

# **Censored Planet: Measuring Internet Censorship Globally and Continuously**

**Roya Ensafi**

AIMS 2018

# Measuring Internet Censorship Globally

## PROBLEM:

- How can we detect whether pairs of hosts around the world can talk to each other?



# Measuring Internet Censorship Globally

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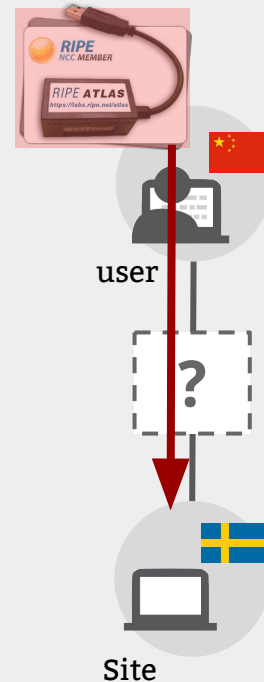
- How can we detect whether pairs of hosts around the world can talk to each other?

## STATE OF THE ART:

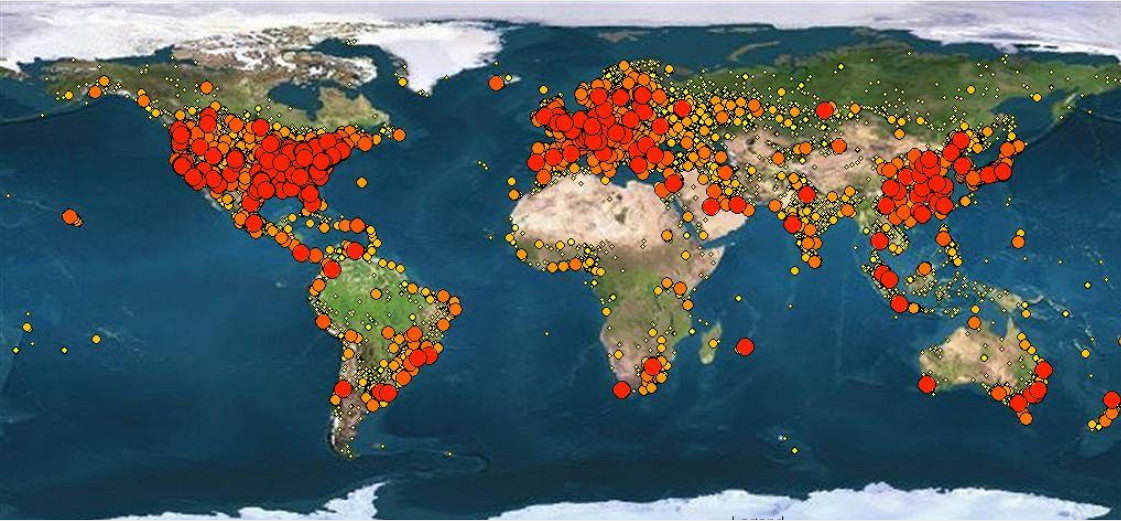
- Deploy hardware or software at hosts (RIPE Atlas, OONI probe)
- Ask people on the ground, or use VPNs, or research networks (PlanetLab)

## THREE KEY CHALLENGES:

**Coverage, ethics, and continuity**



# Thinking Like an "Attacker"...



**140 million public live IPv4 addresses**

These machines blindly follow Internet protocol rules such as TCP/IP.

How can we leverage standard protocol behaviors to detect whether two distant hosts can communicate?

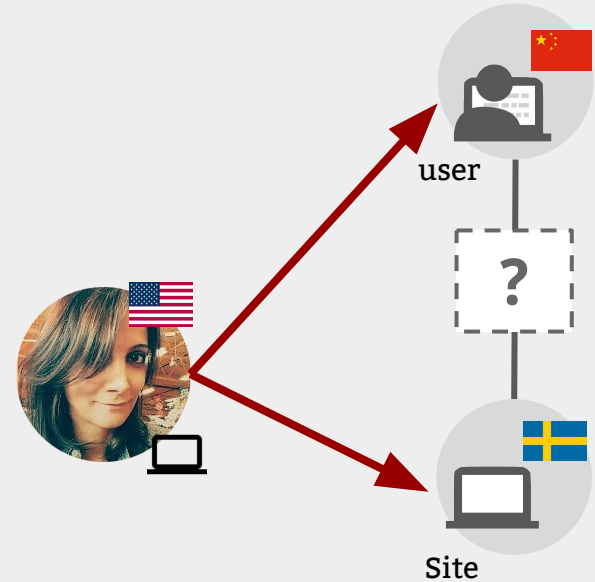
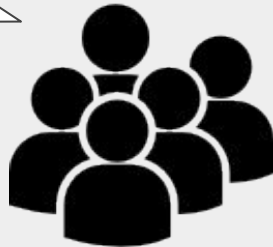
# Measuring Internet Censorship Globally... Remotely!

## PROBLEM:

- How can we detect whether pairs of hosts around the world can talk to each other?

**...from somewhere else in the world?**

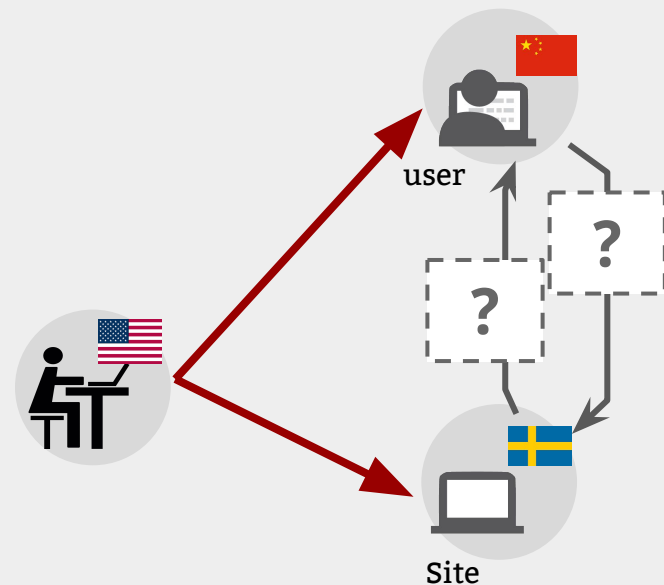
**Impossible!**



# Spooky Scan

**Spooky Scan** uses TCP/IP side channels to detect whether a user and a site can communicate (and in which direction packets are blocked)

Goal: **Detect blocking from off-path**

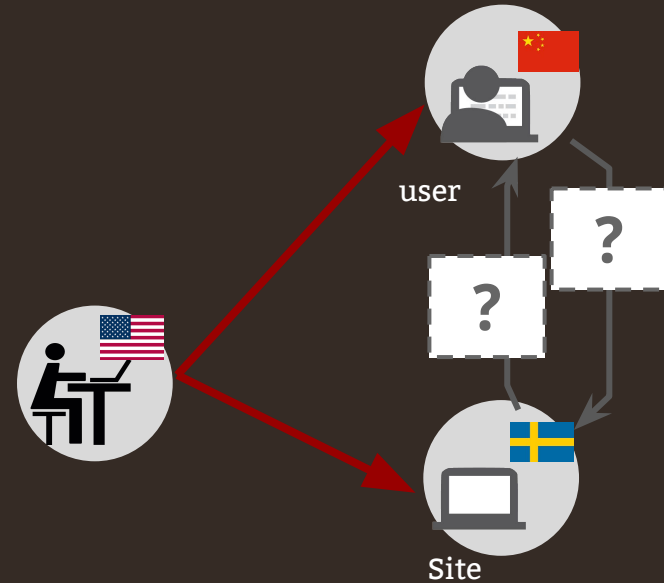


- \* **TCP Idle Scan** Antirez, (Bugtraq 1998)
- \* **Detecting Intentional Packet Drops on the Internet via TCP/IP Side Channels** Royce White, Knockel, Alexander, and Crandall (PAM '14)
- \* **Idle Port Scanning and Non-interference Analysis of Network Protocol Stacks Using Model Checking** Royce White, Park, Kapur, and Crandall (Usenix Security 2010)

# Augur

**Augur** is a follow up system that uses the same TCP/IP side channels to detect blocking from off-path.

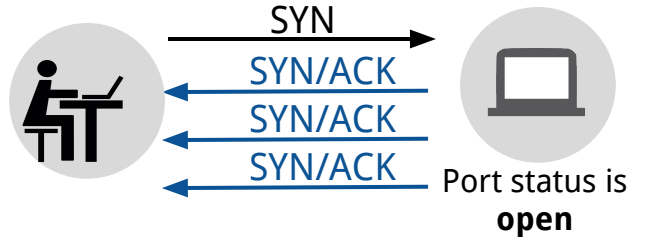
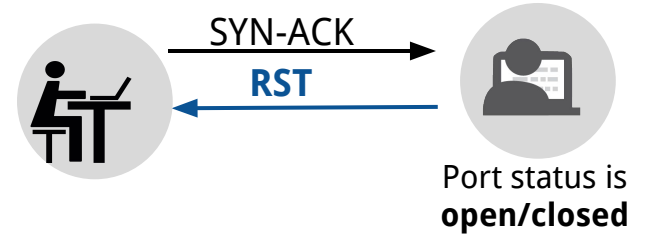
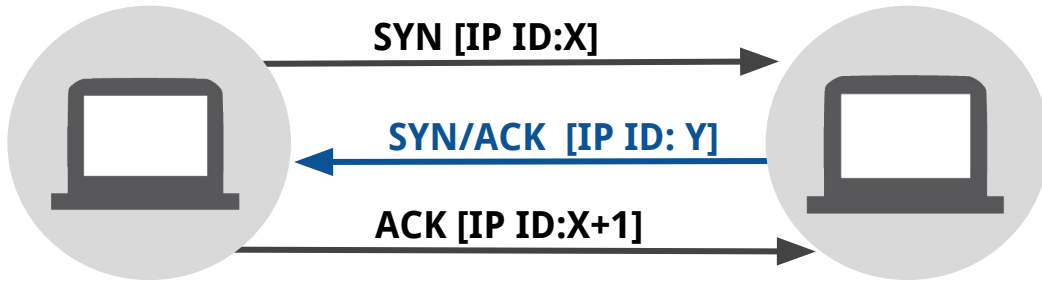
Goal: **Scalable, ethical, and statistically robust system to continuously detect blocking.**



