# The Discriminative Power of Cross-layer RTTs in Fingerprinting Proxy Traffic

<u>Diwen Xue</u>, Robert Stanley, Piyush Kumar, Roya Ensafi University of Michigan Academics: Russia deployed new technology to throttle Twitter's traffic

Russia to spend over half a billion dollars to bolster internet censorship system

By Gleb Stolyarov and Lucy Papachristou

September 10, 2024 1:05 PM EDT · Updated 5 months ago

#### Documented internet shutdowns by year \*

\* These numbers reflect the latest data available as of publication of this update since the <u>report of internet shutdowns in 2022</u>. The 2023 data includes shutdowns we identified preliminarily between January 1 and May 19 of 2023.



Total number of shutdowns without India

Aa



#### PETER GUEST BUSINESS 26.10.2023 01:42 PM

### The UK's Controversial Online Safety Act Is Now Law

The UK government says its Online Safety Act will protect people, particularly children, on the internet. Critics say it's ineffective against dangerous misinformation and may be a threat to privacy.

#### EFF

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### The U.S. Government Wants To Control Online Speech to "Protect Kids"

DEEPLINKS BLOG

Governor Abbott Announces Statewide Plan Banning Use Of TikTok

## Austrian ISPs 'Had No Choice' But to Block Pirate Sites AND Cloudflare



### **Circumvention Proxies**





### **Background: Obfuscated Proxies vs. Firewalls**

A two-decade, adversarial arms race between tunneling tools and firewalls.

- After blocking plain tunnels, go after "obfuscated" variants.
- An arms-race-driven evolution of obfuscation and detection methods.
- → TLS-based obfuscated proxies
- → Fully-encrypted proxies
- → Probe-resistant proxies
- → Traffic shaping

 $\rightarrow$ 

- → TLS fingerprinting attacks
- → Entropy-based traffic filter
- → Active-probing fingerprinting
- → Traffic analysis

 $\rightarrow$ 



### IRC Tip about Signature used to block Snowflake in Russia, 2022-May-16

Issue actions

⊖ Closed D Issue created 2 years ago by shelikhoo



Make Snowflake's DTLS fingerprint more similar to popular WebRTC implementations

Issue actions

Open D Issue created 4 years ago by Cecylia Bocovich

#### **Prior Work:**

- Target protocol-specific flaws

   e.g., flawed TLS implementations
- Community Strategy: outpace firewalls that can't keep pace with every variant



similar to popular WebRTC implementations

Issue actions

🔵 Open) D Issue created 4 years ago by Cecylia Bocovich



### **Cross-layer RTT Diff as a Fingerprint for Tunnel**





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RTTdiff ~= processing delay



### **Cross-layer RTT Diff as a Fingerprint for Tunnel**



RTTdiff ~= processing delay + propagation delay

RTTdiff ~= processing delay



### **Efficacy & Assumptions**

### Fingerprint does <u>not</u> depend on...

- ↔ Client's location
- ↔ Firewall's relative position
- → Tunneling protocol

#### What matters:

→ Visibility of RTTDiff in the presence of encryption



Idea: cross-correlating request & response patterns to estimate application RTT



### **Efficacy & Assumptions**

#### Fingerprint does <u>not</u> depend on...

- $\hookrightarrow$  Client's location
- $\hookrightarrow$  Firewall's relative position
- → Tunneling protocol

#### What matters:

- → Visibility of RTTDiff in the presence of encryption
- Decide if observed RTTDiff
   indicates tunnel routing

Framework: Sequential Hypothesis Testing

- HO: Direct; H1: Proxied
- Identify the presence/absence of a prior, based on separation of distribution under different priors





### **Fingerprint Sensitivity**

#### Setup:

- → State-of-the-art popular obfuscated proxies
- → Geographically distributed clients & proxies
- → Top domains as web servers

Except obfs4, results across all protocols are practically identical

Proxy/Client	DTW	HKG	ΤΥΟ	СЕК	ARN
Remote DNS Resolution, CrUX Global 5K					
ATL SIN AMS	.207 / .819 .177 / .738 .201 / .775	.233 / .828 .172 / .727 .181 / .747	.219 / .784 .180 / .743 .201 / .759	.201 / .802 .199 / .732 .197 / .711	.215 / .791 .201 / .738 .172 / .766
Local DNS Resolution, CrUX Global 5K					
ATL SIN AMS	.372 / .905 .455 / .898 .435 / .905	.340 / .876 .313 / .842 .337 / .839	.377 / .880 .315 / .851 .328 / .856	.443 / .927 .438 / .892 .293 / .854	.448 / .907 .424 / .880 .339 / .877
Remote DNS Resolution, CrUX Regional 5K					
ATL SIN AMS	- / - - / - - / -	.186 / .712 .147 / .719 .176 / .658	.193 / .765 .133 / .748 .190 / .722	.410 / .879 .330 / .851 .352 / .827	.364 / .851 .313 / .842 .221 / .808

- → Per-flow moderately effective, exposure amplified when aggregated by website visits
- → Factors such as DNS handling and CDN connectivity would affect fingerprint's efficacy



### Fingerprint Specificity (Collateral damage)

#### Setup:

- → Collaborate with a regional ISP
- → Apply fingerprint to mirrored real-user traffic (~50 Gbps)
- → Conservatively consider all detections as false positives

\* How the Great Firewall of China Detects and Blocks Fully Encrypted Traffic. USENIX'23

#### Estimated FPR ~= 0.6%

- → Comparable to reports of real-world censoring deployments\*
- → Potential categorical false positives (e.g., email)

Category	Identifier	Percentage of All Positives (%)
Rmt Port	443 993 80 5222 9001	57.88 33.29 4.47 0.43 0.30
SNI	apple.imap.mail.*.com imap.*.com android.imap.mail.*.com imap.mail.*.com *.*health.com (empty) / Not applicable	14.89 5.32 2.91 2.90 2.13 17.47



### **Potential Mitigation**

#### → Would a firewall deploy this?

- Demonstrated practicality; Broad applicability; Complementary to other detection methods
- Relies on subtle timing; Potential for non-trivial collateral damage.
- <u>Don't rely on network unreliability as the only defense.</u>

#### → Countermeasures discussed in the paper:

- Proxy configurations
- ♦ Multiplexing —
- Traffic splitting Iikely creating new timing patterns that are fingerprintable
- ◆ TCP Delayed ACK
- Traffic scheduler



### **Potential Mitigation**

### → obfs4 / Scramblesuit

- Seeded randomness at install; one random "shape" (timing, size) per obfs4 server
- Finding: <u>lower performance</u> yet <u>increase exposure</u>
  - When application is quiet, obfs4 is quiet
  - Only inflates packet delay/size, can't obfuscate inherently large RTT/size patterns

Analogous observation: Xue, Diwen, et al. "Fingerprinting Obfuscated Proxy Traffic with Encapsulated TLS Handshakes", USENIX'24

### Future directions

- Flexible obfuscation to support arbitrary timing patterns
- Define a "normal" timing shape
- Balance performance overhead
- Avoid convergent obfuscation that becomes new fingerprint

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