# CERTainty: Detecting DNS Manipulation at Scale using TLS Certificates

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### **Motivation: Detecting Global DNS Manipulation**





### DNS Manipulation is diverse on a global scale

### Challenges in global DNS manipulation measurement:

- 1. Website localization
- 2. Difference in censor behaviors
- 3. Lack of clear signals of manipulation

### **Prior Work: Consistency-Based Detection**



#### In situ:

- Rely on volunteers or 3rd party services (VPN, VPS)
- Direct access to vantage points in residential networks
   Platforms: OONI, IClab, REMeDy, UBICA...

Remote:

- 1. Rely on identifying ethical open resolvers on the global scale
- 2. Enhanced consistency, continuity, and coverage. **Platforms**: Iris, Censored Planet





Trusted resolvers (Google, Cloudflare and UltraDNS, etc)

#### Test resolvers

### Design DNS manipulation detection heuristics (contd.)

<b>Consistency</b> Intuition: shared infrastructural				l	Consis	tency				Verif	iable S	ignals
<ul> <li>IP</li> <li>UTTP</li> </ul>		IP	h(Cert)	h(HTTP)	ASN	ASNa	PTR	TTL	Thres	Cert	Page	Manual
<ul> <li>HTTP content hash</li> <li>HTTPS certificate hash</li> </ul>	00NI (2012)	٠			•		٠				٠	
AS number and name	Censored Planet (2020)	•	•	•	•	•	٠					
<ul> <li>PTR (CDN)</li> <li>Threshold: domains → IP</li> </ul>	IClab (2020)	•			•				•		٠	
• TTL	Yadav et al. (2018)	•			•							•
Verifiable Signals	lris (2017)	•	•	•	•	•	•			•		
Blockpage matching	REMeDy (2017)	•			•			•				
• Diockpage matching	UBICA (2015)	•										
	Verkamp et al. (2012)	٠					٠					

### **Challenges with consistency heuristics:**

• Rise in popularity of CDNs and cloud providers

### Insight:

Move from consistency-based heuristics → verifiable signals

### Verifiable signals:

- Certificate
- Blockpages fingerprinting

-> valid TLS certificates can only be issued by the domain owners



### Data

- **Timespan:** 7 months (mid May to Nov, 2022)
- **Frequency:** Twice per week
- Volume:
  - DNS: 2,000+ domains measured on 25,000+ open resolvers, 50 M per snapshot
  - Page: 4 M per snapshot



### **Curated Blockpage Fingerprints**

Category	Product	National	ISP	Corporation	Unknown	General
Count	26	92	38	14	15	30

Blockpage fingerprints open-sourced: community can easily integrate into their systems

### **Certificate misissuance**



Certificate

#### www.dtic.mil

Issued by: DOD SW CA-60 Expires: Tuesday, August 23, 2022 at 8:36:26 AM Eastern **Daylight Time** 

S "www.dtic.mil" certificate is not standards compliant

#### sni.dreamhost.com

Self-signed root certificate Expires: Friday, August 8, 2025 at 2:24:23 PM Eastern Daylight Time

A This certificate has not been verified by a third party



#### www.kcna.kp

Issued by: www.dprk.gov.kp Expired: Thursday, August 19, 2021 at 11:51:02 PM Eastern Daylight Time

S "www.kcna.kp" certificate is not trusted

**Stats:** 1.3% control certificate are invalid, represents 3.24% of the ~2,000 domains in the test list

### **Certificate Validity**

- The certificate chains to a **trusted** root in the Mozilla NSS Root Store (used by Mozilla Firefox)
- The **hostname** in the certificate (either in the common name or the subject alternative name) matches the domain we are attempting to reach, following the rules as specified in RFC 612

### **Certificate as Proxy of DNS Manipulation Detection**

#### 0. Valid certificate: confirms correct DNS resolution.

a. Strong signal that the IP address is not manipulated

-> no pages come with a valid cert is a known blockpage

- 1. Untrusted Root With Matched Hostname:
  - a. **Blockpage matching:** 86.25% (2,521 out of 2,923) of the certificates come with blockpages
  - b. **The rest:** TLS proxies Keweon, WebTitan and Mimecast
  - c. 451 Unavailable For Legal Reasons: SkyDNS and SafeDNS



### **Certificate as Proxy of DNS** Manipulation Detection

- 2. Trusted Root With Mismatched Hostname:
  - a. **Blockpage matching:** 10.48% (2,518/ 24,029) certificates match a blockpage
  - b. No matched blockpage:
    - i. **200 OK**: largely ISP informative certificates
    - ii. **400+** status code: 98.71% from China
    - iii. **500+** status code: Fortinet



### 3. Untrusted Certificate With Mismatched Hostname:

- a. **Blockpage matching:** 92.31% (4,167/4,514) of the certificates come with blockpages
- b. Informative certificates
- c. **Potential misconfiguration**: common name as "textexp", "test" and "Plesk".