\* Augur: Internet-Wide Detection of Connectivity Disruption  
P. Pearce\*, R. Ensafi\*, F. Li, N. Feamster, V. Paxson  
(\* joint first authors)

# TCP/IP

## TCP Handshake:





# Spooky Scan Requirements



## “User” (Reflector)

Must maintain a global value for IP ID



## Site

Open port and retransmitting SYN-ACKs



## Measurement Machine

Must be able to spoof packets

# Spooky Scan



Measurement  
machine



Reflector

**Reflector IP ID**



Site

# Spooky Scan

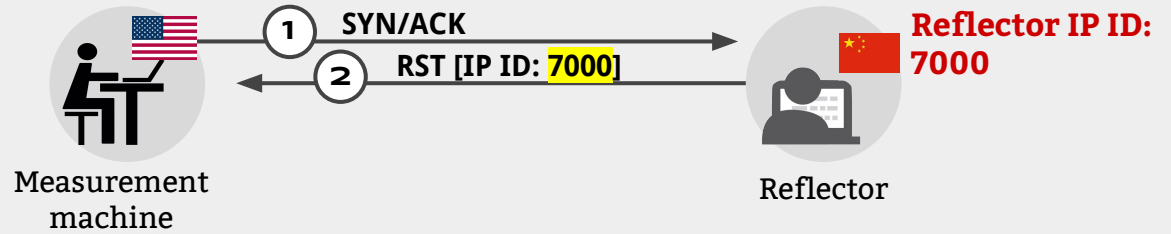
No direction blocked



Site

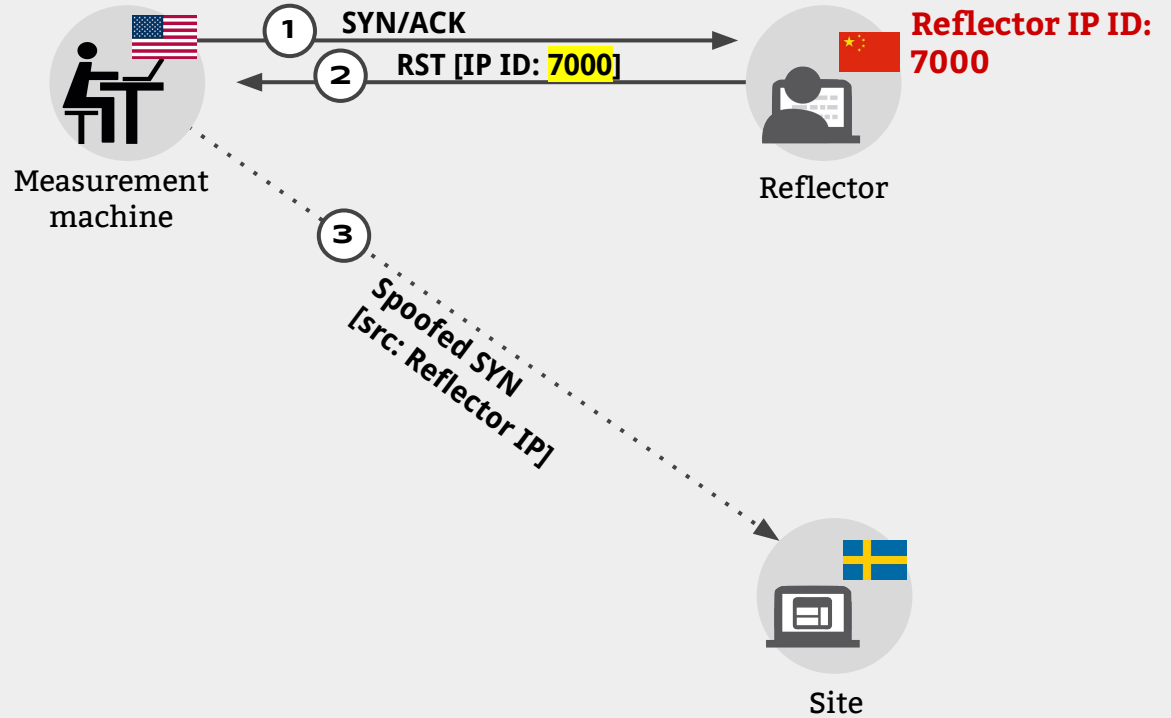
# Spooky Scan

No direction blocked



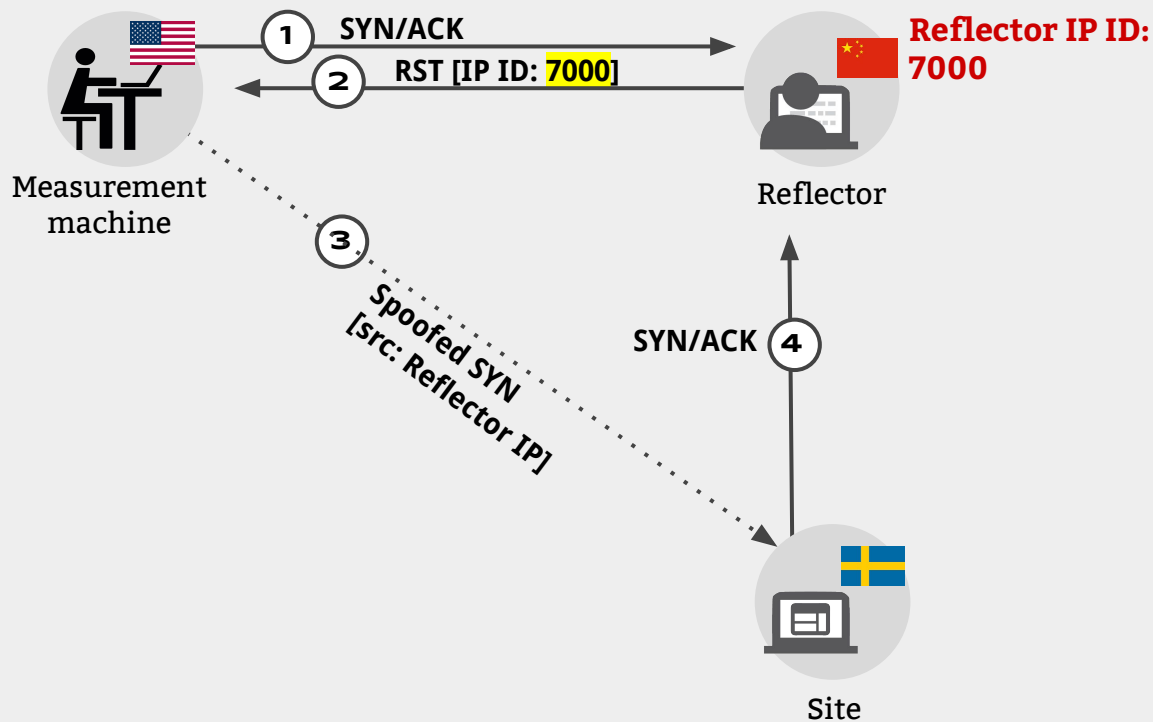
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No direction blocked



