## Project

# Statistical Analysis of DNS Abuse in gTLDs (SADAG)

Consortium: SIDN and TU Delft

**Requested by**: Competition, Consumer Choice, and Trust Review Team



Statistical Analysis of DNS Abuse in gTLDs

## Goal

- Comprehensive statistical comparison of rates of DNS abuse in new and legacy gTLDs
  - Spam
  - Phishing
  - Malware
- Statistical analysis of potential relationship with abuse drivers



## **Motivation**

 New Generic Top-Level Domain (gTLD) Program enabled hundreds of new generic top-level domains



## **Data Providers**

#### **Blacklists**

- Anti Phishing Working Group
  - Phishing URLs
- StopBadware
  - Malware URLs
- SURBL (4 blacklists)
  - Phishing domains
  - Spam domains
  - Malware domains



## **Data Providers**

#### **Blacklists**

- Spamhaus
  - Spam domains
- CleanMX (3 feeds)
  - Phishing URLs
  - Malware URLs
  - Defaced URLs



## **Data Providers**

#### **WHOIS** data

- Whois XML API
  - All new gTLDs
  - Subset of legacy gTLDs
- DomainTools
  - Providing missing domains

#### **Domain data**

- Zone files
  - Per gTLD
  - Per day
  - 3 year period





## Security metrics

Distribution of malicious content: \*

- Number of unique domains
  - E.g. malicious.com

\* "Reputation Metrics Design to Improve Intermediary Incentives for Security of TLDs", Maciej Korczyński, Samaneh Tajalizadehkhoob, Arman Noroozian, Maarten Wullink, Cristian Hesselman, and Michel van Eeten, in the IEEE European Symposium on Security and Privacy (Euro S&P)



Statistical Analysis of DNS Abuse in gTLDs

## Security metrics

Distribution of malicious content:

- Number of unique domains
  - E.g. malicious.com
- Number of FQDNs
  - E.g. connect.secure.wellsfargo.malicious.com, bankofamerica.com.malicious.com, (...)

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Statistical Analysis of DNS Abuse in gTLDs

## Security metrics

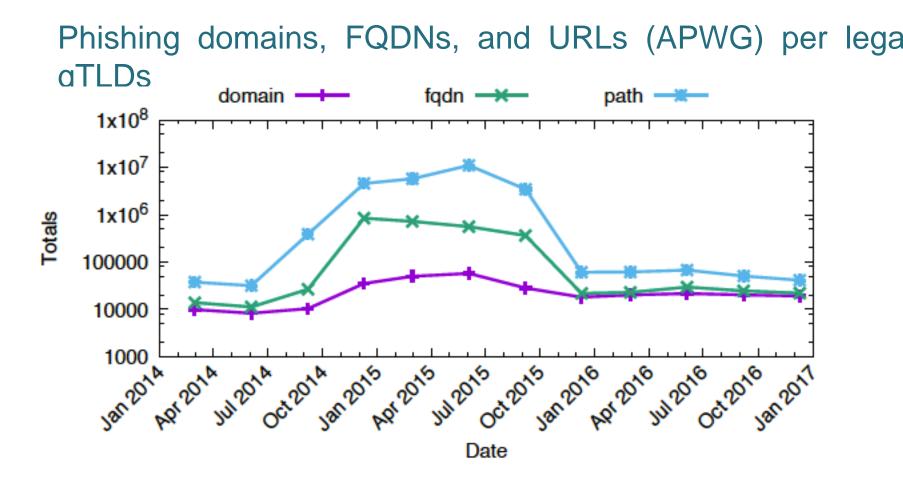
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- Number of unique domains
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- Number of FQDNs
  - E.g. connect.secure.wellsfargo.malicious.com, bankofamerica.com.malicious.com, (...)
- Number of URLs

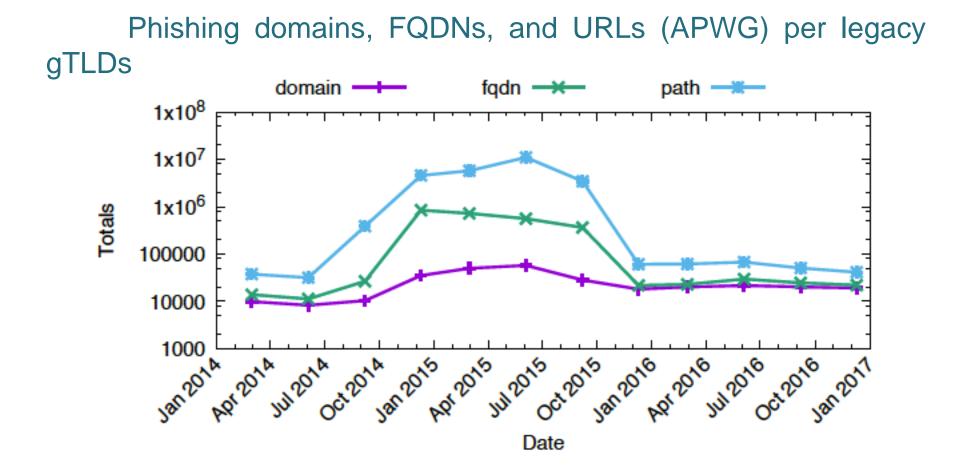
 – E.g. malicious.com/wp-content/file.php, malicious.com/wp-content/gate.php, (...)

