Global Measurement of DNS Manipulation

Paul Pearce

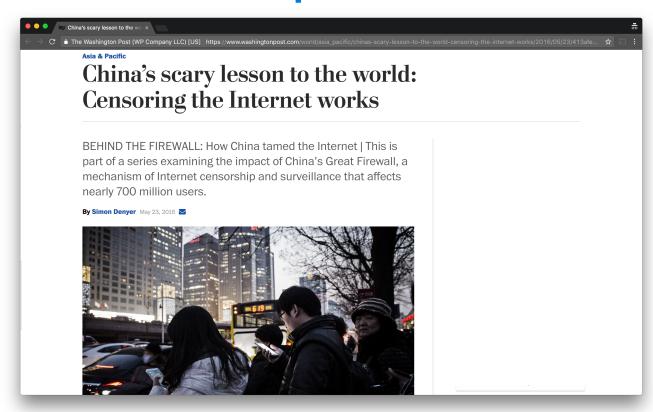
Ben Jones, Frank Li, Roya Ensafi,
Nick Feamster, Nick Weaver, and Vern Paxson



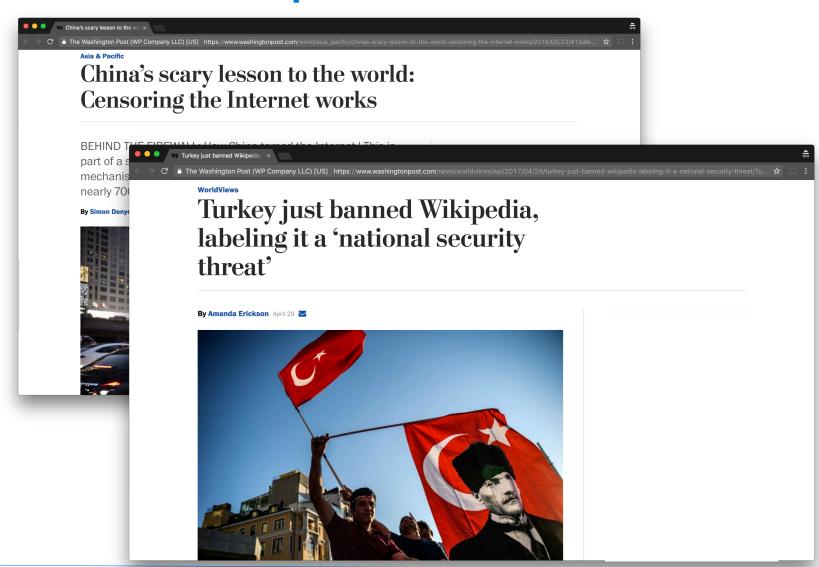
PRINCETON UNIVERSITY



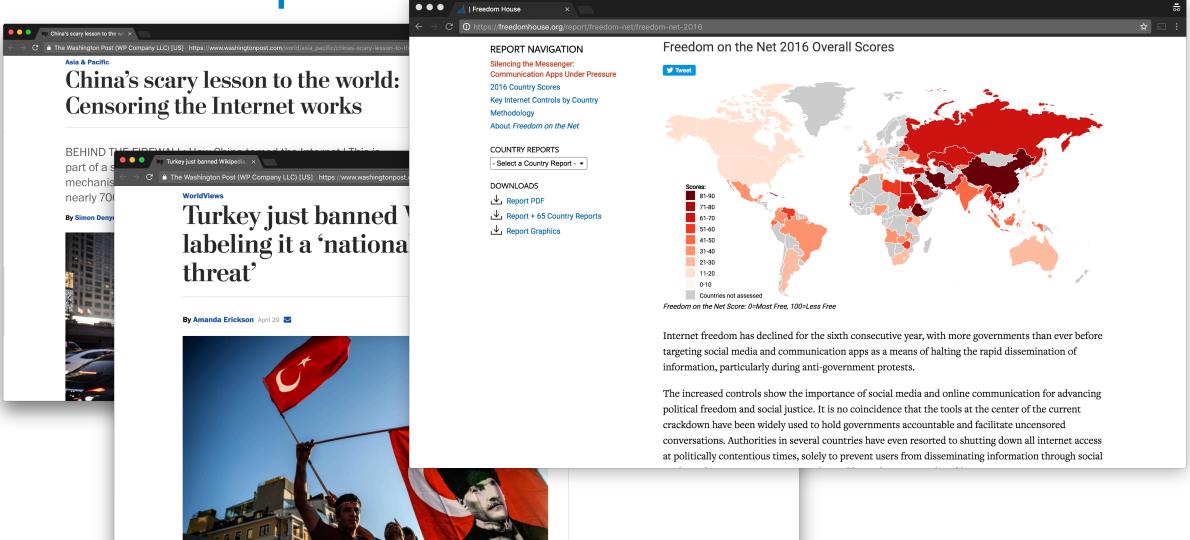
Censorship



Censorship



Censorship





Understanding Censorship

- Despite prevalence, existing empirical measurement is sparse across:
 - Time
 - Space
 - Content
- Why? Deployed state of the art: Volunteers
- We argue: Continuous, diverse measurement needed to understand the scope, scale, and evolution of Internet censorship