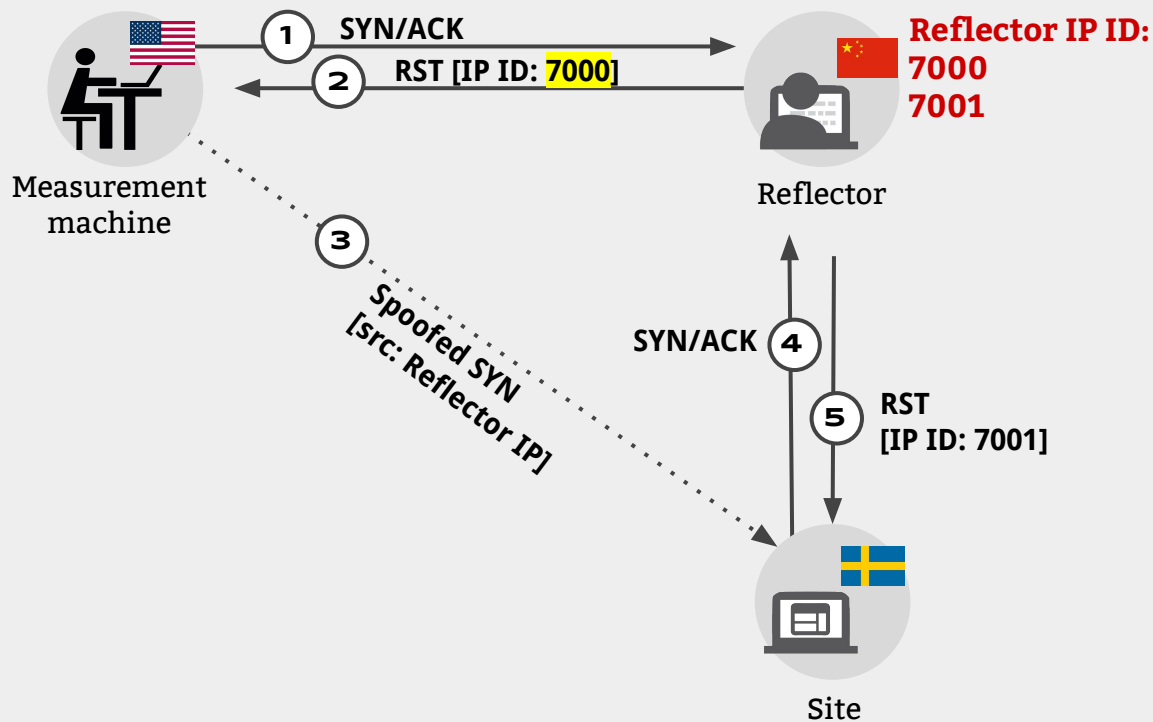
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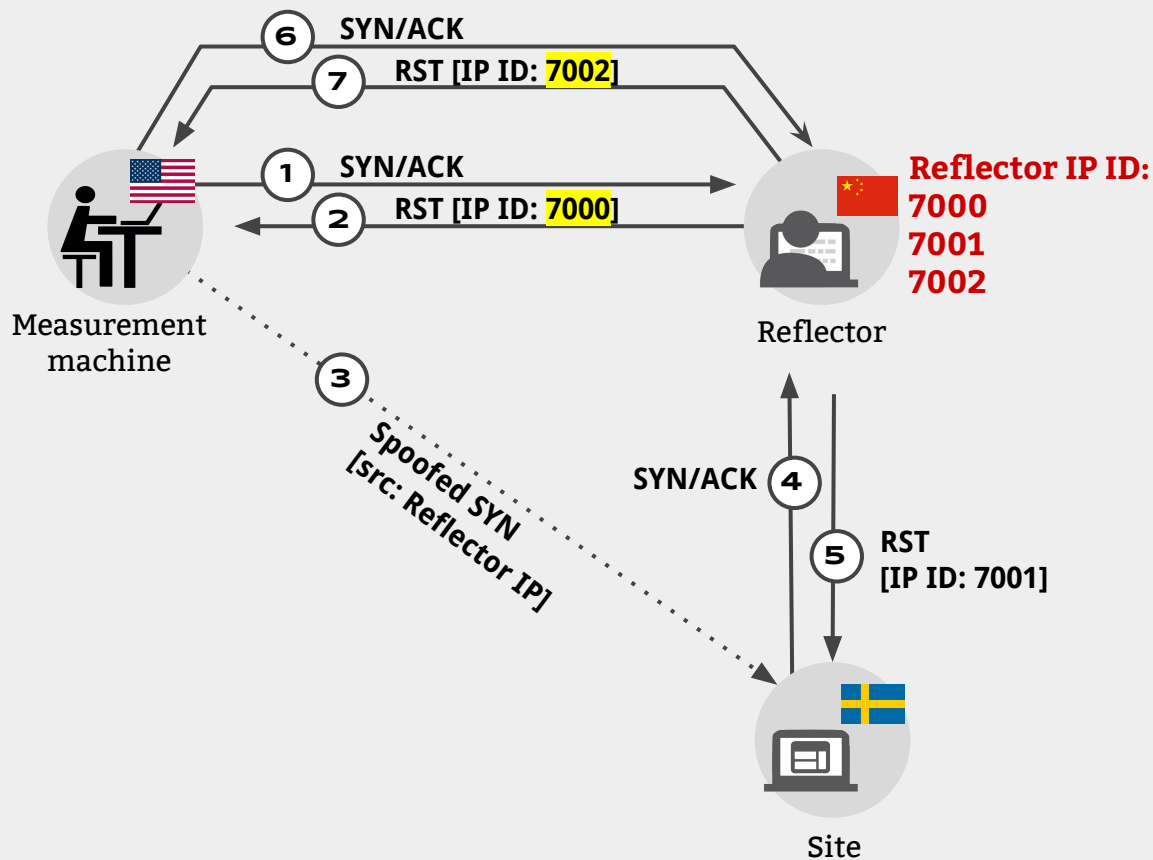
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No direction blocked



