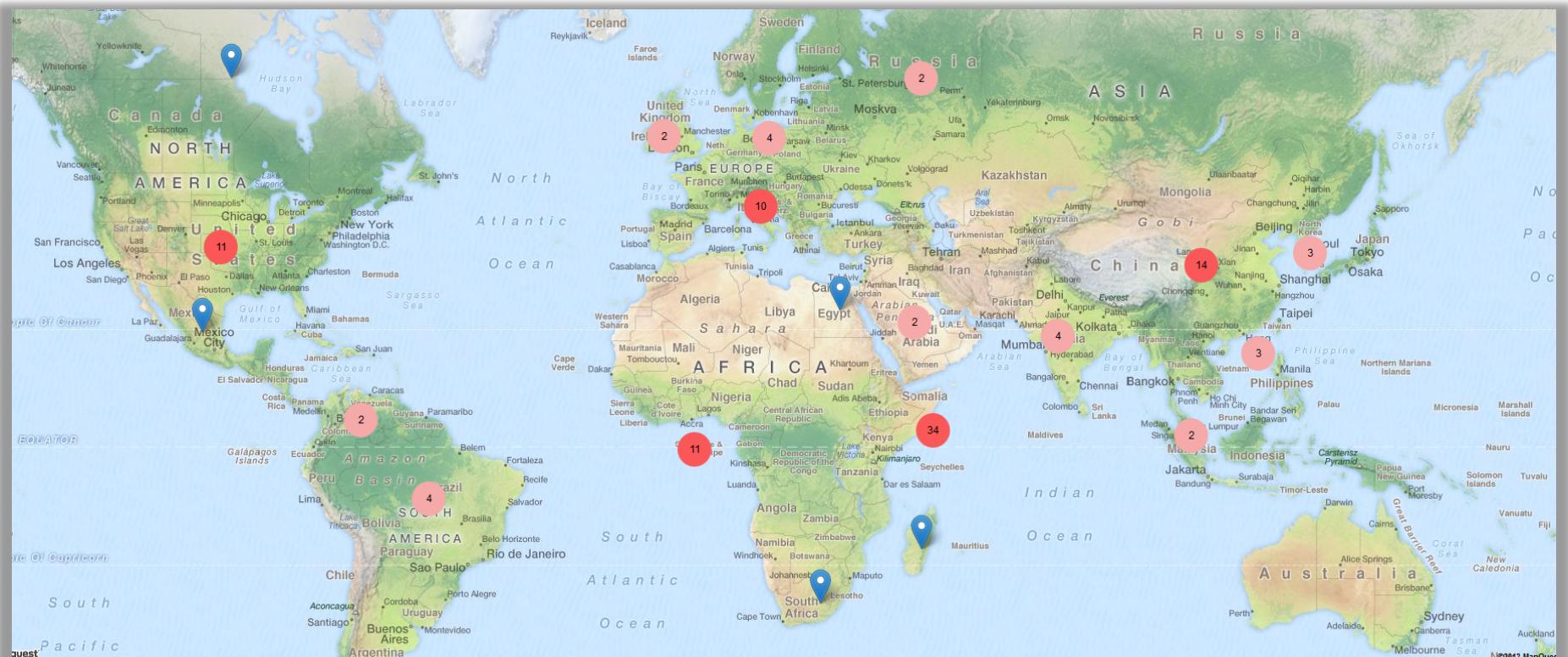
21

- Originating from
  - ▣ 27 unique sources
  - ▣ 17 countries
  - ▣ 24 ISPs
  - ▣ 25 organizations