Our Work

- Censorship techniques vary
 - This work → DNS manipulation
- Measurement Goals:
 - Diverse
 - Longitudinal
 - Does not require participation
 - Ethical
- Design, implement, and deploy Iris, a system to identify DNS manipulation globally
- Global measurement study
 - Identifies pervasiveness of manipulation worldwide
 - Heterogeneity across content, countries, and resolvers
 - Heterogeneity within countries



Approach

- Conceptually simple:
 - Issue DNS queries for sensitive across globally diverse vantage points
 - Look for "wrong" responses
- Challenge 1:Vantage points
 - → Open DNS resolvers
- Challenge 2: Ethics
 - → Identify "Infrastructure" DNS resolvers
- Challenge 3: Repeatable
 - → Design of Iris
- Challenge 4: Identifying "wrong" responses?
 - > Consistency and independent verifiability of structural elements

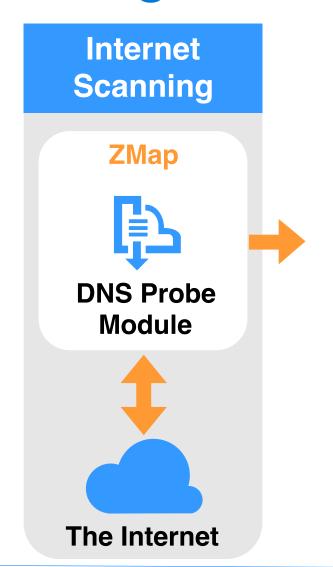


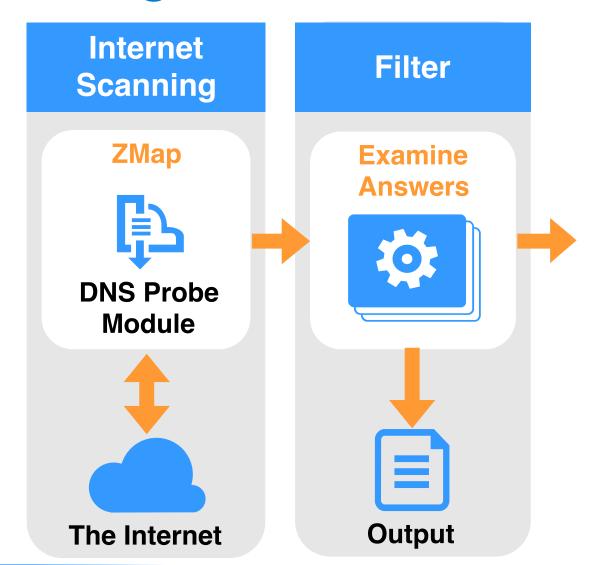
Ethics

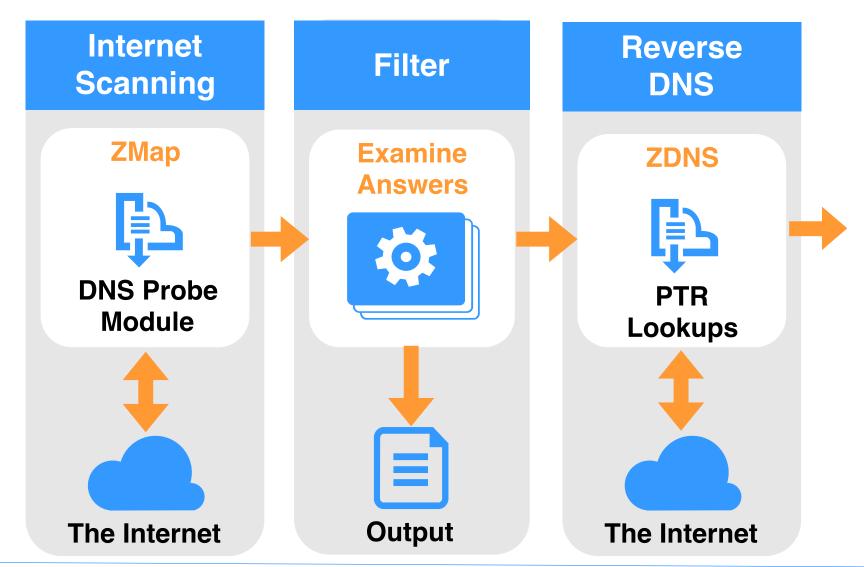
- Guided by ideals laid out by the Menlo Report:
 - Respect for persons
 - Beneficence
 - Respect for law and public
- Only use resolvers reasonably attributed to Internet naming infrastructure
- Heavily rate limit queries to resolvers and domains