# Spooky Scan

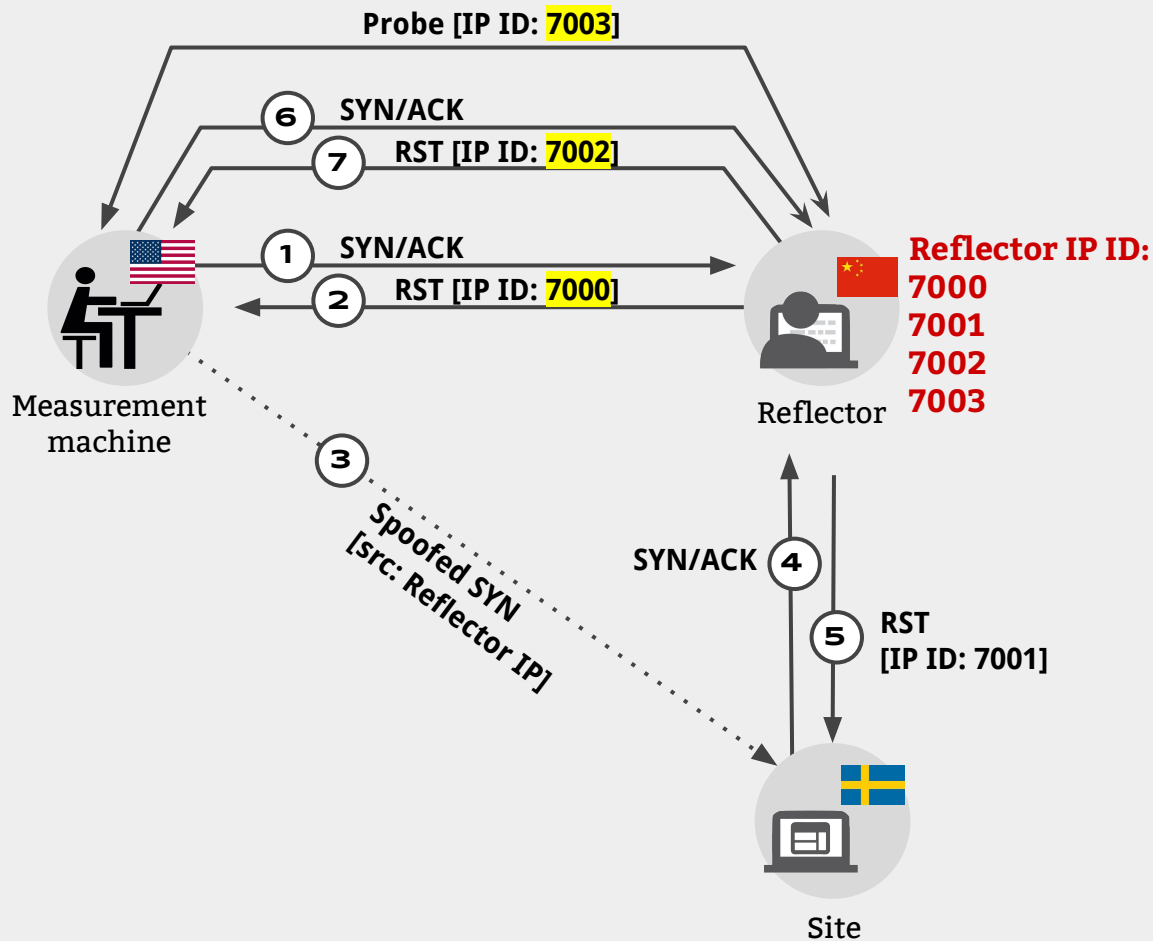
No direction blocked





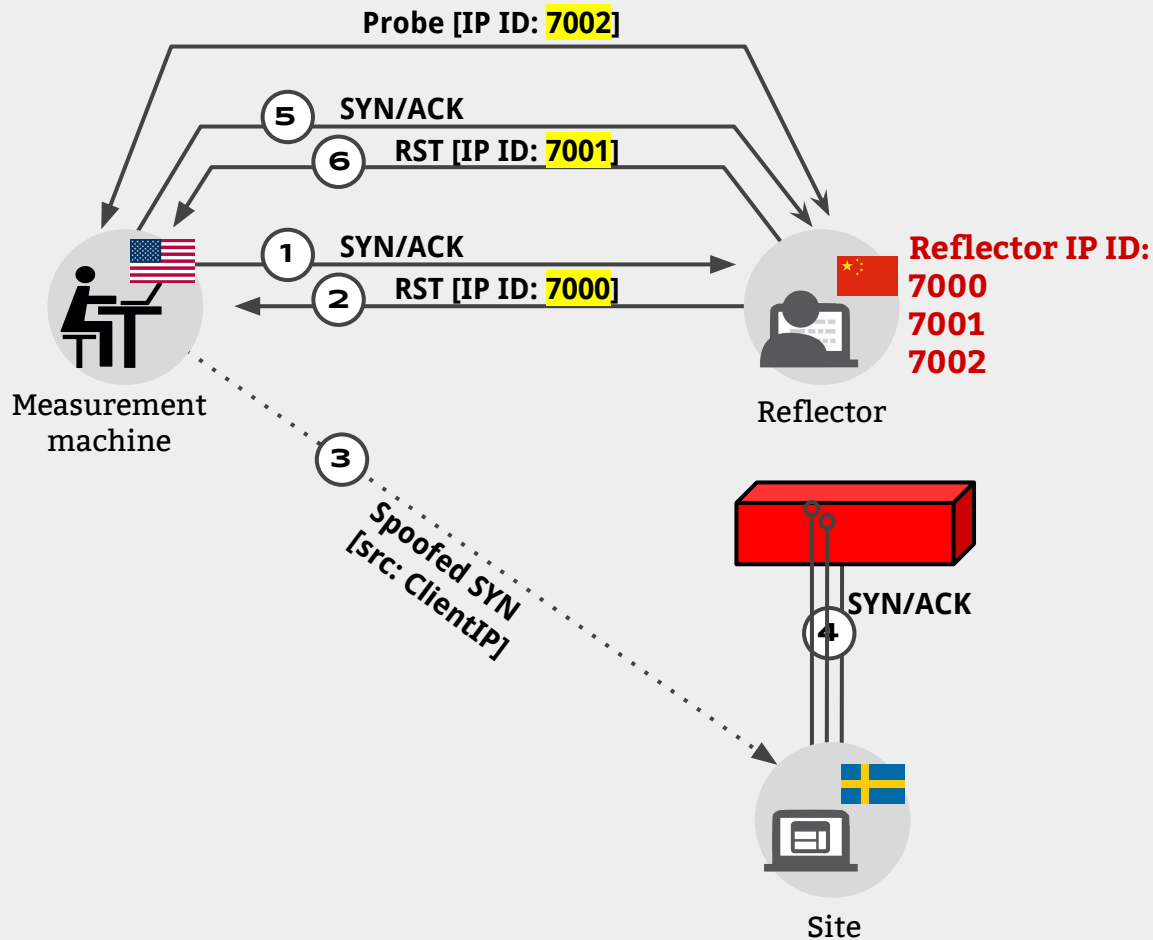
# Spooky Scan

No direction blocked



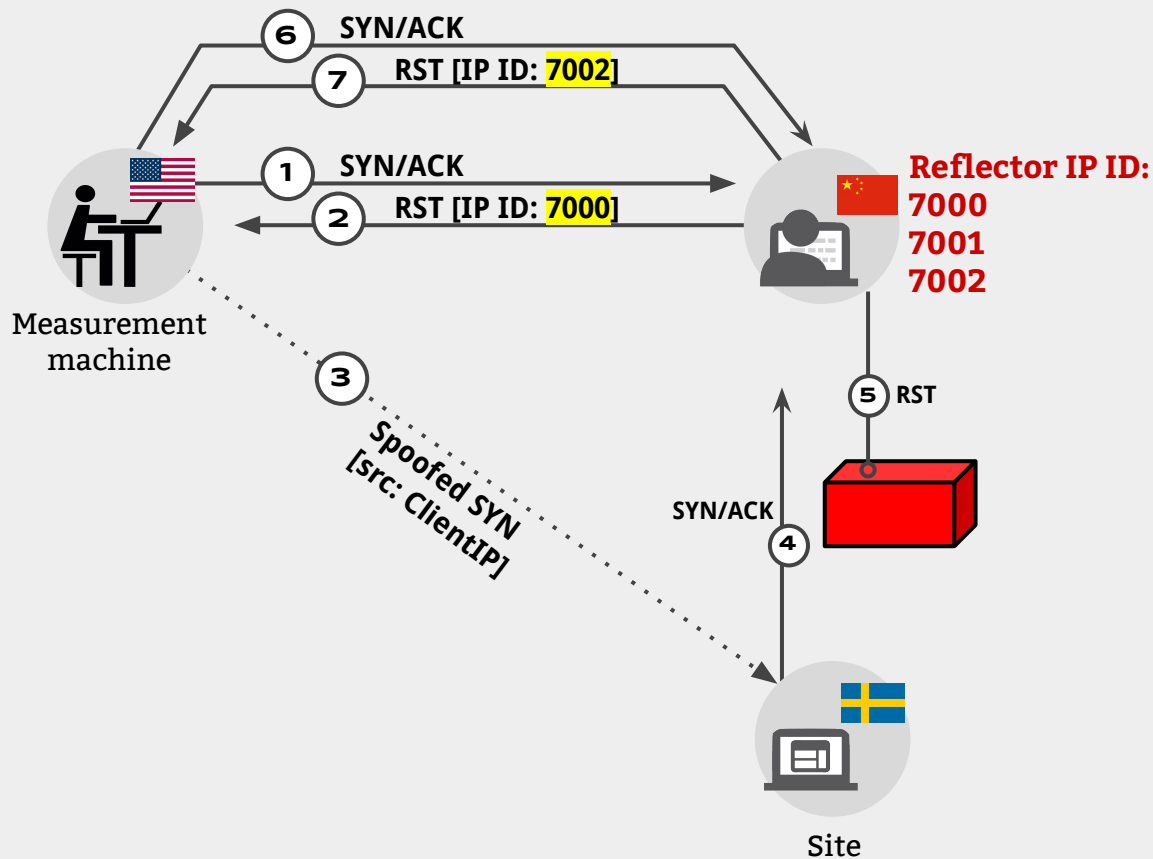
# Spooky Scan

Site-to-Reflector  
Blocked



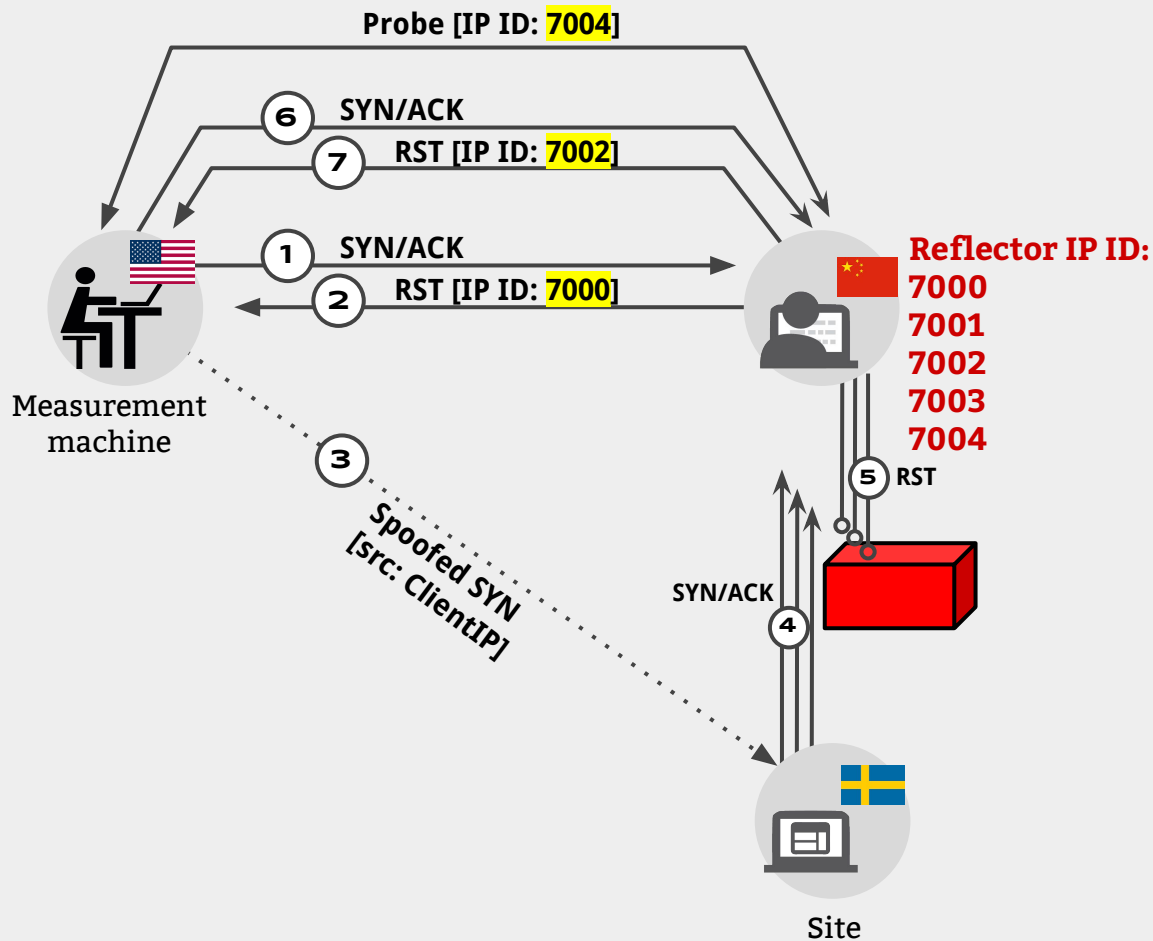
# Spooky Scan

Reflector-to-Site  
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# Spooky Scan

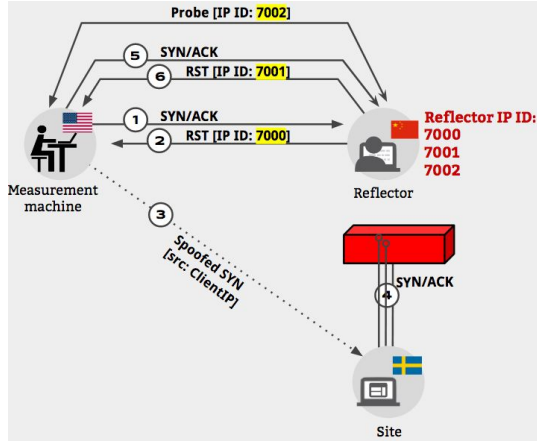
Reflector-to-Site  
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# Spooky Scan