# Darknet Inferences: Probing Sources

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IP concentration

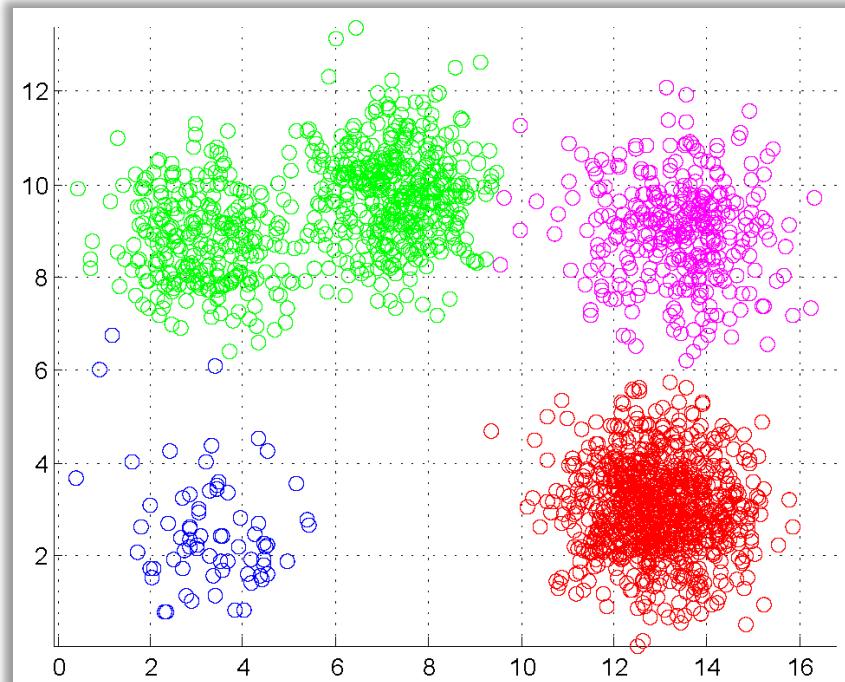
# Darknet Inferences: Targeted Ports

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- Port 0 from X.X.X.163, the sole German IP:  
813 thousand packets/destinations
- Port 445: 8952 packets
- Port 22: 7080 packets
- Port 3389: 5606 packets
- > 60,000 ports from X.X.X.201, the sole Dutch IP

# Darknet Inferences: Traffic Similarity

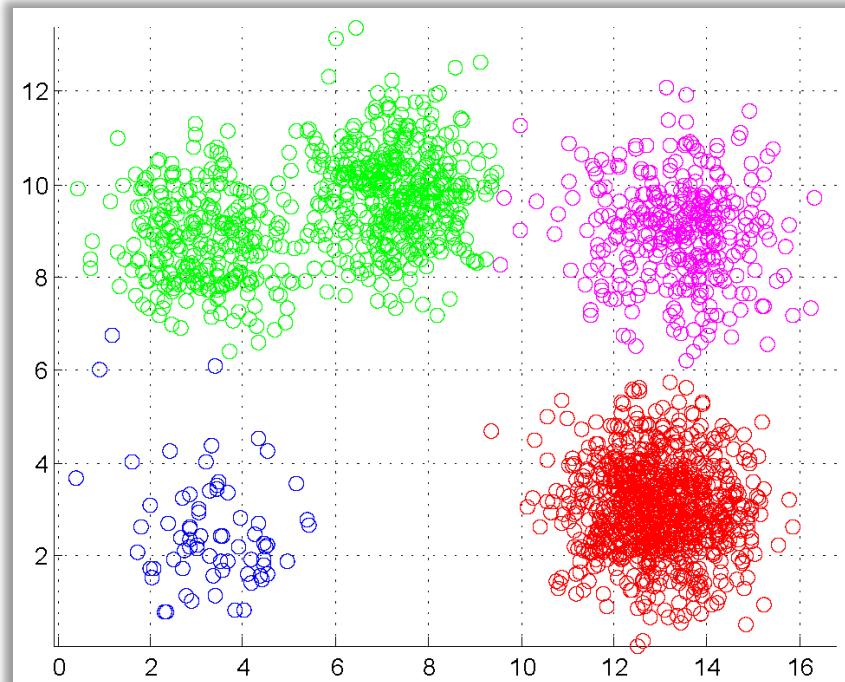
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- One cluster for the horizontal scan on port 0 from the German IP
- Another cluster for the horizontal scan on > 60 thousand ports from the Dutch IP
- Another cluster for probing on other ports such as 445, 22 and 3389
- Last cluster represents misconfigurations/malformed packets