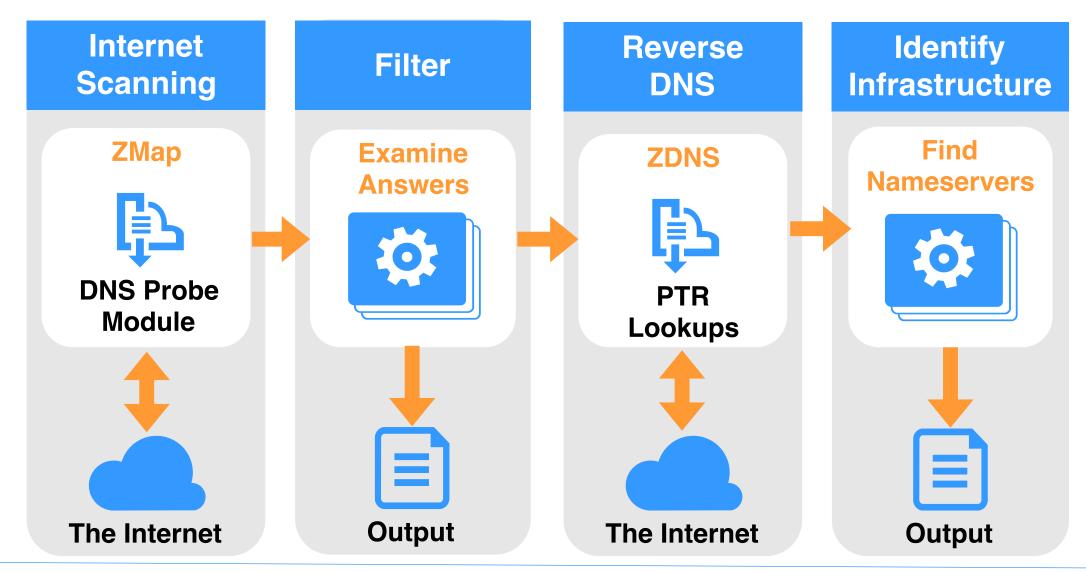










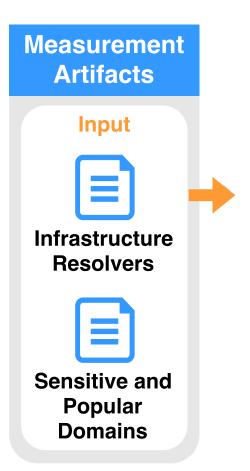


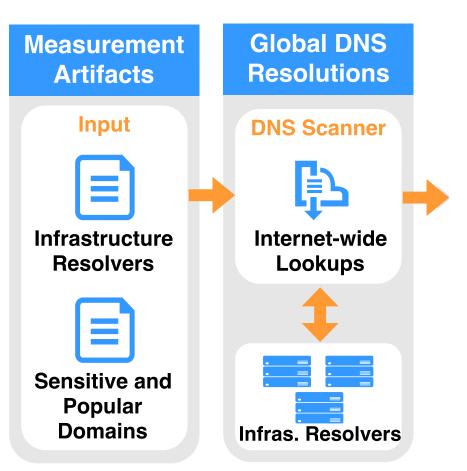
What to Measure

- Sensitive
 - All domains from the Citizen Lab sensitive test list
- Popular
 - Random subset of Alexa top 10,000
- Feed these artifacts into the Iris pipeline
 - Output → DNS manipulation