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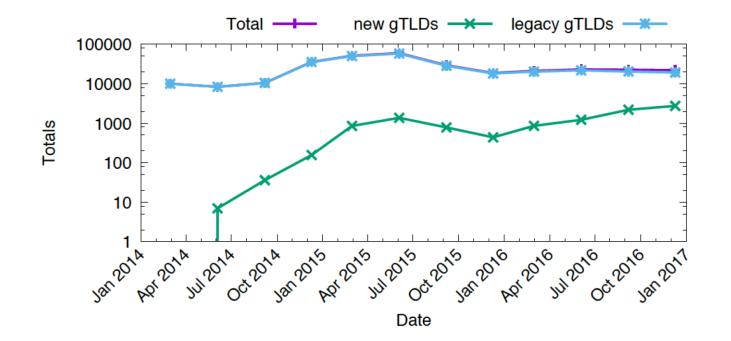






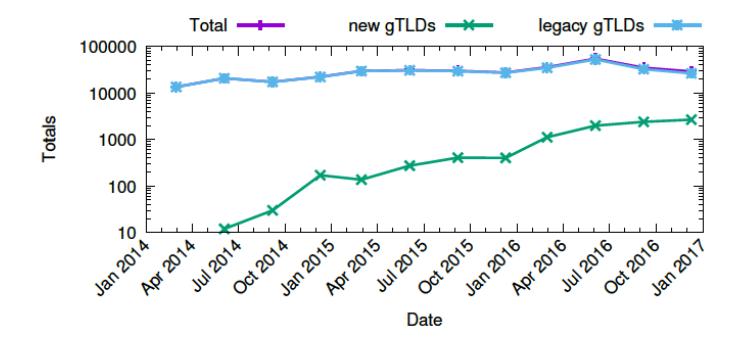
Three measures reflect attackers' profit-maximizing behavior. They abuse Antree plegalingervices and affect the reputations of the services