# Darknet Inferences: Behavioral Analytics

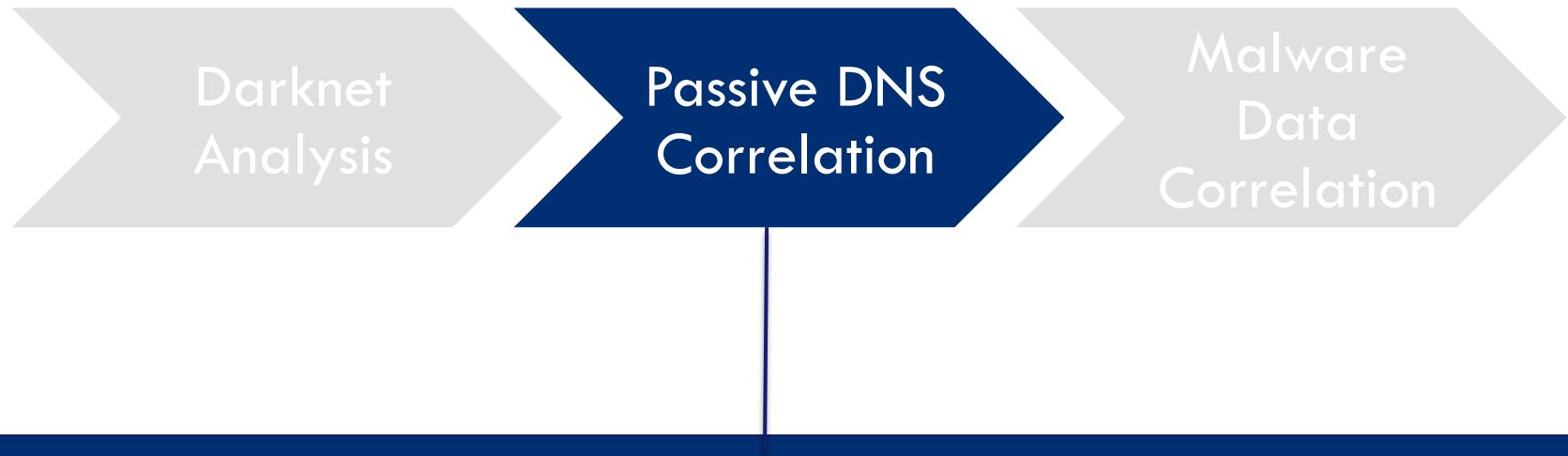
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- Probing clusters 1 and 2:
  - ▣ random probing traffic as opposed to using patterns
  - ▣ sequential strategy
  - ▣ probing tool
  