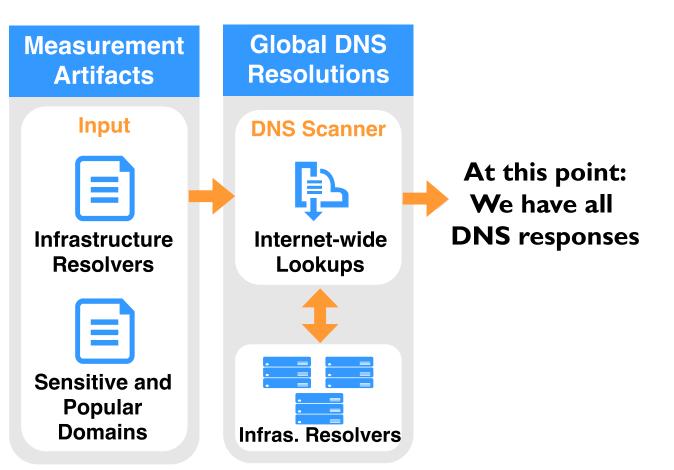




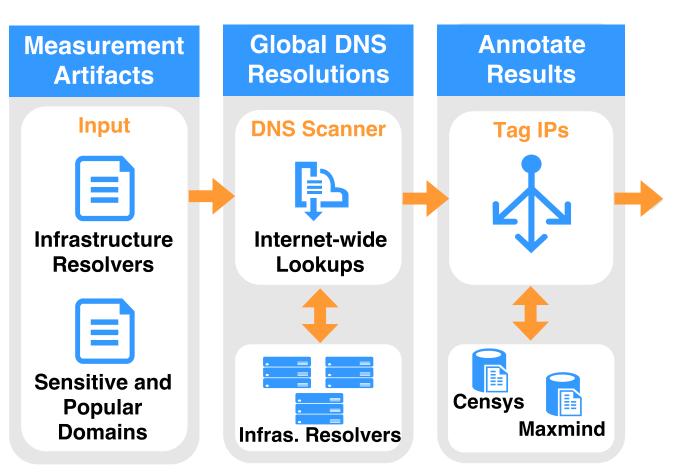




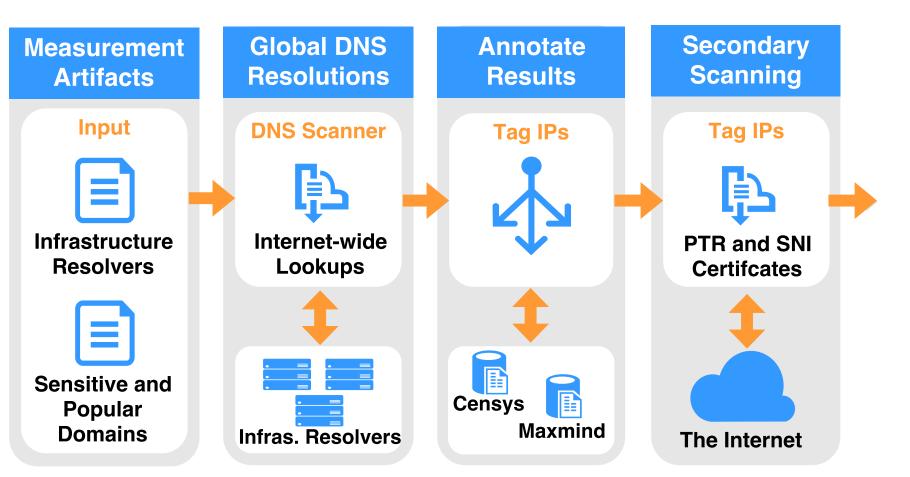


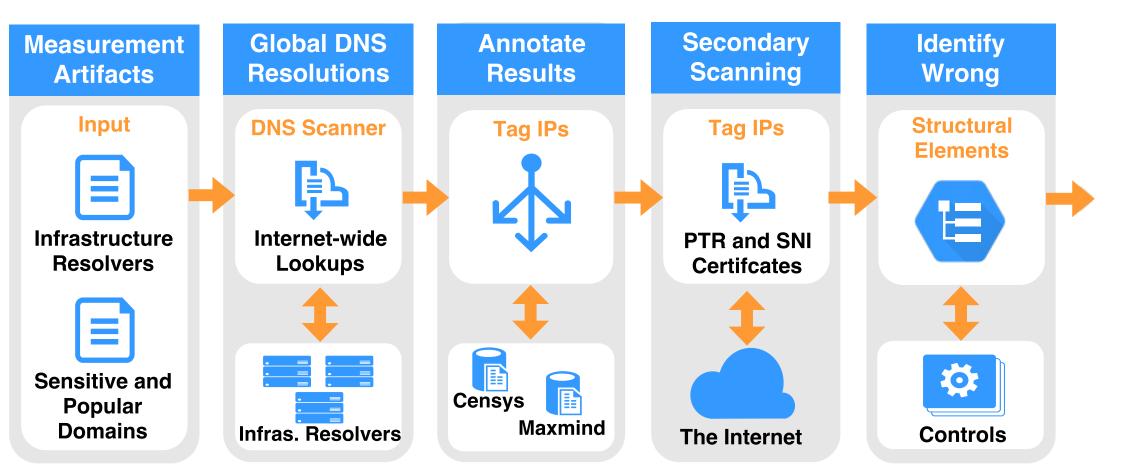




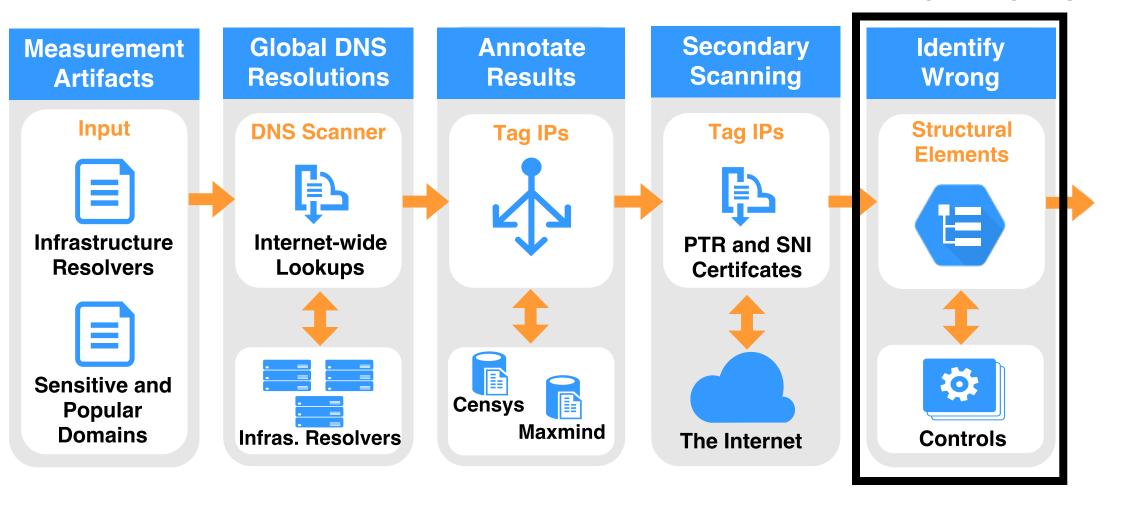








Challenge 4: Identifying wrong responses

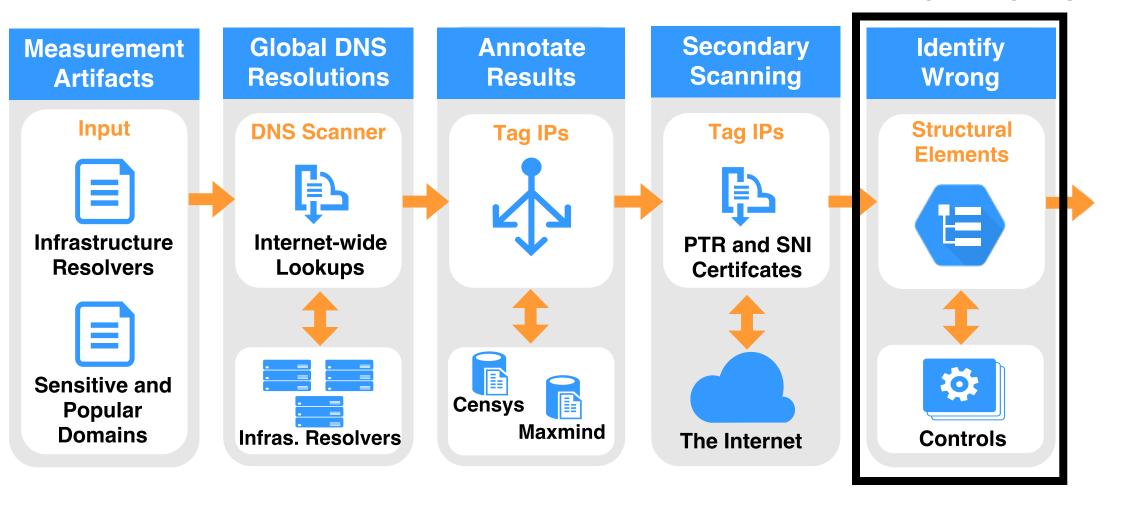


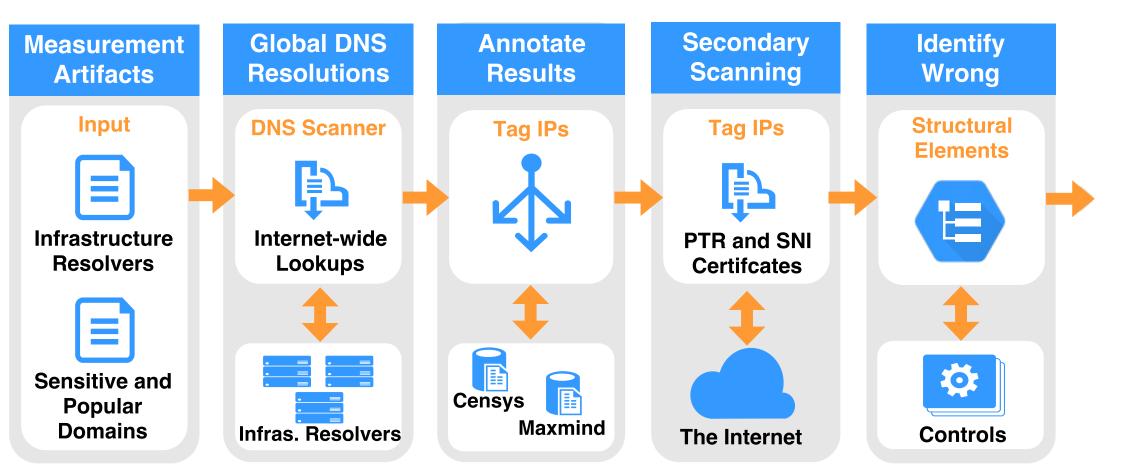
Identifying Wrong Responses

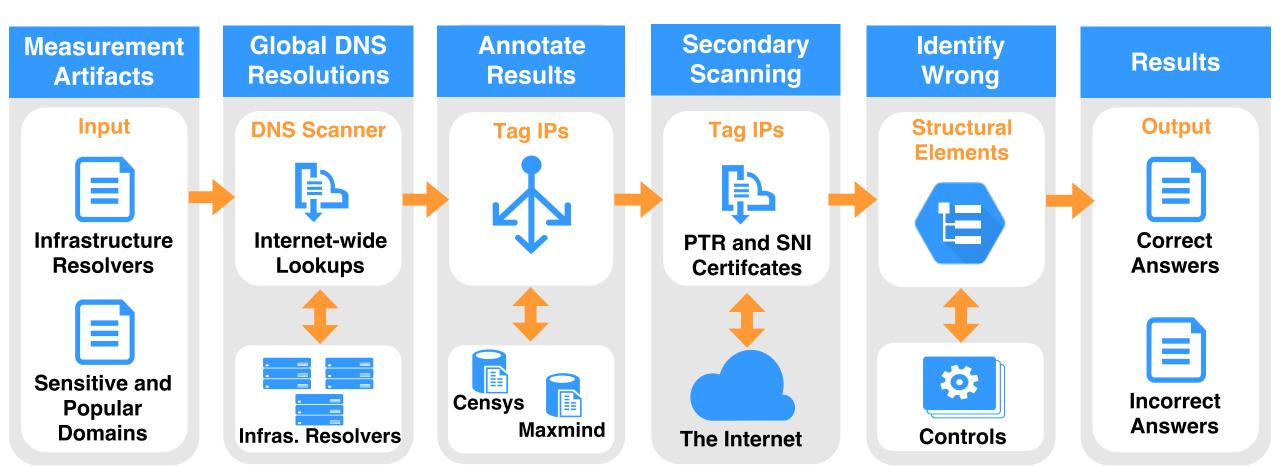
- Intuition: Shared structural elements, even in global deployments
- Approach: structure consistency and independent verifiability
- Consistency
 - 4, uncensored, geographically diverse controls
 - Compare each answer with the control set
- Independent Verifiability
 - Valid HTTPS certificate, with and without SNI
- If any metric consistent/verifiable, response is correct



Challenge 4: Identifying wrong responses







Measurement Study and Dataset

 What is the open resolver population?

Resolver	Number	Number	Median /
Dataset	Resolvers	Countries	Country
All Open	4.2M	232	660

- How much does our ethical framework reduce coverage?
- What is the total set of DNS responses we examine?

Number	Number	Total
Resolvers	Domains	Responses
6,564	2,330	14.5M

• What does our dataset reveal?

• What **countries** experience the most manipulation?



- What **countries** experience the most manipulation?
 - Qualitatively consistent with prior work

Country	Median Manipulated	Number Resolvers