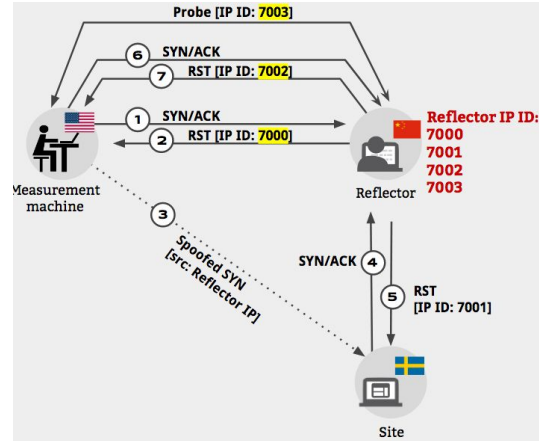
## Site-to-Reflector Blocked

$\Delta IP ID1 = 1$   
 $\Delta IP ID2 = 1$



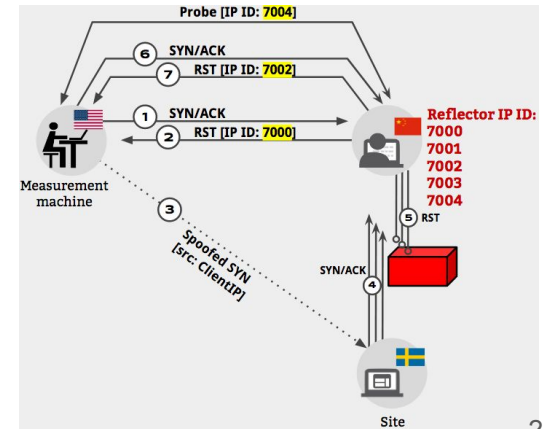
## No Direction Blocked

$\Delta IP ID1 = 2$   
 $\Delta IP ID2 = 1$

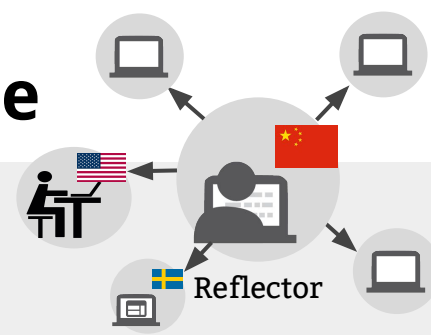


## Reflector-to-Site Blocked

$\Delta IP ID1 = 2$   
 $\Delta IP ID2 = 2$



# Coping with Reflector IP ID Noise



## Amplifying the signal

Effect of sending  $N$  spoofed SYNs:

### Site-to-Reflector Blocked

$$\begin{aligned}\Delta \text{ IP ID1} &= (1 + \text{noise}) \\ \Delta \text{ IP ID2} &= \text{noise}\end{aligned}$$

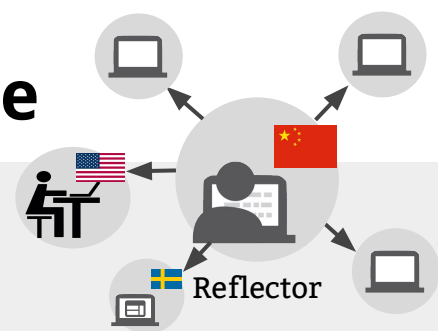
### No Direction Blocked

$$\begin{aligned}\Delta \text{ IP ID1} &= (1 + N + \text{noise}) \\ \Delta \text{ IP ID2} &= \text{noise}\end{aligned}$$

### Reflector-to-Site Blocked

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## Repeating the experiment

To eliminate the effects of packet loss, sudden bursts of packets, ...

# Augur for Continuous Scanning

**Insight:** Some measurements much noisier than others.



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## Probing Methodology:

Until we have high enough confidence (or up to):

- Run
- For first 4s, query IPID every sec
    - Send 10 spoofed SYNs
    - Query IPID
  - Query IPID

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- Run
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    - Send 10 spoofed SYNs
    - Query IPID
  - Query IPID

**Repeat runs and  
use Seq. Hypothesis Testing  
to gradually build confidence.**

# Augur: Sequential Hypothesis Testing

Defining a random variable:

$$Y_n(S_i, R_j) = \begin{cases} 1 & \text{if no IPID acceleration occurs} \\ 0 & \text{if IPID acceleration occurs} \end{cases}$$

# Augur: Sequential Hypothesis Testing

Defining a random variable:

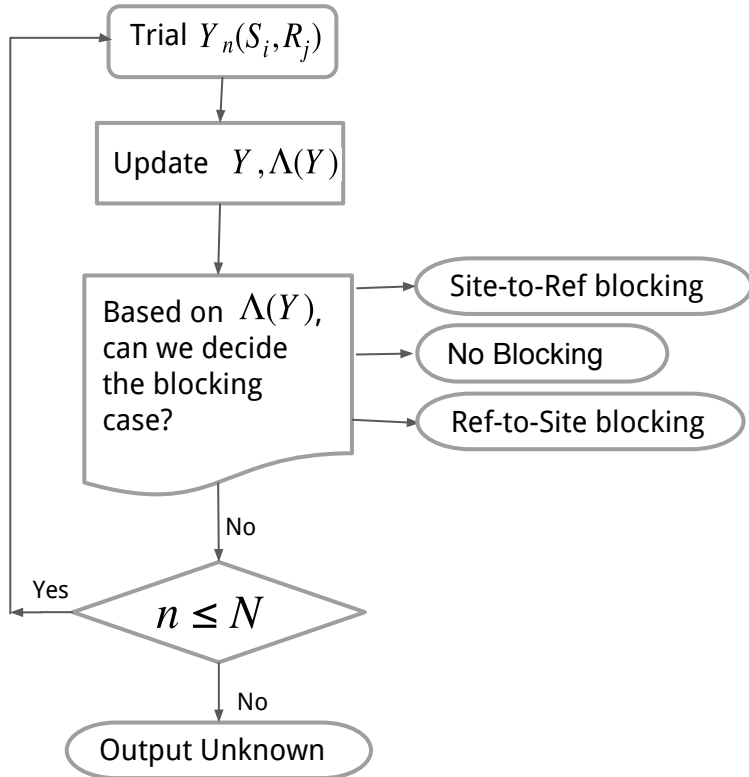
$$Y_n(S_i, R_j) = \begin{cases} 1 & \text{if no IPID acceleration occurs} \\ 0 & \text{if IPID acceleration occurs} \end{cases}$$

Calculate known outcome probabilities (priors):