## Certificate validation is an effective proxy to detect DNS manipulation.

- 1. Quick automated detection of DNS manipulation
- 2. It reveals critical information when the middleboxes and ISPs choose not to return blockpages
- 3. Discover covert DNS manipulation (no blockpage)

			Eval	uatio	n							
				Co	onsis	tency				١	/erifia Signa	
	Measurement Range	IP	h(Cert)	h(HTTP)	ASN	ASNa	PTR	TTL	Thres	Cert	Page	Manual
00NI (2012)	Global ( 200 countries)	•			•		•				•	
Censored Planet (2020)	Global (220 countries)	•	•	•	•	•	•					
ICIab (2020)	Global (62 countries)	•			•				•		•	
Yadav et al. (2018)	India	•			•							•
Iris (2017)	Global (151 countries)	•	٠	•	•	•	•			٠		
REMeDy (2017)	Local ISPs	•			•			•				
UBICA (2015)	Pakistan, South Korea and Italy	•										
Verkamp et al. (2012)	Global (11 countries)	•					•					

### **CP/Iris False Positives: Consistency-based Heuristics**

		Iris Mani	pulated				Iris Unn	nanipulate	d	
Compar	ison	CERTainty Result	Count	Percentage		Comparison	CERTainty	Result	Count	Percentage
Same with CERTainty		Invalid Cert HTTP Blockpage	95,624 15,492	13.98% 2.27%		ntradict with ERTainty	Invalid Ce HTTP Blo		11,097 840	0.13% 0.01%
Contradict CERTainty		Valid Cert	495,532	72.45%		me with ERTainty	Valid Cert		7,529,487	88.85%
Unconfirm CERTainty	-	HTTP Only Connection Error Malformed Cert	33,592 38,407 5,275	4.91% 5.61% 0.77%		confirmed by ERTainty	HTTP On Connectio Malformed	n Error	186,627 551,179 194,390	2.20% 6.50% 2.29%
					ASN	AS Owner	Count	Percent	age	Туре
•	False	Positives: 72.45	%		A\$3303	Swisscom	86,115	13.63	%	CDN
•	Reas	on:			AS9498	Airtel	82,099	13.00		CDN
	0	Coverage of Co	ontrol		AS20940 AS1299	Akamai Arelion	63,592 33,763	10.07 5.359		CDN CDN
	0	Metadata taggi		ffort	AS139341	Aceville Pte	18,183	2.889		d Provider
		- cert hash: 30.3	0		AS54113	Fastly	16,153	2.569		CDN
					AS24940	Hetzner	12,524	1.989		d Provider
		- HTTP hash: 93	5%		AS9121	Türk Telekom		1.879		elecom
		- AS: 99%			AS9002	RETN	10,380	1.649	<i>1</i> 0 <b>1</b>	elecom

Top 10 ASes of False Positives

### **CP/Iris False Negatives: Consistency-based Heuristics**

	Iris Manij	pulated			Iris Unmanipulated						
Comparison	CERTainty Result	Count	Percentage	e Co	mparison	CERTa	inty Result	Count	Percentage		
Same with CERTainty	Invalid Cert HTTP Blockpage			vith Invalid Cert HTTP Blockpage		11,097 840	0.13% 0.01%				
Contradict with CERTainty	Valid Cert	495,532	72.45%	Same CERT		Valid	Cert	7,529,487	88.85%		
Unconfirmed by <i>CERTainty</i>	HTTP Only Connection Error Malformed Cert	CERTainty			HTTP Only Connection Error Malformed Cert		186,627 551,179 194,390	2.20% 6.50% 2.29%			
• Fals	<b>e Negatives</b> : 9.7%			Matched Heuristic	s HTTP hash	Cert hash	ASN	AS name	CDN		
• AS a	nd CDN (PTR): ex	periential		Count	372	460	10,388	10,384	11,937		
cons	straint - blockpage	s pages c	an be	Percentage	3.12%	3.85%	87.02%	86.99%	100.00%		

 hosted on big CDNs
 HTTP and cert hash: general error page and CDN certificates

False negatives introduced by consistency-based heuristics

### Findings: Filtering Product Vendors

- **Stats**: 17 DNS manipulation filtering product vendors, 52 countries
- Different deployment strategies:
  - Page info:
    - (red square) legal blockpage
    - (red circle) general blockpage
  - Root cert:
    - (black triangle) Trusted root informative leaf cert
    - Untrusted root MitM
- Centralized IP pool for decentralized deployment:
  - Fortinet: one IP (208.91.112.55, AS40934)