Iran	6.02%	122
China	5.22%	62
Indonesia	0.63%	80
Greece	0.28%	62
Mongolia	0.17%	6
Iraq	0.09%	7
Bermuda	0.04%	2
Kazakhstan	0.04%	14
Belarus	0.04%	18



- What **countries** experience the most manipulation?
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- Are there outliers within countries?

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- What **countries** experience the most manipulation?
 - Qualitatively consistent with prior work
- Are there outliers within countries?
 - High outliers
 - → localized manipulation

Country	Median Manipulated	Number Resolvers	Max Manipulated
Iran	6.02%	122	22.41%
China	5.22%	62	8.40%
Indonesia	0.63%	80	9.95%
Greece	0.28%	62	0.83%
Mongolia	0.17%	6	0.36%
Iraq	0.09%	7	5.79%
Bermuda	0.04%	2	0.09%
Kazakhstan	0.04%	14	3.90%
Belarus	0.04%	18	0.30%

- What **countries** experience the most manipulation?
 - Qualitatively consistent with prior work

- Are there outliers within countries?
 - High outliers
 - → localized manipulation
 - Low outliers
 - → geolocation error

Country	Median Manipulated	Number Resolvers	Max Manipulated	Min Manipulated
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China	5.22%	62	8.40%	0%
Indonesia	0.63%	80	9.95%	0%
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Iraq	0.09%	7	5.79%	0%
Bermuda	0.04%	2	0.09%	0%
Kazakhstan	0.04%	14	3.90%	0%
Belarus	0.04%	18	0.30%	0%

Manipulation By Domain