**Prior 1:** Prob. of no IPID acceleration when there is blocking

**Prior 2:** Prob. of IPID acceleration when there is no blocking

# Augur: Sequential Hypothesis Testing

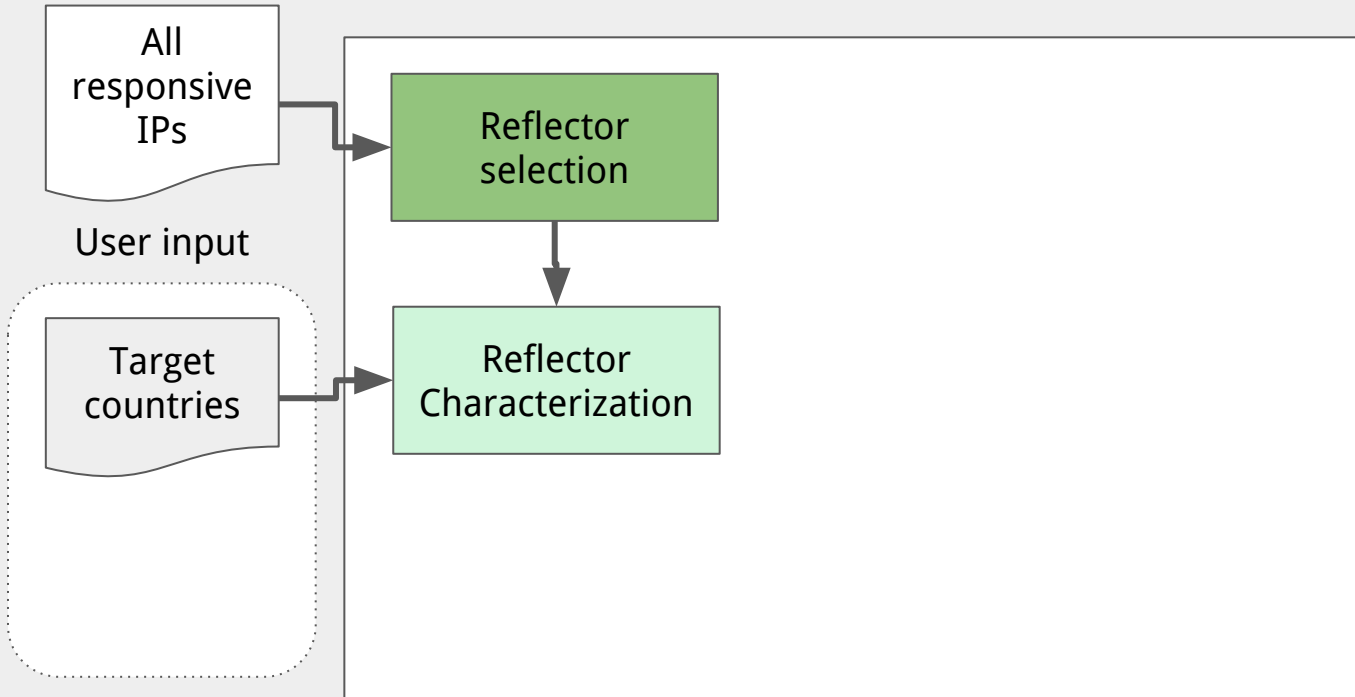


**Maximum Likelihood Ratio**

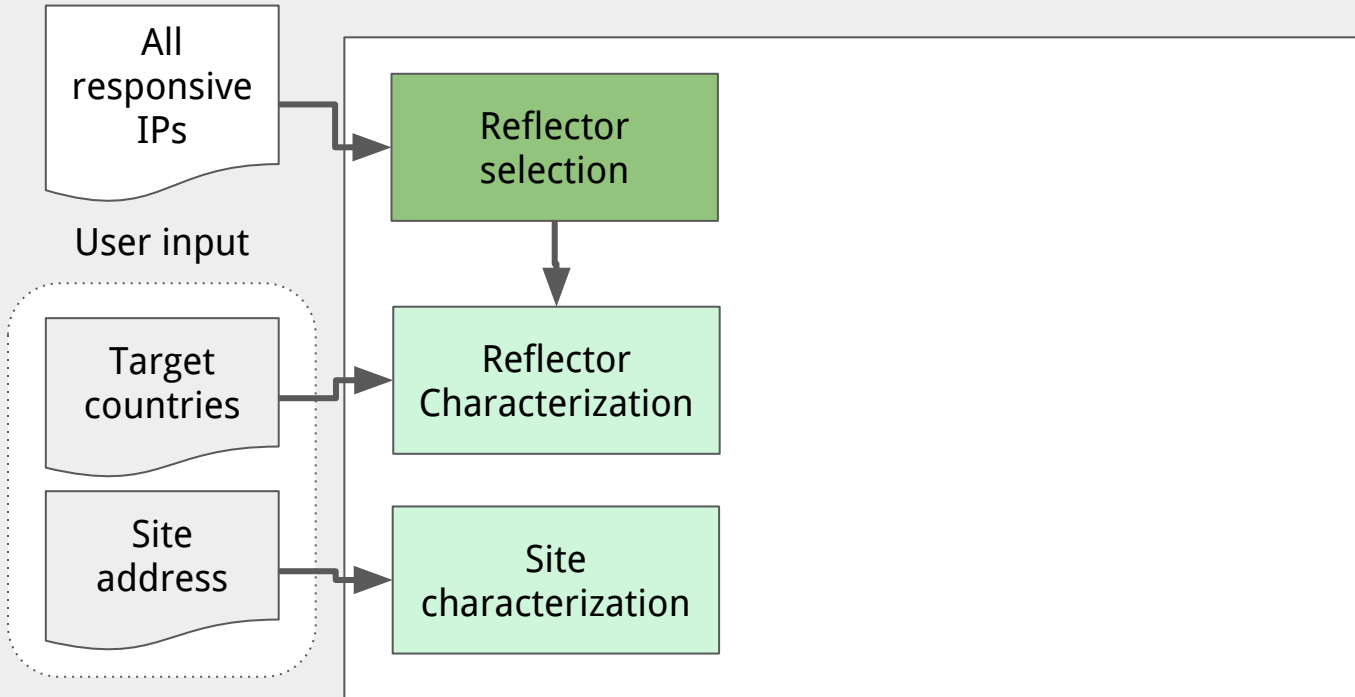
$$\Lambda(Y) \equiv \prod_{n=1}^N \frac{Pr[Y_n | \text{Blocking}]}{Pr[Y_n | \text{No Blocking}]}$$

# Augur Framework

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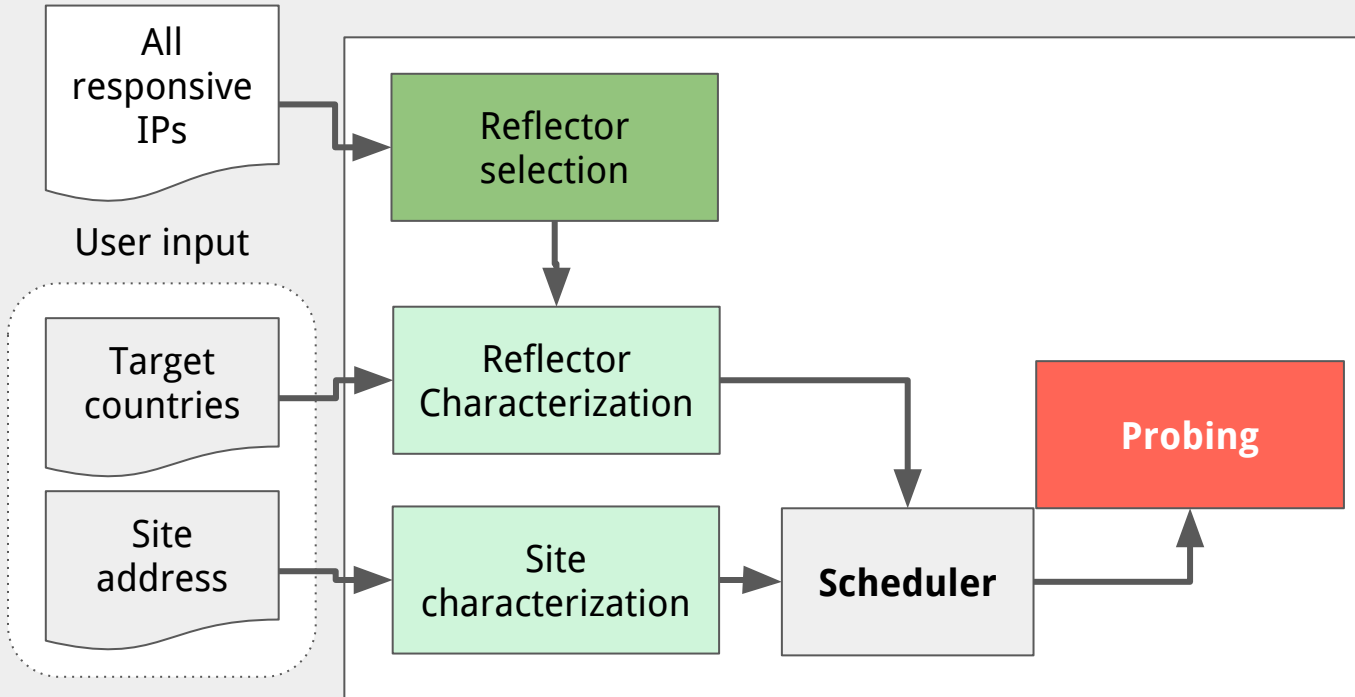


# Augur Framework

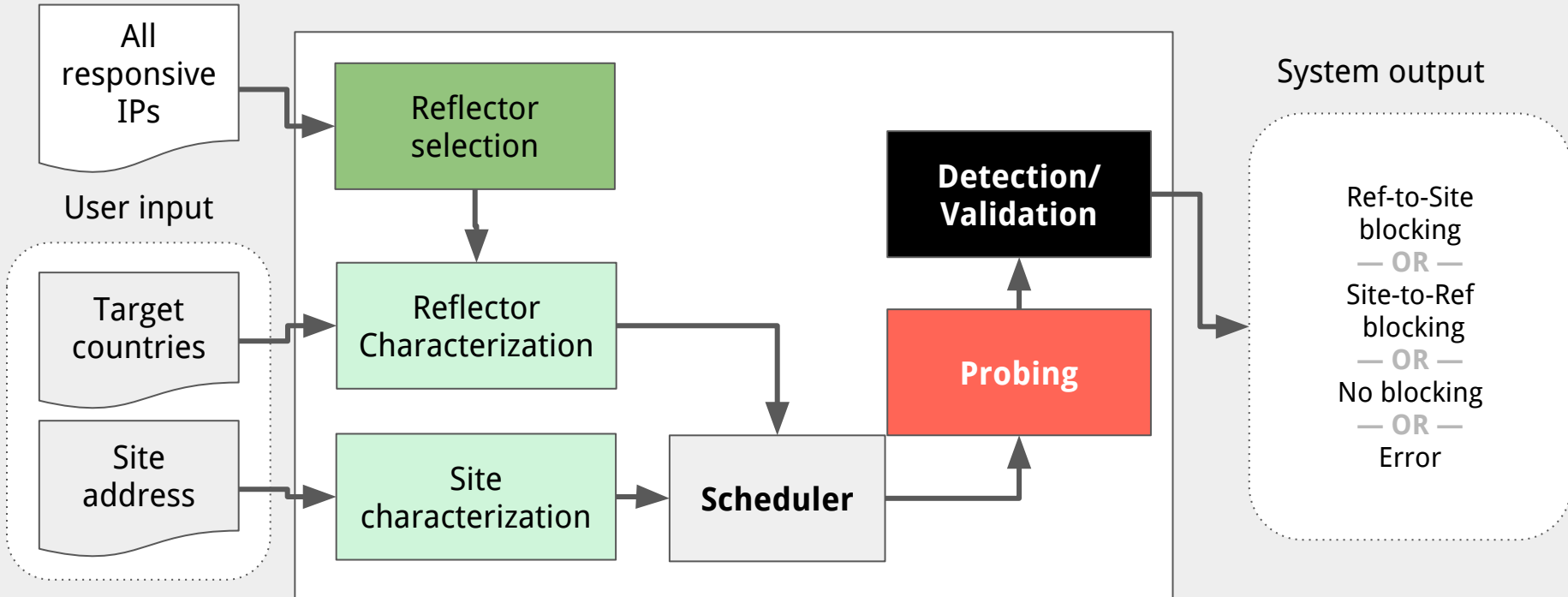




# Augur Framework



# Augur Framework



# Coverage

**Challenge:** Need global vantage points from which to measure

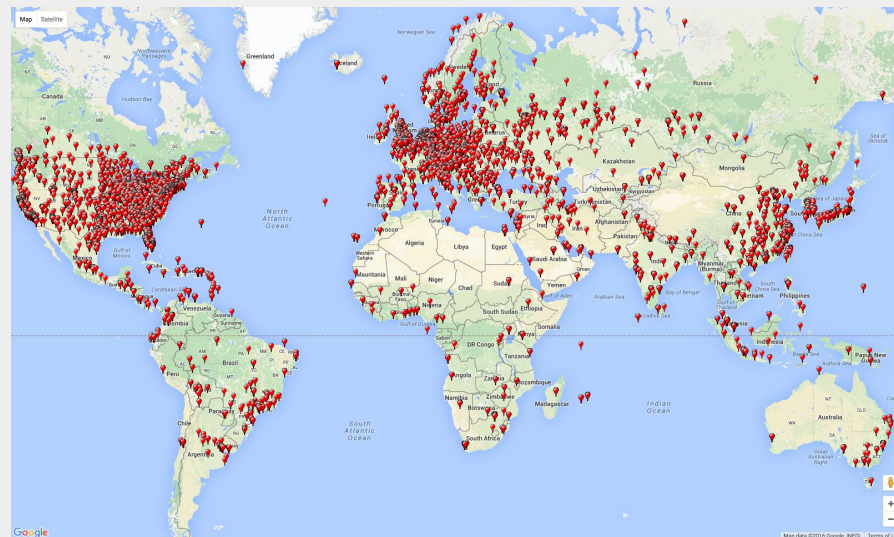
**THREE KEY CHALLENGES:**  
Coverage, ethics, and continuity



## Scanning IPv4 on port 80:

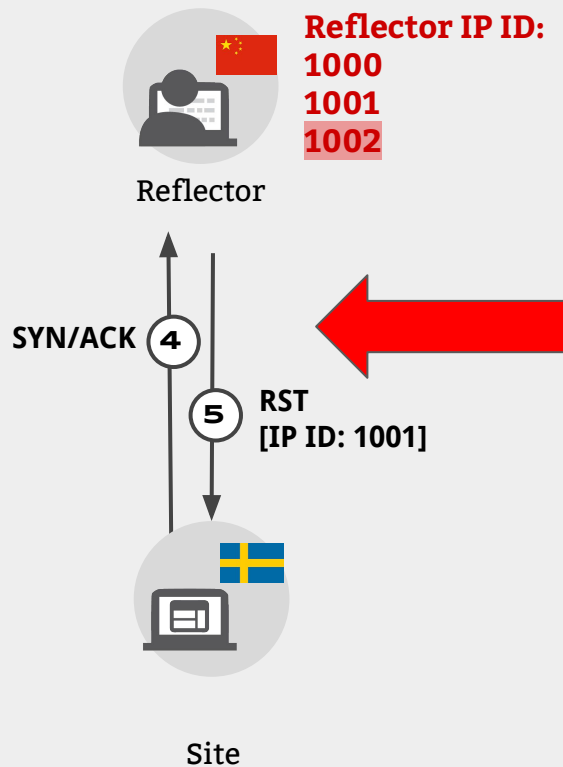
- 22.7 million potential reflectors!