Phishing domains (APWG) per new and legacy gTLDs



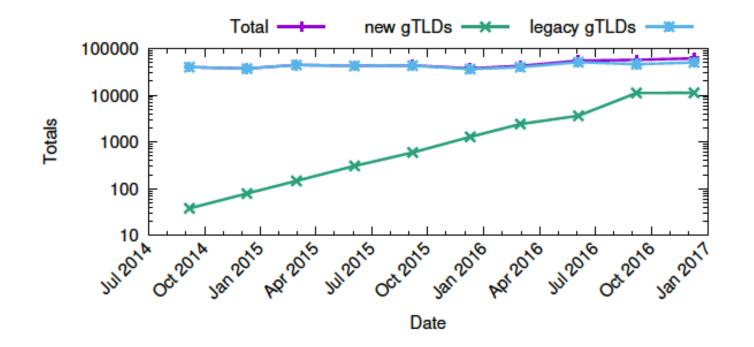


Phishing domains (CleanMX ph) per new and legacy gTLD



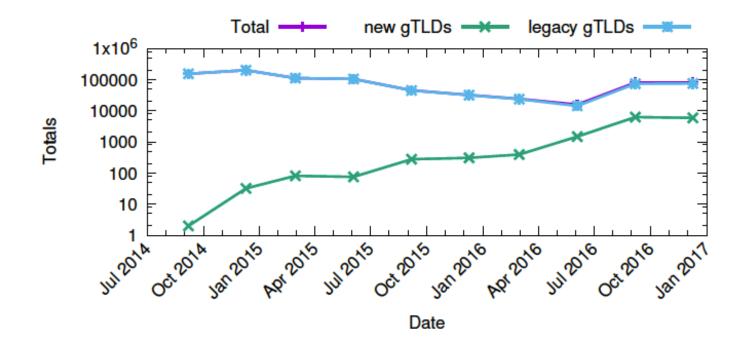


Phishing domains (SURBL ph) per new and legacy gTLDs



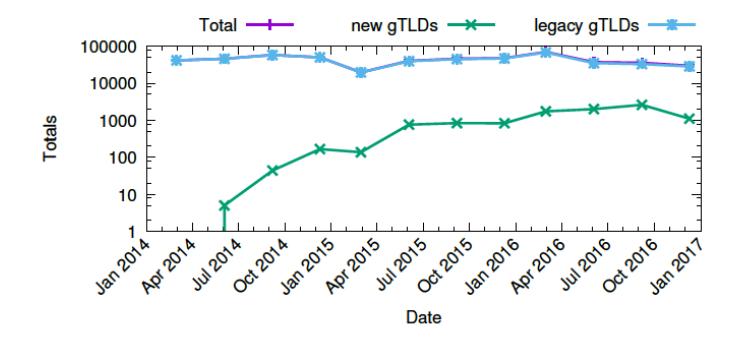


Malware domains (SURBL mw) per new and legacy gTLD



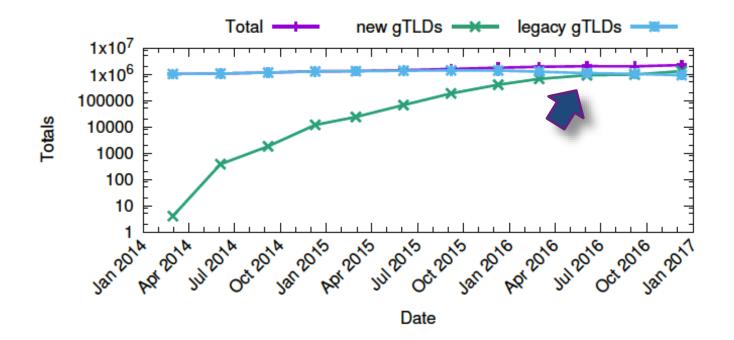


Malware domains (CleanMX mw) per new and legacy gTLDs



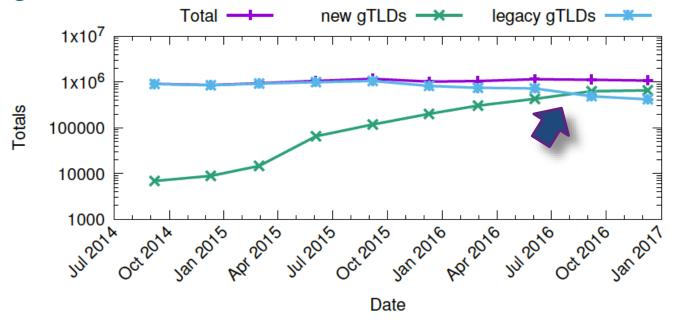
While the number of abused domains remains approximately constant in legacy gTLDs, we observe a clear upward trend in the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in ne for the absolute number of **phishing** and **malware** domains in the absolute number of **phishing** and **malware** domains in the absolute number of **phishing** and **malware** domains in the absolute number of **phishing** and **malware** domains in the malware domains in the malware of **phishing** and **malware** domains in the malware domains i

Spam domains (Spamhaus) per new and legacy gTLDs



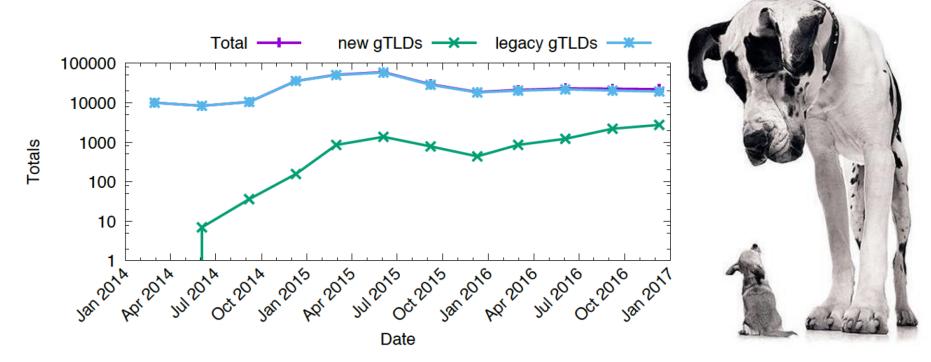


Spam domains (SURBL ws) per new and legacy gTLDs



The **absolute** number of **spam** domains in new gTLDs higher than in legacy gTLDs at the end of Statistical A2054 6DNS Abuse in gTLDs

Phishing domains (APWG) per new and legacy gTLDs



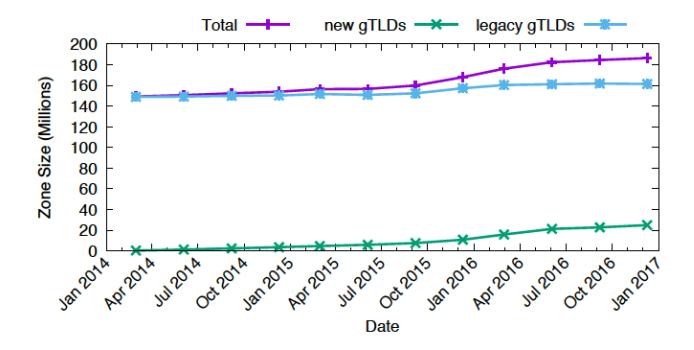
– Size matters!



Statistical Analysis of DNS Abuse in gTLDs

### Size

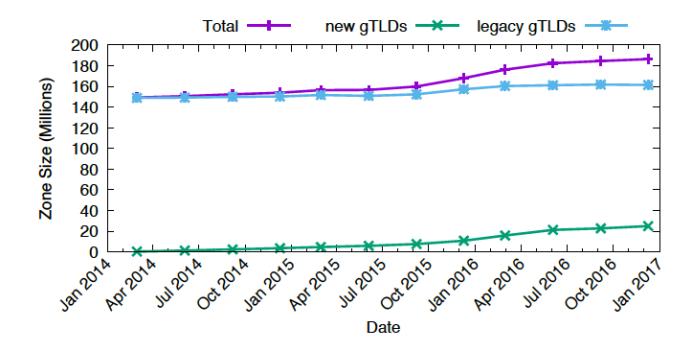
Size estimate: Number of 2<sup>nd</sup>—level domains in each gTLD zone file