• What **domains** are most frequently manipulated?



Manipulation By Domain

- What **domains** are most frequently manipulated?
 - Gambling and Pornography
 - → 8 of top 10

Rank	Domain	Category	Countries
I	www.pokerstars.com	Gambling	19
2	betway.com	Gambling	19
3	pornhub.com	Pornography	19
4	youporn.com	Pornography	19
5	xvideos.com	Pornography	19
6	thepiratebay.org	P2P File Sharing	18
7	thepiratebay.se	P2P File Sharing	18
8	xhamster.com	Pornography	18
9	www.partypoker.com	Gambling	17
10	beeg.com	Pornography	17

Manipulation By Domain

- What **domains** are most frequently manipulated?
 - Gambling and Pornography
 - \rightarrow 8 of top 10

- Are commonly measured sites the most frequent targets? (Anonymity tools, Twitter, Google)
 - No. They experience significantly less manipulation globally
 - \rightarrow diversity in measured domains

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4	youporn.com	Pornography	19
5	xvideos.com	Pornography	19
6	thepiratebay.org	P2P File Sharing	18
7	thepiratebay.se	P2P File Sharing	18
8	xhamster.com	Pornography	18
9	www.partypoker.com	Gambling	17
10	beeg.com	Pornography	17
80	torproject.org	Anonymity & Censorship	12
181	twitter.com	Twitter	9
250	www.youtube.com	Google Video	8
495	www.citizenlab.org	Freedom of Expression	4
606	www.google.com	Google	3

Manipulation By Category

• What **categories** are most frequently manipulated?