Compare: 10,000 in prior work (RIPE Atlas)



# Ethics

**Challenge:** Probing banned sites from users' machines creates risk

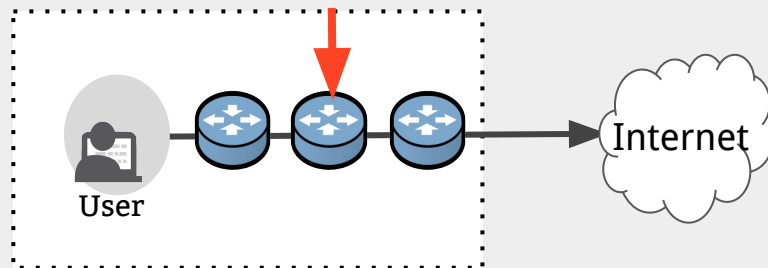


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**Challenge:** Probing banned sites from users' machines creates risk

**THREE KEY CHALLENGES:**  
Coverage, ethics, and continuity

Use only **infrastructure devices** to source probes

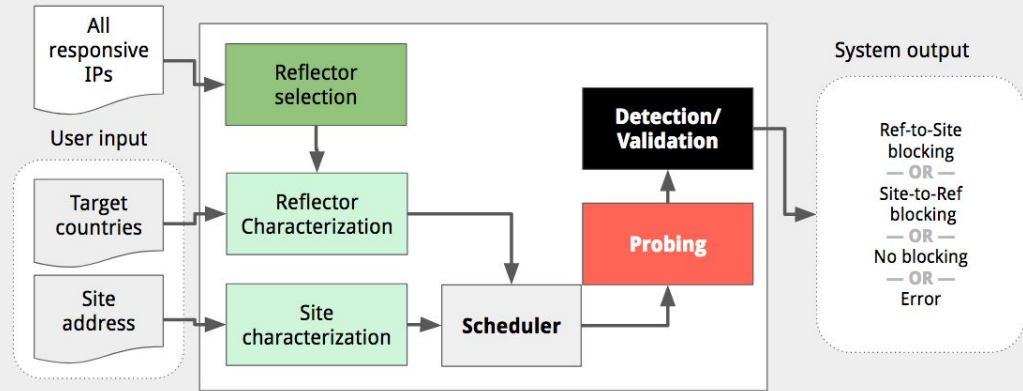


Global IP ID	22.7 million	236 countries (and dependent territories)
Two hops back from end user	<b><u>53,000</u></b>	<b>180 countries</b>

# Continuity

Augur doesn't depend on end users' availability, and routers have less downtime, allowing us to collect measurements continuously.

**Challenge:** Need to repeat measurements over time



# Running Augur In the Wild

**Reflectors:** 2,050

**Sites:** 2,134 (Citizen Lab list + Alexa Top-10K)

Mix of sensitive and popular sites

**Duration:** 17 days

**Measurements per reflector-site:** 47

**Overall # of measurements:** 207.6 million

# Top Blocked Sites

## Site-to-Reflector Blocked

### Site-to-Reflector blocking

No.	Site	% Refs	% Cnt.	Class
1.	hrcr.org	41.7	83.0	Human Rights
2.	alstrangers.[LJ].com	37.9	78.8	Militants
3.	varlamov.ru	37.7	78.0	Foreign relations
	nordrus-norna.[LJ].com			Hate speech
4.	www.stratcom.mil	37.5	78.6	Foreign relations
5.	www.demonoid.me	21.7	58.5	P2P file sharing
6.	amateurpages.com	21.2	57.9	Adult contents
	voice.yahoo.jajah.com			Voice over IP
	amtrak.com			ALEXA



Reflector



Site

### Interesting example:

- **amtrak.com** was blocked for 21% of reflectors, 57% of countries (ranked 6) → Collateral damage

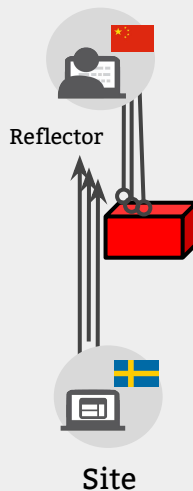


# Top Blocked Sites

## Reflector-to-site Blocked

### Reflector-to-site blocking

No.	Site	% Refs	% Cnt.	Class
1.	nsa.gov	7.4	23.3	US Gov.
2.	scientology.org	2.2	6.9	Minority faiths
3.	goarch.org	1.9	4.4	Minority faiths
4.	yandex.ru	1.8	3.8	Freedom of Expression
5.	hushmail.com	1.8	4.4	Free email
6.	carnegieendowment.org	1.6	4.4	Political reforms



#### Interesting example:

- **nsa.gov was blocked** for 7.4% of reflectors, 23% of countries (ranked 1)

**Note:** Some servers discriminate by providing their services to specific regions

**Examples:** Dating sites, banking sites, or sites that have to follow embargo rules

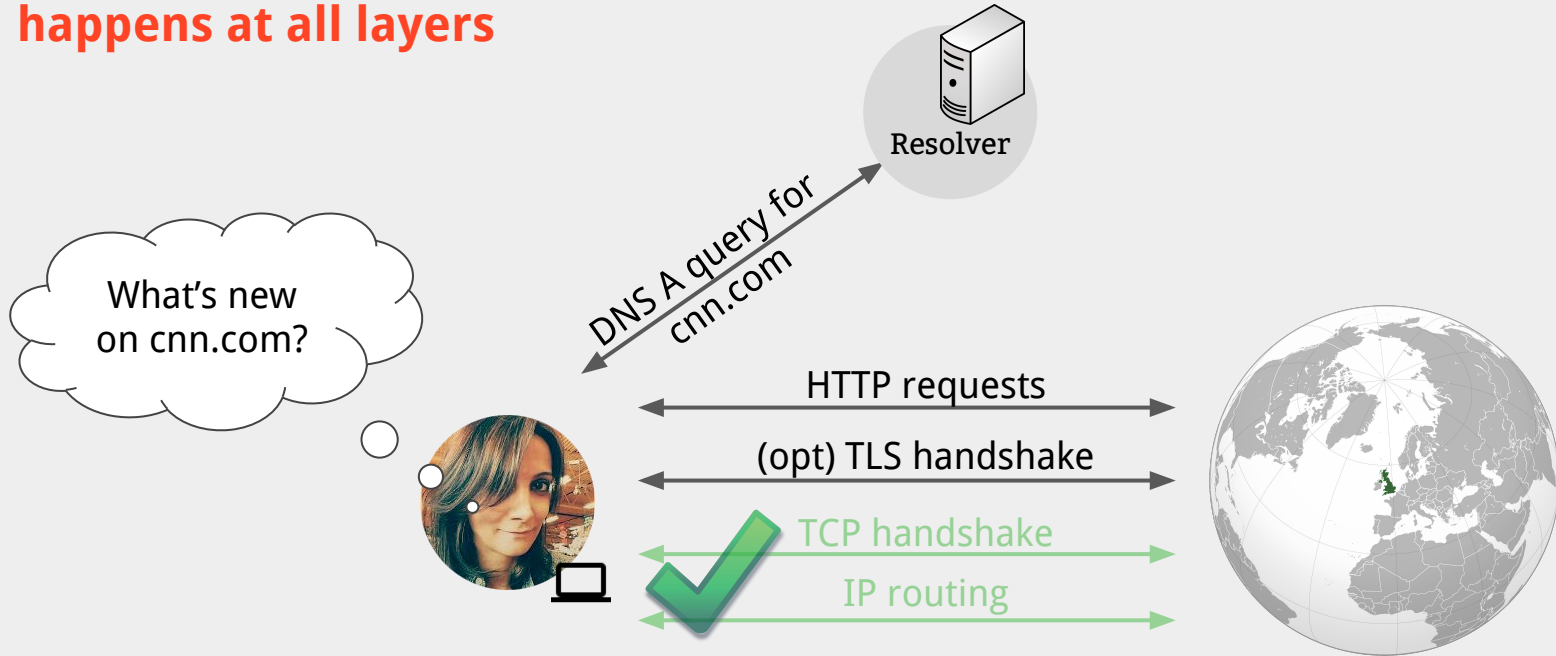
# Augur

**Augur** is a system that uses TCP/IP side channels to continuously detect blocking.

- **Reduce risks by using only infrastructure devices to source probes**
- **Can use more than 53,000 to cover more than 180 countries**

# Side Channels at Other Network Layers

Network interference happens at all layers



# Satellite (Iris)

**Satellite** is a system that uses DNS open resolvers to detect whether a user can resolve a domain accurately

**Goal: Scalable, ethical, and statistically robust system to continuously detect DNS level manipulation**



\* **Satellite: Joint Analysis of CDNs and Network-Level Interference**, Satellite, Scott, Anderson, Kohno, and Krishnamurthy. In USENIX ATC, 2016.