## Size

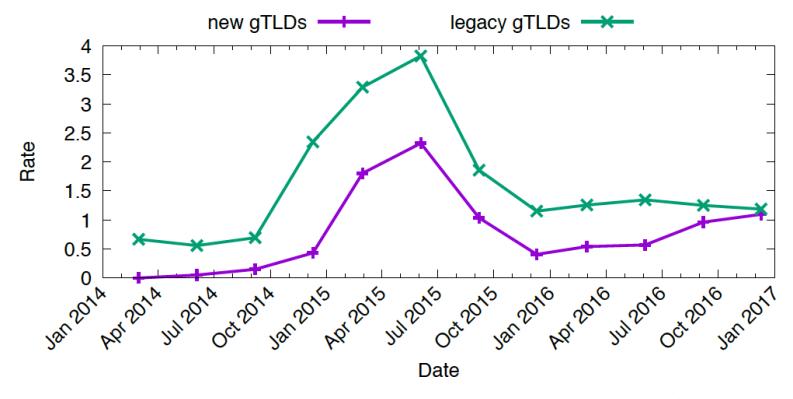
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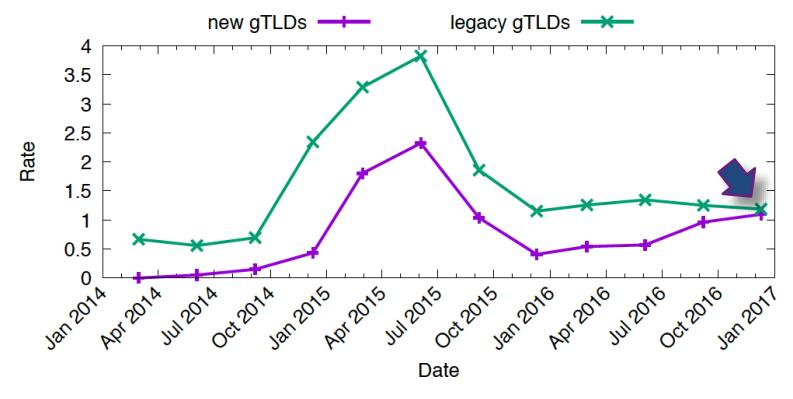
- Rates: (#blacklisted domains / #all domains) \* 10,000



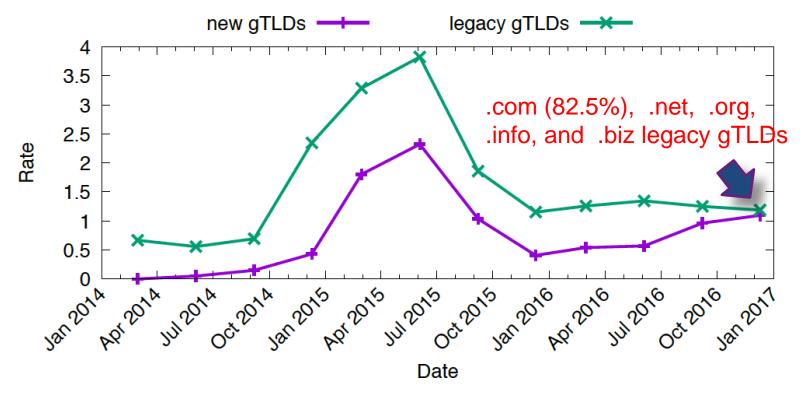
Statistical Analysis of DNS Abuse in gTLDs