Manipulation By Category

- What **categories** are most frequently manipulated?
 - Sites from the Alexa sampling experience widespread manipulation
 - While Gambling and Pornography individual domains were most common, they are not the most common categories

Rank	Category	Countries
l	Alexa Top 10,000	36
2	Freedom of Expression	35
3	P2P File Sharing	34
4	Human Rights	31
5	Gambling	29
6	Pornography	29
7	Alcohol and Drugs	28
8	Anonymity & Censorship	24
9	Hate Speech	22
10	Multimedia Sharing	21



Manipulation By Category

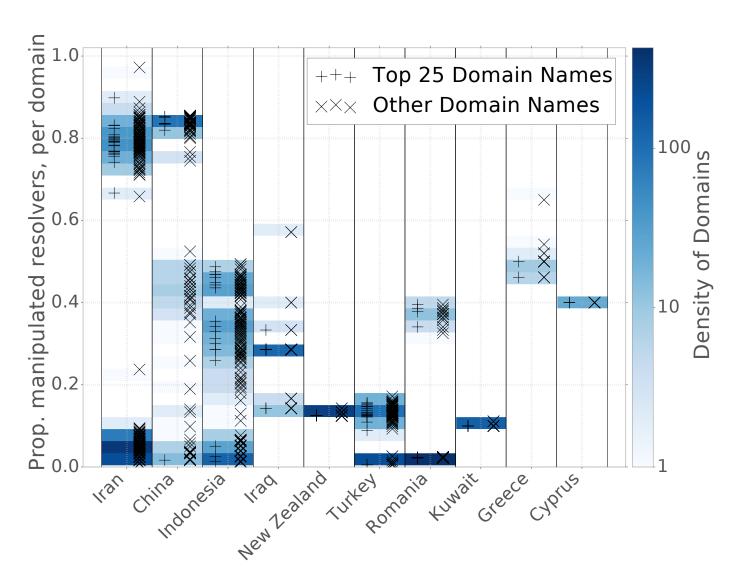
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10	Multimedia Sharing	21
20	Google (All)	16
34	Facebook (All)	10
38	Twitter (All)	9

• Is there heterogeneity within countries?