- Probing cluster 3:
  - ▣ pattern usage
  - ▣ permutation strategy
  - ▣ bots

# Approach

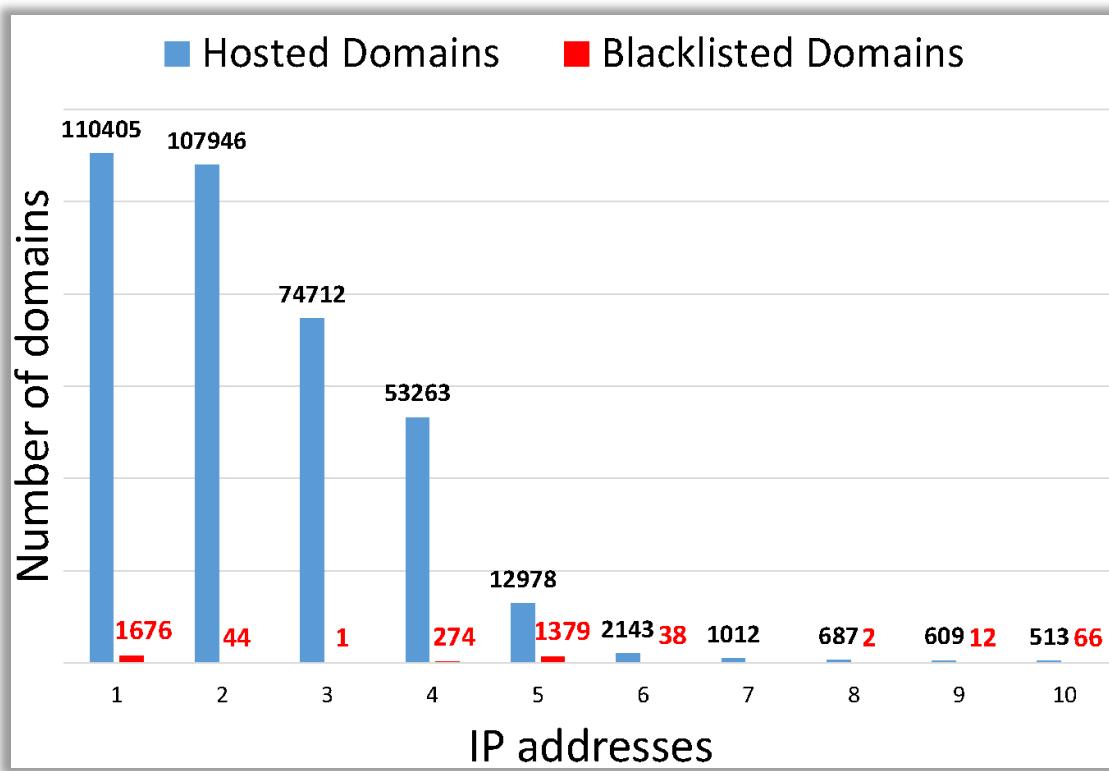
26



- Hosting capability** to infer malicious domains affiliated with the sources
- Intensity** to detect accessibility and involvement
- Aliveness** to verify the effectiveness of the malicious domains

# Passive DNS Inferences

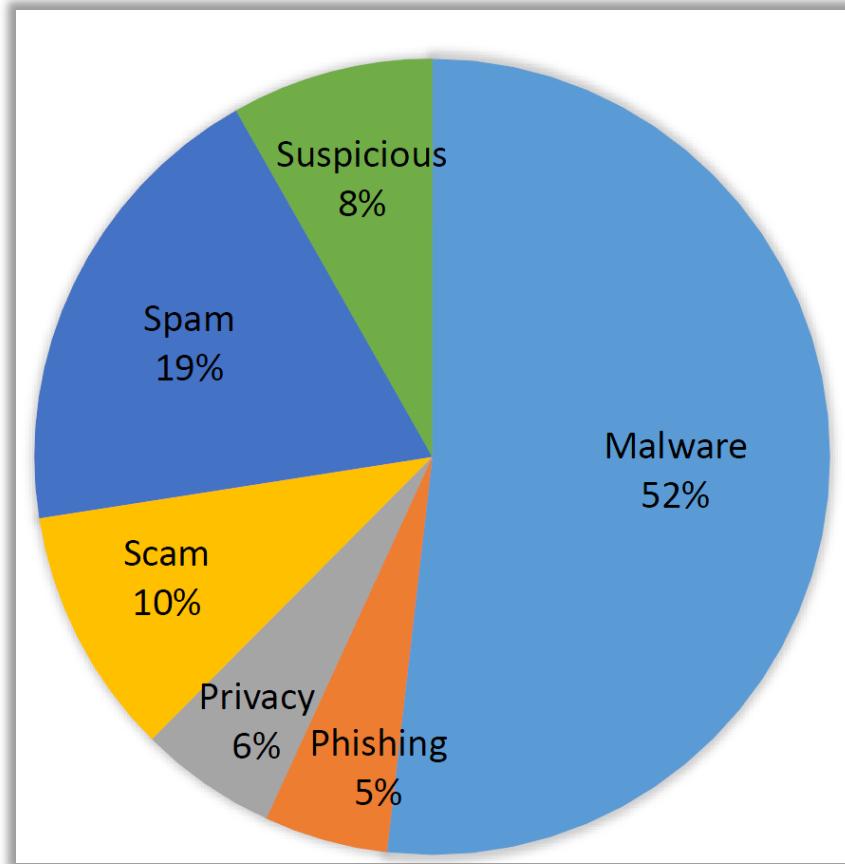
27



- 513 to 110 thousand hosted domains per the probing IPs
- 28% of the probing IPs are hosting blacklisted/malicious domains