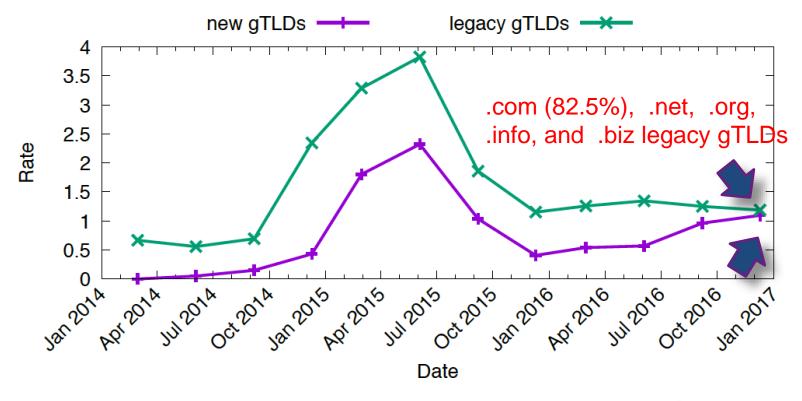




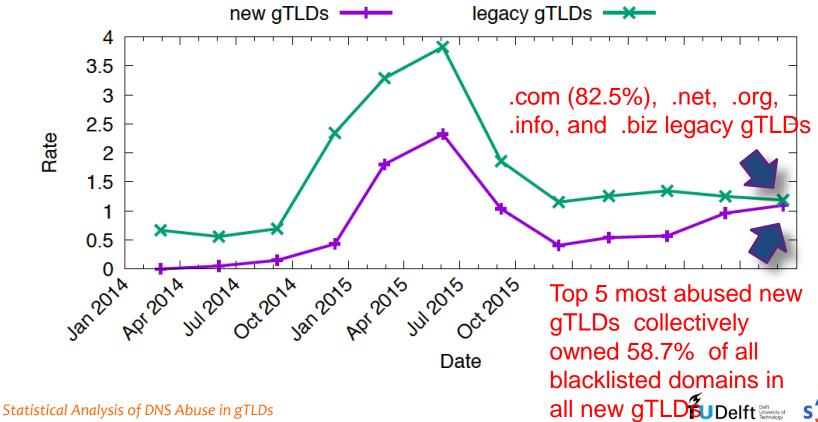






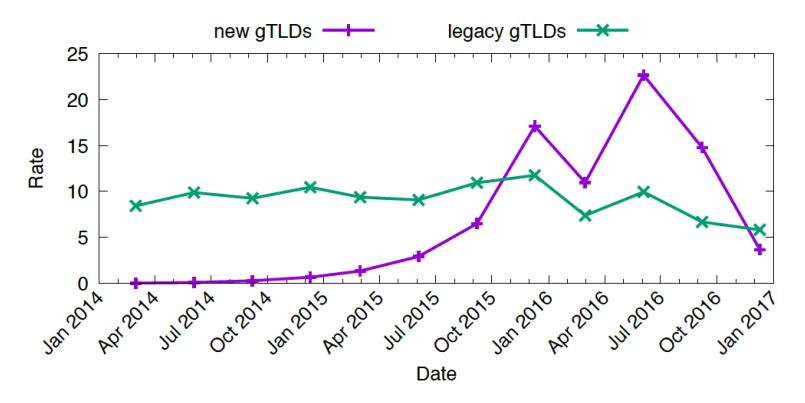






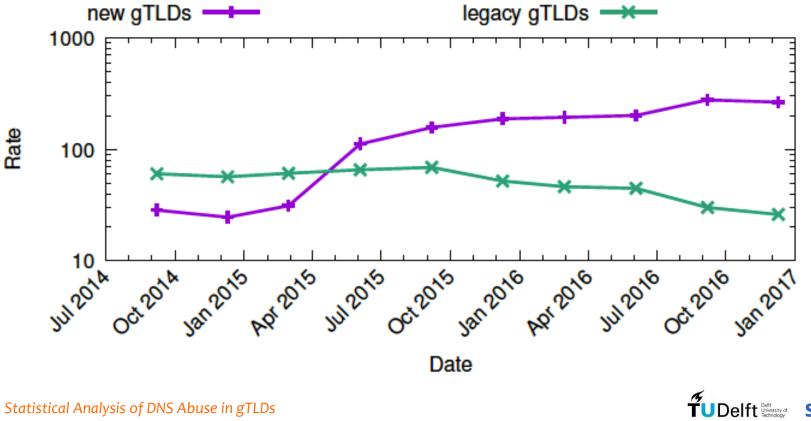


 Time series of abuse rates of malware domains in legacy gTLDs and new gTLDs based on the StopBadware feed





 Time series of abuse rates of spam domains in legacy gTLDs and new gTLDs based on the Spamhaus feed





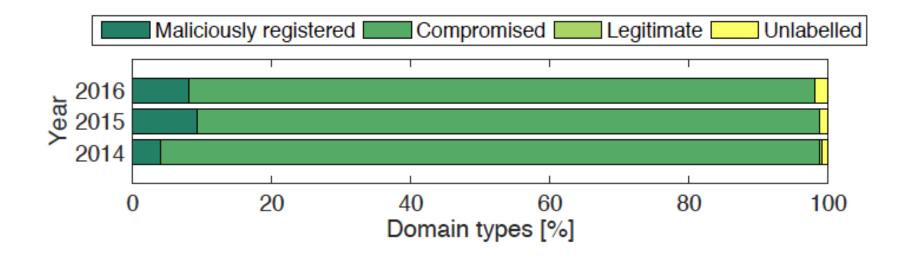
# Compromised and maliciously registered domains

- Distinguishing between compromised and maliciously registered domains is critical because they require different mitigation actions by different intermediaries
- Assumption: maliciously registered domains are involved in a criminal activity within a short time after the registration.
- Other heuristics: if a given domain name contains a string of a brand name or its misspelled version indicating malicious registration, URLs indicating compromised content management systems, etc.