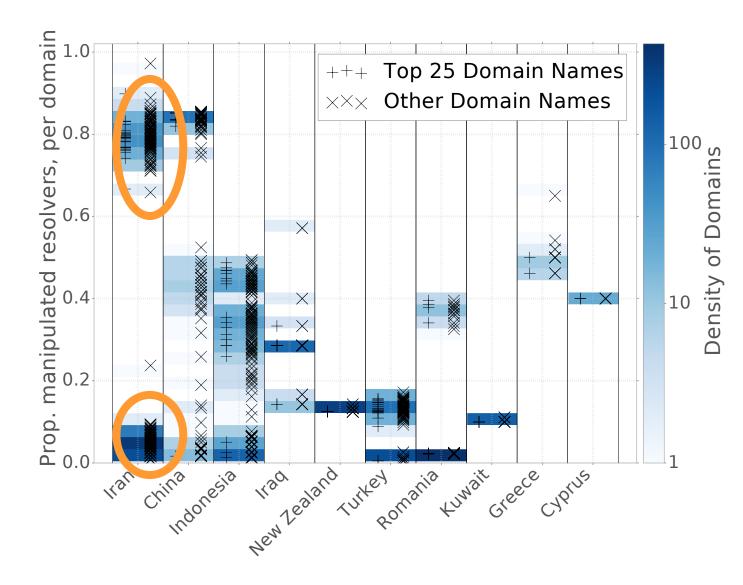


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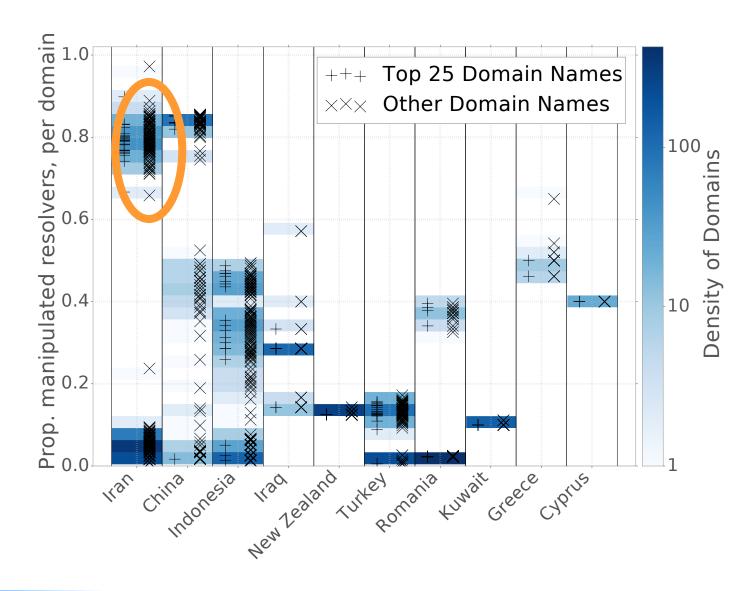




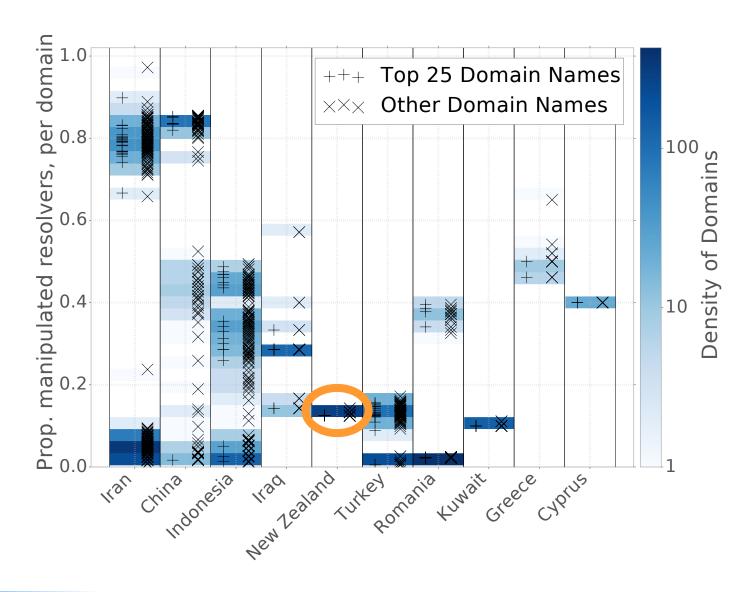
- Is there heterogeneity within countries?
 - Yes: Modal effects → multiple systems, localized manipulation



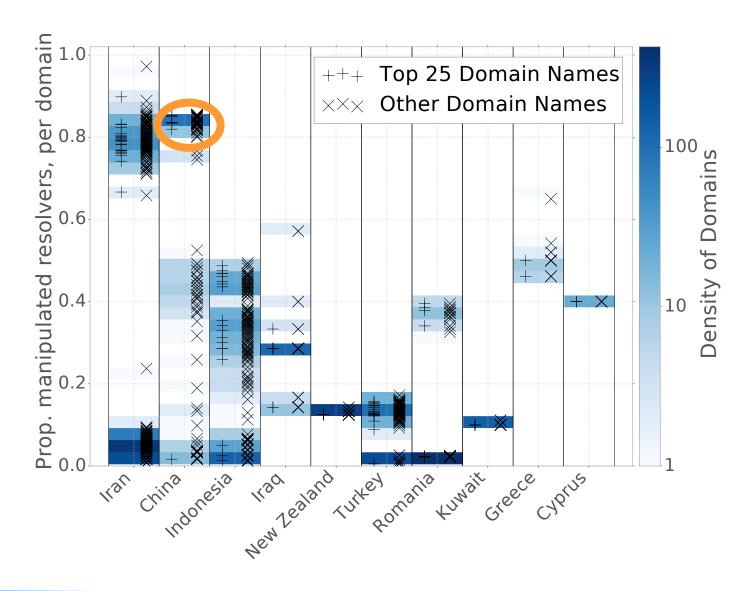
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- Is there non-determinism?
 - Yes: Smearing effects



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- Is there ISP-level filtering?
 - Yes: Low-but-incomplete countries



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- Is there non-determinism?
 - Yes: Smearing effects
- Is there ISP-level filtering?
 - Yes: Low-but-incomplete countries
- Is there geolocation error?
 - Yes: High-but-incomplete countries



Methodological Takeaways

- Domain selection is critical for comparative studies
 - List biases will influence ranking, comparisons
- Measurement of non-sensitive content is important
 - Lists at inherently limited
- How data is groups influences results
 - Domain vs Category
- In-country diversity is necessary to accurately depict manipulation
 - Outliers both high and low
 - Heterogeneous manipulation



Conclusion and Next Steps

• Internet Censorship is prevalent and heterogeneous

• Iris is a ethical system to identify DNS manipulation Internet-wide

 We identified heterogeneity of censorship across multiple dimensions, including variance within countries, highlighting the need for tools such as Iris

 Next Steps: Use of Iris and other Internet-wide techniques for continuous longitudinal measurement

Thank You

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