\* **Global Measurement of DNS Manipulation**, Pearce, Jones, Li, Ensafi, Feamster, Paxson, USENIX Security, August 2017

# Deploying Satellite

## Challenge:

Identify “wrong”  
DNS responses

**THREE KEY CHALLENGES:**  
Coverage, ethics, and continuity



## Coverage:

- Scan IPv4 for open resolvers: 4.2 M, 232 countries

## Ethical:

- Using resolvers reasonably attributed to Internet naming infrastructures: ~ 7k

## Continuity:

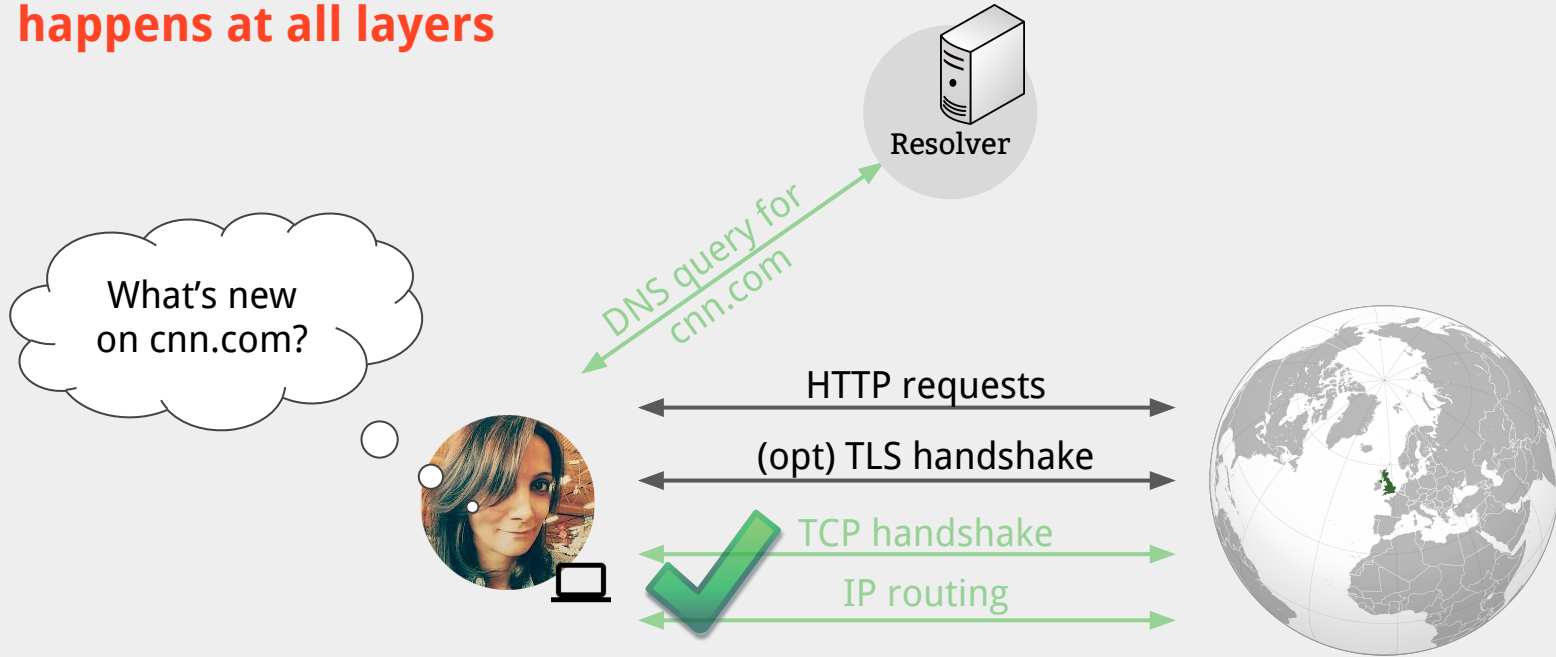
- Satellite doesn't depend on end users' availability, and resolvers have less downtime

## Detecting DNS manipulation:

- Using consistency and independent verifiability heuristics.

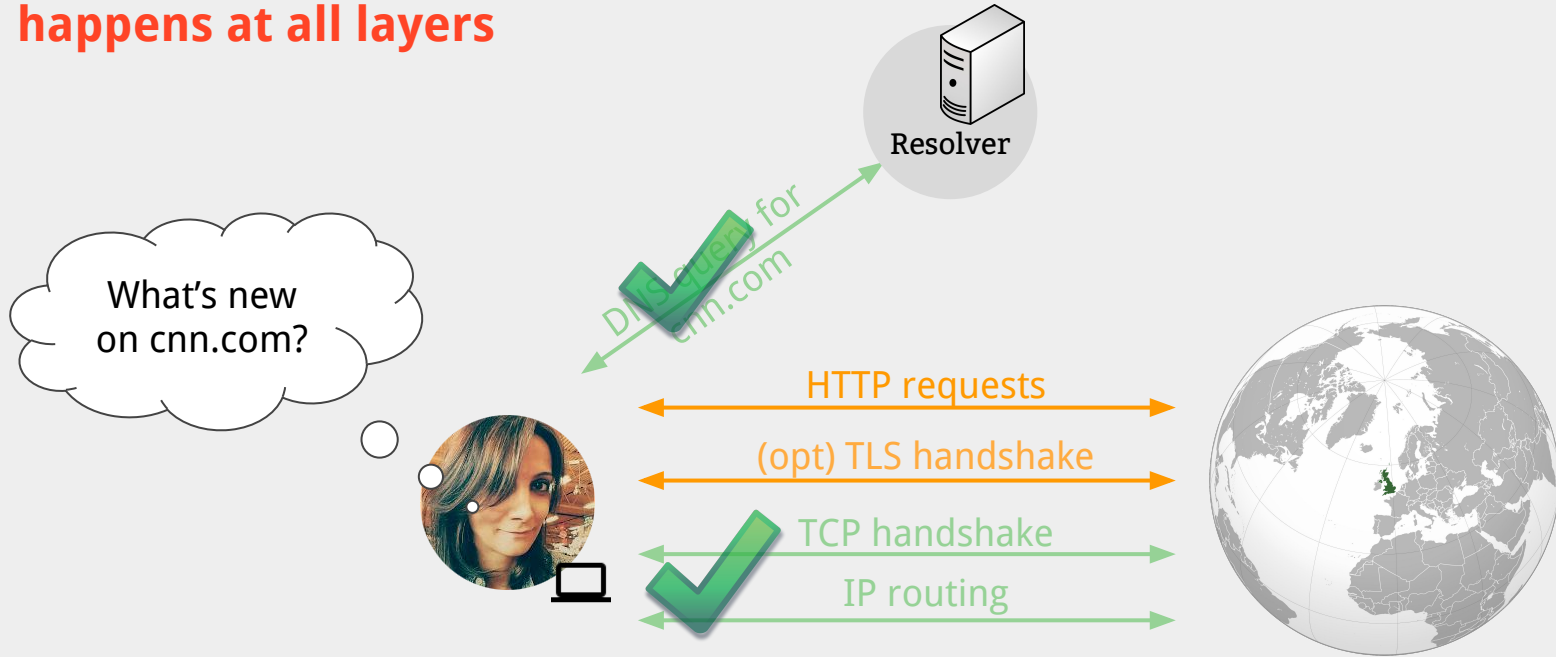
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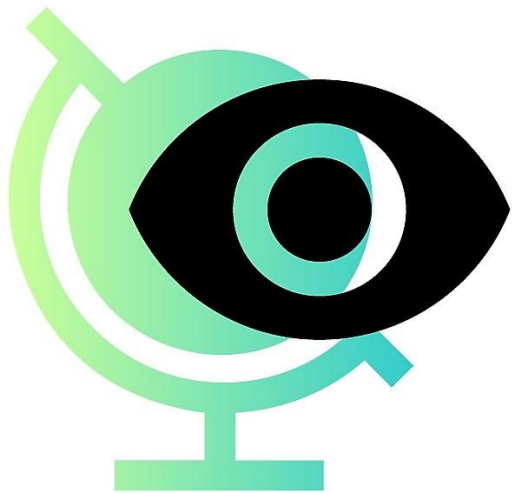
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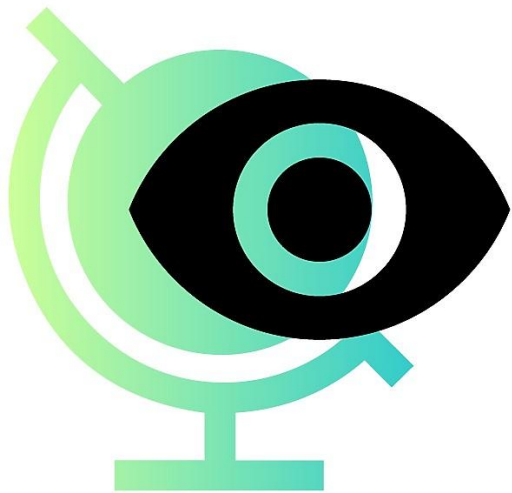




**Censored Planet**, a system that provides a continual and global view of Internet censorship

- **Daily reachability measurements** for key websites from countries worldwide
- Data collected with Augur, Satellite, and Quack combined with **side channels at other network layers**
- Tools for mapping and **comparative analyses** across locations and time





# **Censored Planet: Measuring Internet Censorship Globally and Continuously**

**Roya Ensafi**

CAIDA, 2018