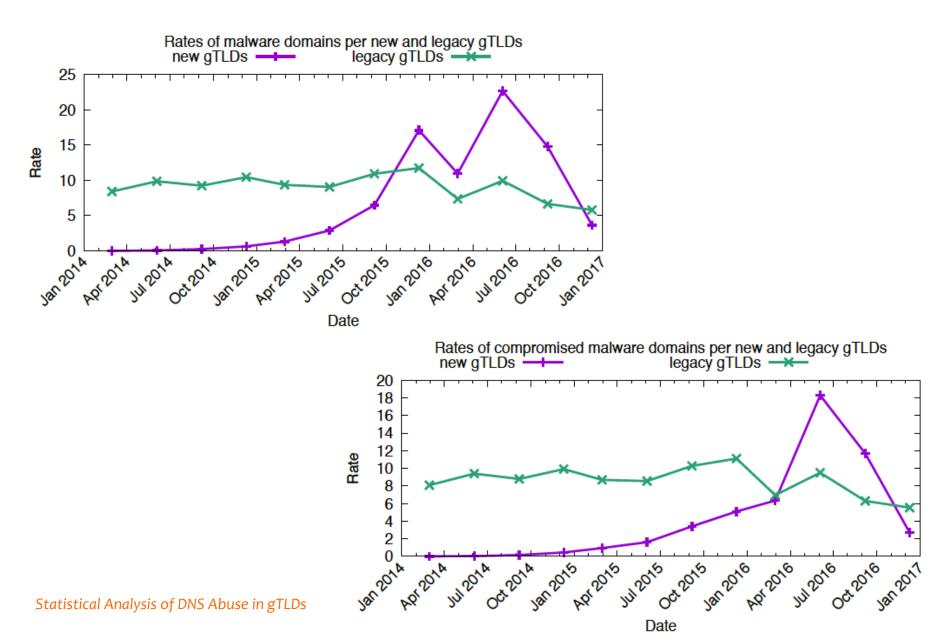
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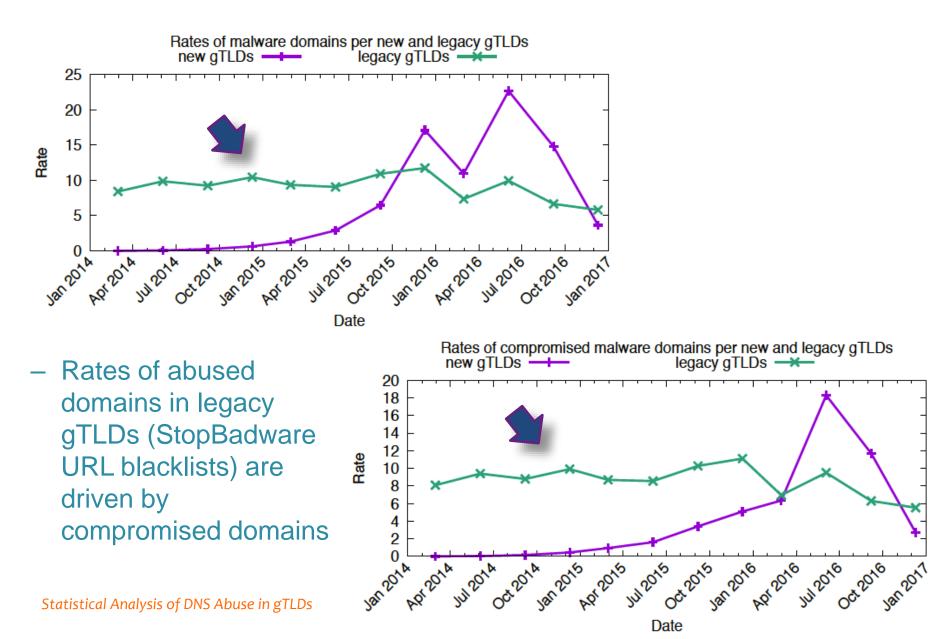