# Passive DNS Inferences

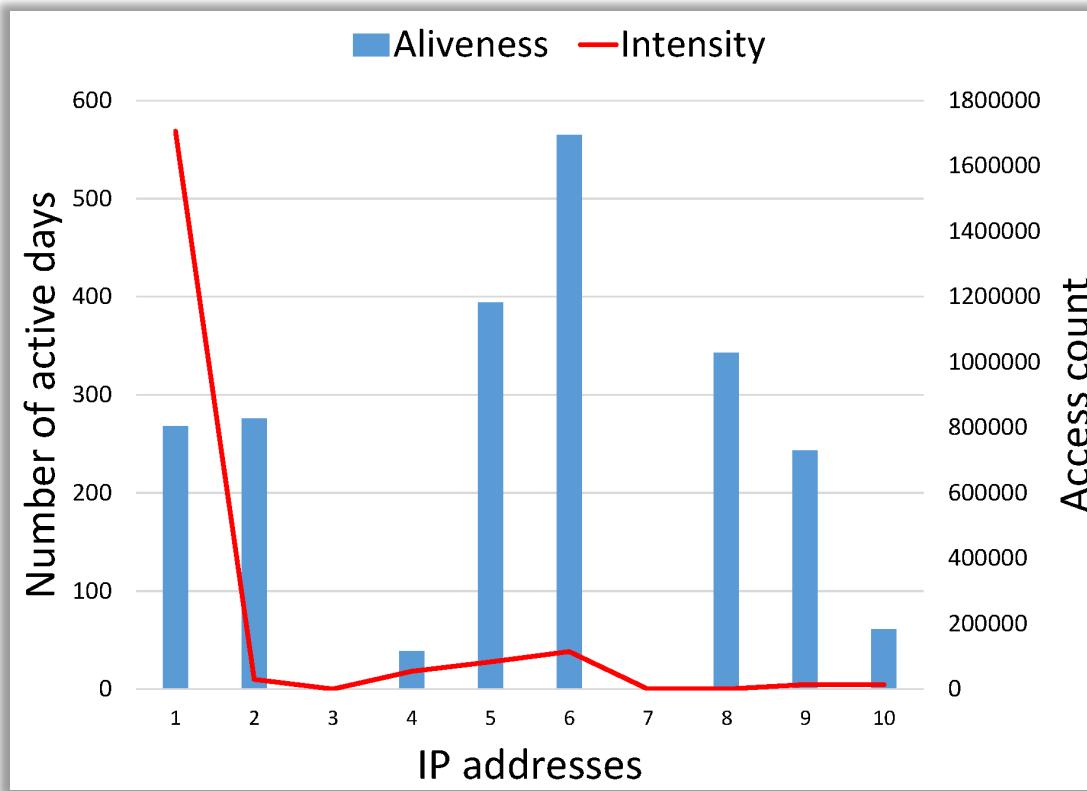
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Half of the malicious domains could be attributed to malware activities

# Passive DNS Inferences

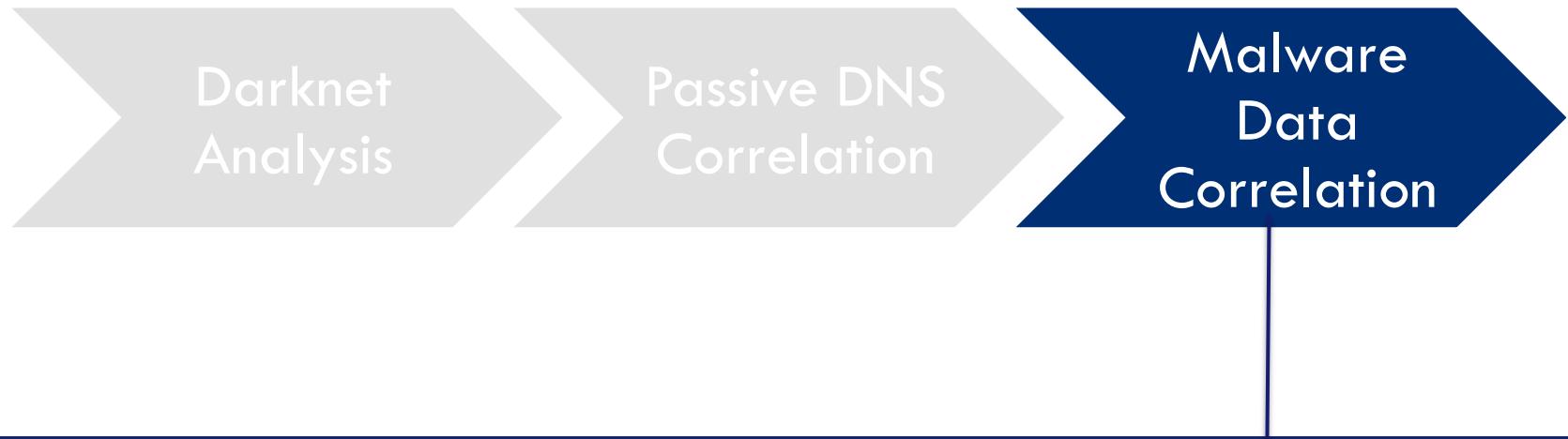
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- ❑ Some malicious domains are very effective; high access count and low active days
- ❑ Domains with prolonged active days provide back-end services to others
- ❑ malicious activities