	Product	Origin	Block Page	Root Cert	Country of Deployment
IIY	Cira	CA	•		CA
III	WebTitan	US	•		US
00	OneDNS	CN	•		CN
ne	JusprogDNS	DE	•	<b>A</b>	DE
o u	Infoblox	US	•	<b>A</b>	US
d i	NextDNS	US	•	<b></b>	US
ve	Comodo	US	•		US
Observed in one country	Zyxel	CH			CH
q	WatchGuard	US			US
	Securly	US	•		US
Observed in multiple countries	OpenDNS (Cisco)	US	•	•	AR, AU, BR, CA, CL, CN, CR, CZ, DE, ES, FR, GR, ID, IE, IN, IT, JP, KR, KZ MX, NZ, RO, SE, SK, US, ZA
iple (	AdguardDN	CA	•	<b>A</b>	GB, BY, CY, FR, ID, LV, NZ, RU
ult	SafeDNS	US		<b>A</b>	AU, NL, US
in m	Kewoen	DE			AU, DE, FR, GB, JP, NL, US
/ed	SkyDNS	RU			RU, UA, KZ
er	CloudVeil	US	•	<b></b>	CA, US
Obs	Fortinet	US		•	AR, AT, AU, BD, BF, BR, CA, CH, CL, CN, CZ, DE, DK, FR, GB, HK, ID, IN, IQ, IT, JP, KR, KW, MR, MY, NL, PH, PL, SV, TH, TR, TT, TW, US

Fine	linge	)					Country	AS number of returned IPs
	lings:							AS12616, AS44347, AS44587, AS49505, AS34241
ISP	UNS I	<b>Manipulation</b>	า					AS25549, AS31483, AS34757
• S	<b>stats</b> : 26 cc	ountries via cert validation	on				Russia	AS12389, AS50466
• D	Different de	eployment strategies:						AS42071, AS42071
	• Leaf							AS57571, AS43287, AS49469
		issued by ISP						AS8395
		-	ocking				Ukraine	AS42546
		issued by ISP for bl	ocking				Ukraine	AS42546
	<ul> <li>Page</li> </ul>	e info: legal blockpage						AS58396, AS45287, AS45287, AS45287, AS45287, AS38758
	○ Root	• general blockpage cert:					Indonesia	AS9341, AS9341, AS5578, AS9341
		Trusted root						AS16276, AS141626, AS141626, AS141626, AS7713
		Untrusted root						AS58495, AS132634
	Countral	AS much as of astrony of Do	Leaf	Block	Root			AS140413, AS136873
	Country	AS number of returned IPs	Cert	Page	Cert			AS56241
	Belgium	AS2611	•	•			Negal	AS63991
	Deigium	AS5432, AS8717	•		<b>A</b>		Nepal	AS140973
	Denmark	A\$35158	•	•		_	Thailand	AS23969
	Italy	AS29050			<b>A</b>		Singapore	AS3758, AS3758
	Columbia	AS35158	•			_	Belarus	AS6697
	Greece	AS6799					Lithuania	AS212531
	Switzerland	AS3303						A\$31313
	Germany	AS24940					Romania	AS12302
	Australia	AS16509						

	AS number of returned IPs	Leaf Cert	Block Page	Root Cert
	AS12616, AS44347, AS44587, AS49505, AS34241			
	AS25549, AS31483, AS34757	•	•	
	AS12389, AS50466			
	AS42071, AS42071	•		
	AS57571, AS43287, AS49469			
	AS8395	•		
	AS42546	•		
	AS42546	•	•	
	AS58396, AS45287, AS45287, AS45287, AS45287, AS38758	•	•	<b>A</b>
	AS9341, AS9341, AS5578, AS9341		•	<b>A</b>
	AS16276, AS141626, AS141626, AS141626, AS7713	•	•	
	AS58495, AS132634			
	AS140413, AS136873			
	AS56241	•	•	
	AS63991	•		
	AS140973		•	
	AS23969			
;	AS3758, AS3758	•		
	AS6697			
	AS212531			
	A\$31313			
	AS12302			

### Case study: Covert DNS Manipulation

- Signal: 400+ status code page with trusted cert
- **Stats**: 98.71% of those IPs are returned by DNS resolvers in China.
- IP ownership:
  - Facebook (66.30%)
  - Twitter (29.10%)
  - Cloudflare (3.36%)
  - other blocked CDN services: Fastly and Akamai (less than 0.08%)
- **Potential censorship leakage**: 14 surrounding countries shared some overlaps



### Summary

- Consistency-based heuristics are **error-prone**:
  - 72.45% of the manipulated DNS responses identified by the current state-of-the-art are **false positives**.
  - Experiential constraints like AS matching also introduce **false negatives** (9.7%).
- Should actively look for **verifiable signals** of DNS manipulation
- Identified 17 TLS proxy vendors deployed in 52 countries, as well as 26 countries with ISP-level DNS manipulation -> pinpoint the deployer of DNS manipulation
- Identified covert cases of DNS manipulation.
- Open-sourced 200+ unique DNS blockpage fingerprints=
- Collaborating with other platforms to **improve data quality**



https://www.geo3550.org/