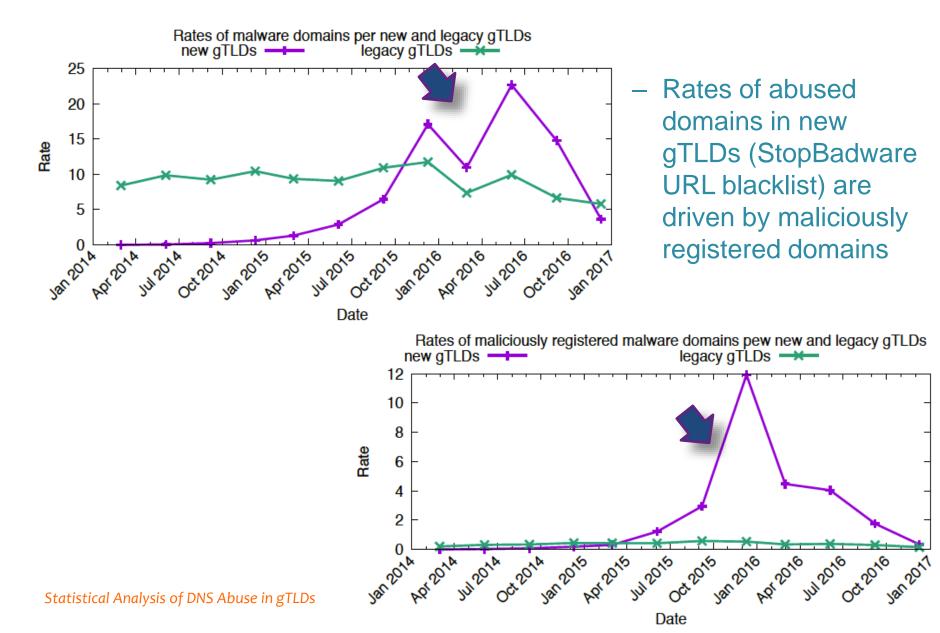
#### **Compromised domains**



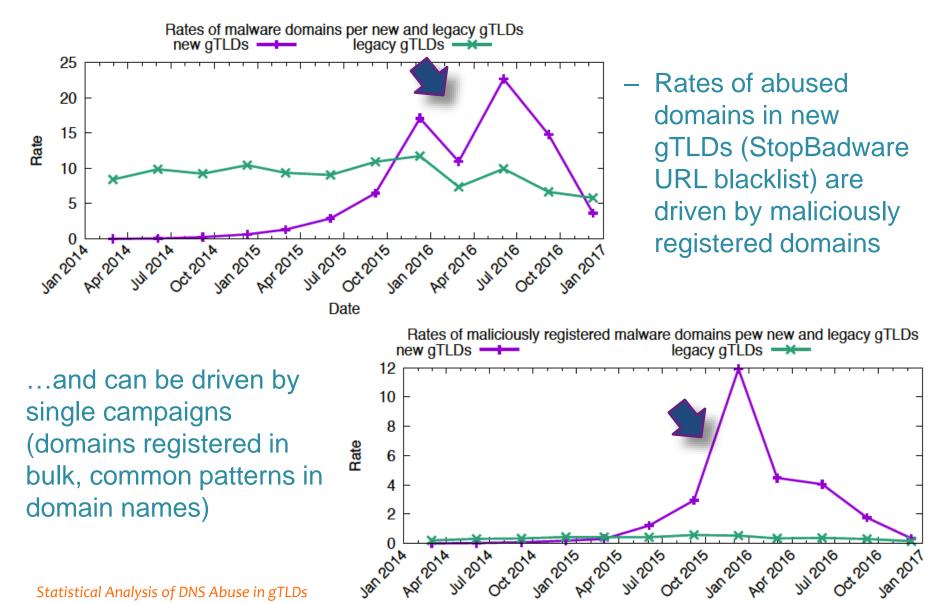
## **Compromised domains**



### Maliciously registered domains



## Maliciously registered domains



Statistical Analysis of DNS Abuse in gTLDs

Date

# **Privacy or Proxy Services**

- Why use PP services
  - Protecting your personal data
  - Blocking Spam
  - Stopping unwanted solicitations
- Analyzing use of PPs'es
  - Extract list of registrants
  - keyword search using "privacy", "proxy", "protect" etc
  - Manual inspection
- How many?
  - We found 570



## **Privacy or Proxy Services**

#### **A** Unprotected

#### yourdomain.com

Your Real Name Your Business Name 123 Real Home Address, Apt 213 Your Hometown, VA 22201 Phone: (703) 555-5555 Email: yourname@yourdomain.com

#### Protected

#### domain.example

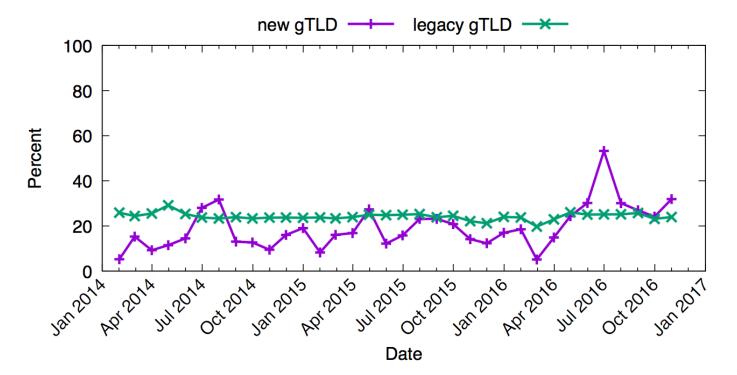
Whois Agent Whois Privacy Protection Service, Inc. PO Box 639 Kirkland, WA 98083 +1 425.274.0657 domain@protecteddomainservices.com

Image source: https://www.name.com/whois-privacy



## **Privacy or Proxy Services**

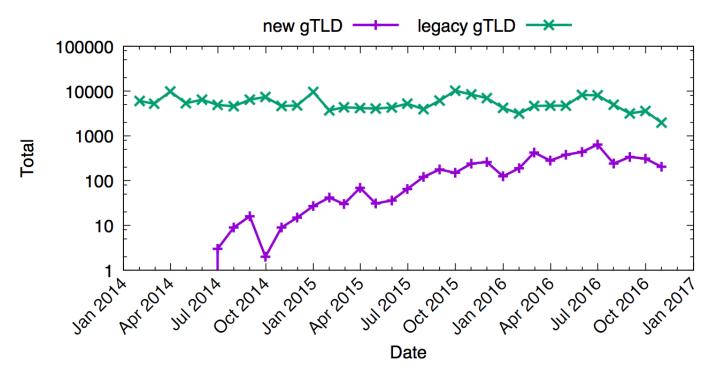
Usage for newly created domains per month





### **Privacy or Proxy Services**

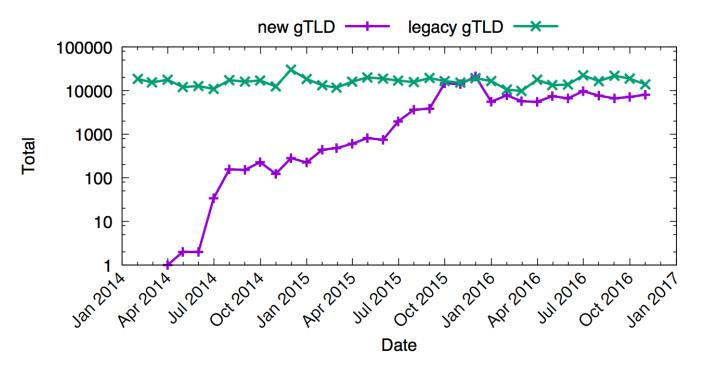
#### **StopBadware**





#### **Privacy or Proxy Services**

Spamhaus





- Using domain registrar location from WHOIS
  - Registrant details not reliable
- Method
  - Extract unique "registrar name" from WHOIS data.
  - Combine the registrar name with the country information for ICANN-Accredited Registrars.
  - Match remaining name variants
  - Manually lookup the country information for missing registrars
- Result
  - 5,985 registrars
  - 99.99% of domains