# Approach

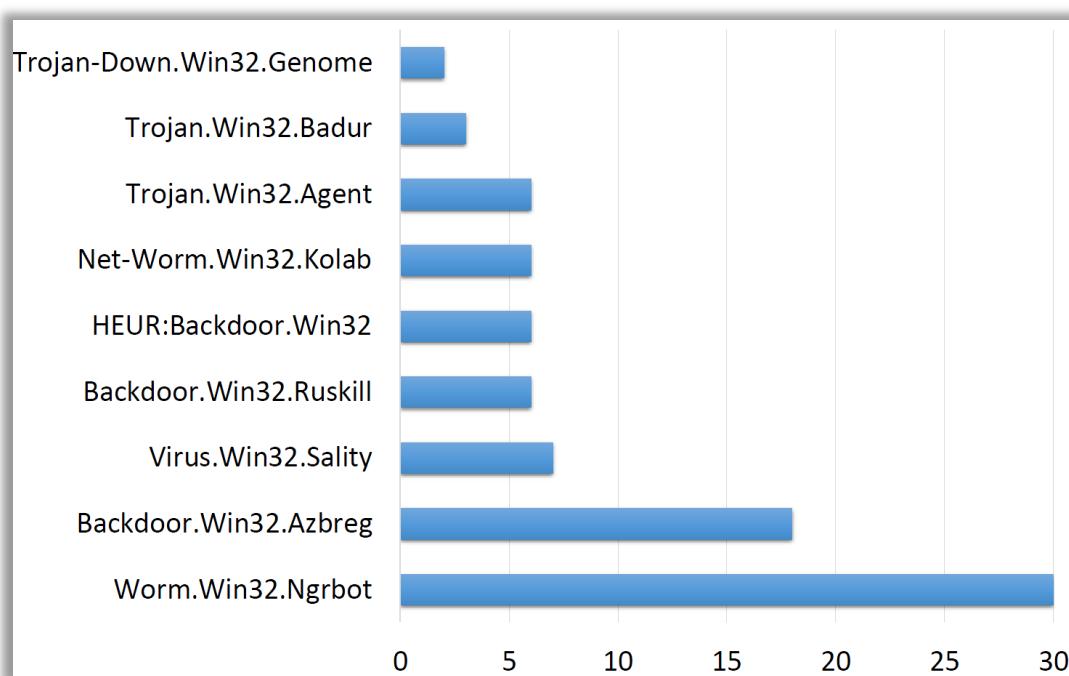
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- Machine infection** to deduce malware samples that infect the sources
- Malware Attribution** to infer the malware samples that generate such traffic

# Malware Inferences

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Email-Worm.Win32.Mydoom  
Worm.Win32.AutoRun  
Virus.Win32.Sality  
Virus.Win32.Expiro  
Backdoor.Win32.Xtoober  
Trojan-Downloader.Win32.Agent  
Trojan-Dropper.Win32.Small  
Trojan.Win32.Pincav  
Trojan.Win32.Jorik  
Trojan-Downloader.Win32.Delf  
Trojan-Downloader.Win32.Genome  
Backdoor.Win32.Gbot  
Backdoor.Win32.Popwin  
Email-Worm.Win32.Rays  
Email-Worm.Win32.Runouce  
Packed.JS.Agent  
Trojan-Banker.Win32.Banker  
Trojan-Downloader.Win32.FlyStudio  
Backdoor.Win32.Banito  
Backdoor.Win32.VB  
HackTool.Win32.Injecter

Virus.Win32.Sality is the common factor

# Summary

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- Traffic is indeed reconnaissance/probing activities originating from three different horizontal scans
- 28% of the scanning sources host malicious/blacklisted domains as they are often used for spamming, phishing and other fraud activities
- Bot probing sources (i.e., probing cluster 3) are infected by Virus.Win32.Sality

# Outcome

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- Devised a generic approach that could be applied to analyze other cyber events with similar nature
- Demonstrated the value added of employing
  - ▣ Databases of cyber security data  
(darknet, passive dns and malware)
  - ▣ Tools and APIs that can effectively utilize the data
- Permitted prompt data analysis to support investigation of cyber events

# Acknowledgement

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- Research members of the NCFTA Canada lab headed by Prof. Mourad Debbabi
- Natural Sciences and Engineering Research Council of Canada (NSERC)

# Questions



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