#### **Registrar distribution**

Country	#Registrars	share
United States	2,682	53.88
China	281	5.64
Germany	201	4.04
Canada	177	3.56
United Kingdom	160	3.21
India	144	2.89
France	116	2.33
Australia	111	2.23
Spain	105	2.11
Japan	95	1.91



#### **Domain distribution**

New	#Domains	Share	Legacy	#Domains	Share
China	7,832,264	28.57	USA	145,652,390	58.81
USA	6,114,944	22.31	China	22,409,117	9.05
Gibraltar	2,603,236	9.5	Germany	16,574,944	6.69
Cayman Islands	1,959,580	7.15	Canada	14,198,455	5.73
Singapore	1,700,985	6.2	India	9,509,405	3.84
Japan	1,667,079	6.08	Japan	6,400,530	2.58
India	1,274,622	4.65	Australia	5,950,392	2.4
Germany	1,056,541	3.85	France	4,573,133	1.85
Hong Kong	815,039	2.97	UK	3,670,192	1.48
Canada	422,834	1.54	Turkey	2,216,396	0.89



#### SURBL distribution

new gTLD Country	#Incidents	percentage	rate			
Gibraltar	585,839	47.4	2233.07			
Japan	249,426	20.18	950.75			
China	201,869	16.33	769.47			
United States	87,139	7.05	332.15			
India	45,059	3.65	171.75			
United Kingdom	19,775 -		4			
United Arab Emirates	11,746 -	Legacy gTLD	country	#Incidents	percentage	rate
Canada	6,110	United Sta	ites	1,893,528	47.87	124.27
France	6,073	Japan		1,074,165	27.15	70.49
Australia	5,852	China		312,560	7.9	20.51
		India		243,127	6.15	15.96
		German	у	66,075	1.67	4.34
		Ireland		58,226	1.47	3.82
		Canada		37,861	0.96	2.48
		Turkey		32,222	0.81	2.11
		Australi	a	30,870	0.78	2.03
	_	Bahama	S	28,762	0.73	1.89
	_					



# **Registrar Reputation**

- Method
  - Filter out registrars designed for sinkholing domains.
  - Count number of incidents per registrar.
  - Calculate percentage of total abuse linked to registrar.



# Registrar Reputation

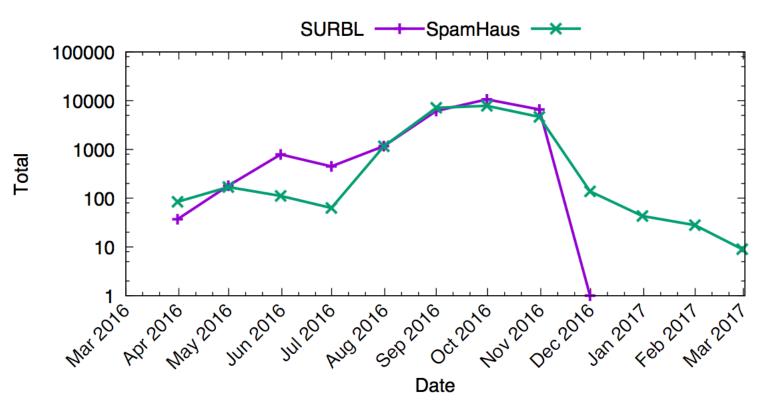
new gTLD registrar	#Domains	#Incidents	Percent		
Nanjing Imperiosus Technology	26,096	25,991	99.6		
Intracom Middle East FZE	20,639	11,254	54.53		
Dot Holding Inc.	153	76	49.67		
Alpnames Limited	2,623,443	585,839	22.33		
Todaynic.com, Inc.	317,534	69,330	21.83		
Web Werks India d/b/a ZenRegistry.c	com 784	146	18.62		
Xiamen Nawang Technology Co., L	td 281,148	42,067	14.96		
GMO Internet d/b/a Onamae.com		240 420	1/0		
TLD Registrar Solutions Ltd.	Legacy gTLD	registrar	#Domains	#Incidents	Percent
Instra Corporation Pty Ltd.	HOAPDI	INC.	141	126	89.36
	asia registry r2-as	sia (700000)	1,379	598	43.36
	Nanjing Imperiosu	s Technology	35,309	10,892	30.85
	Paknic (Private	) Limited	10,512	3,081	29.31
	Intracom Middle	67	16	23.88	
	AFRIREGIST	1,540	266	17.27	
	Minds and Mac	1,115	171	15.34	
	OwnRegistrar, Inc. GMO Internet d/b/a Onamae.com GoName.com, Inc		19,745	2,933	14.85
			7,171,201	1,061,902	14.81
			2,662	384	14.43





#### **Registrar Reputation**

#### Nanjing Imperiosus Technology Co. Ltd.





#### Schedule

- Final report available July 2017
- Incorporate WHOIS data information from Domain Tools
- Inferential analysis of potential relationship with abuse drivers (Regression analysis of abuse in gTLDs)

#### **Questions?**

