



# Monitoring Internet Censorship with UBICA

Giuseppe Aceto<sup>1</sup>, Alessio Botta<sup>1</sup>, Antonio Pescapè<sup>1</sup>, Nick Feamster<sup>2</sup>,  
M. Faheem Awan<sup>3</sup>, Tahir Ahmad<sup>3</sup>, and Saad Qaisar<sup>3</sup>

<sup>1</sup> University of Napoli Federico II (Italy)

<sup>2</sup> Georgia Institute of Technology (GA, USA)

<sup>3</sup> NUST SEECS (Pakistan)

# Outline

---



- Motivations
- UBICA platform
- Size Ratio test
- Case study
  - Pakistan
  - Korea
  - Italy
- Conclusions



# Several ethical/political issues

- Little transparency (if any)
- Laws lag behind governments practice
- Risk of misuse / disproportionate use
- International relations / law implied
- Freedom of speech threatened

...



# Several ethical/political issues

- Little transparency (if any)
- Laws lag behind governments practices
- Risk of misuse / disproportionate use
- International relations / law implied
- Freedom of speech threatened

...  
NOT MY BUSINESS HERE



# Internet Censorship tampers with protocols

Exploits *good-faith* early design choices, for

- DoS
- MITM

Requires *middle boxes* for surveillance and censorship enforcement.



# Different stakeholders

---

Consequences for

- **users** as viewers or publishers



# Different stakeholders

---

## Consequences for

- **users** as viewers or publishers
- providers of censored **content/services**
- **access** and **transport** providers
  - deployment and management of middle boxes
  - circumvention traffic



# Different stakeholders

---

## Consequences for

- **users** as viewers or publishers
- providers of censored **content/services**
- **access** and **transport** providers
  - deployment and management of middle boxes
  - circumvention traffic

Moreover

- **unexpected side effects\***

\*

Anonymous "The collateral damage of internet censorship by DNS injection." ACM SIGCOMM CCR 42.3 (2012).

M. L. Mueller. *China and global Internet governance*. In *Access contested: security, identity, and resistance in Asian cyberspace*, ed. R. J. Deibert, et al., pages 177–194, 2012.



# Internet Censorship *Detection*

---

*Analyzing network traffic  
to reveal **impairments**  
in the access to content and services  
caused **by a third party**  
(neither the client system nor the server  
hosting the resource or service) and  
**not justifiable as an outage.***

G. Aceto, A. Pescapè, "Internet Censorship Detection: A Survey", Computer Networks (2015)



# Heterogeneous tools performing detection

- **Herdict**
  - **Web portal** to submit inaccessibility reports
- **GreatFire**
  - Monitoring the Great Firewall of China
  - No user involvement, **provides database** of results
- **OONI**
  - A platform for definition of censorship detection tests
  - Integrated with **Tor** anonymous overlay network
  - Integrated with **M-lab**



# Heterogeneous tools performing detection

- **Herdict**
  - Web portal to submit inaccessibility reports
- **GreatFire**
  - Monitoring the Great Firewall of China
  - No user involvement, provides database of results
- **OONI**
  - A platform for definition of censorship detection tests
  - Integrated with Tor anonymous overlay network
  - Integrated with M-lab
- **UBICA**
  - More than just “layer 8” testing
  - Not only China, and crowdsourced
  - Geographically distributed agreement instead of GT

# Outline

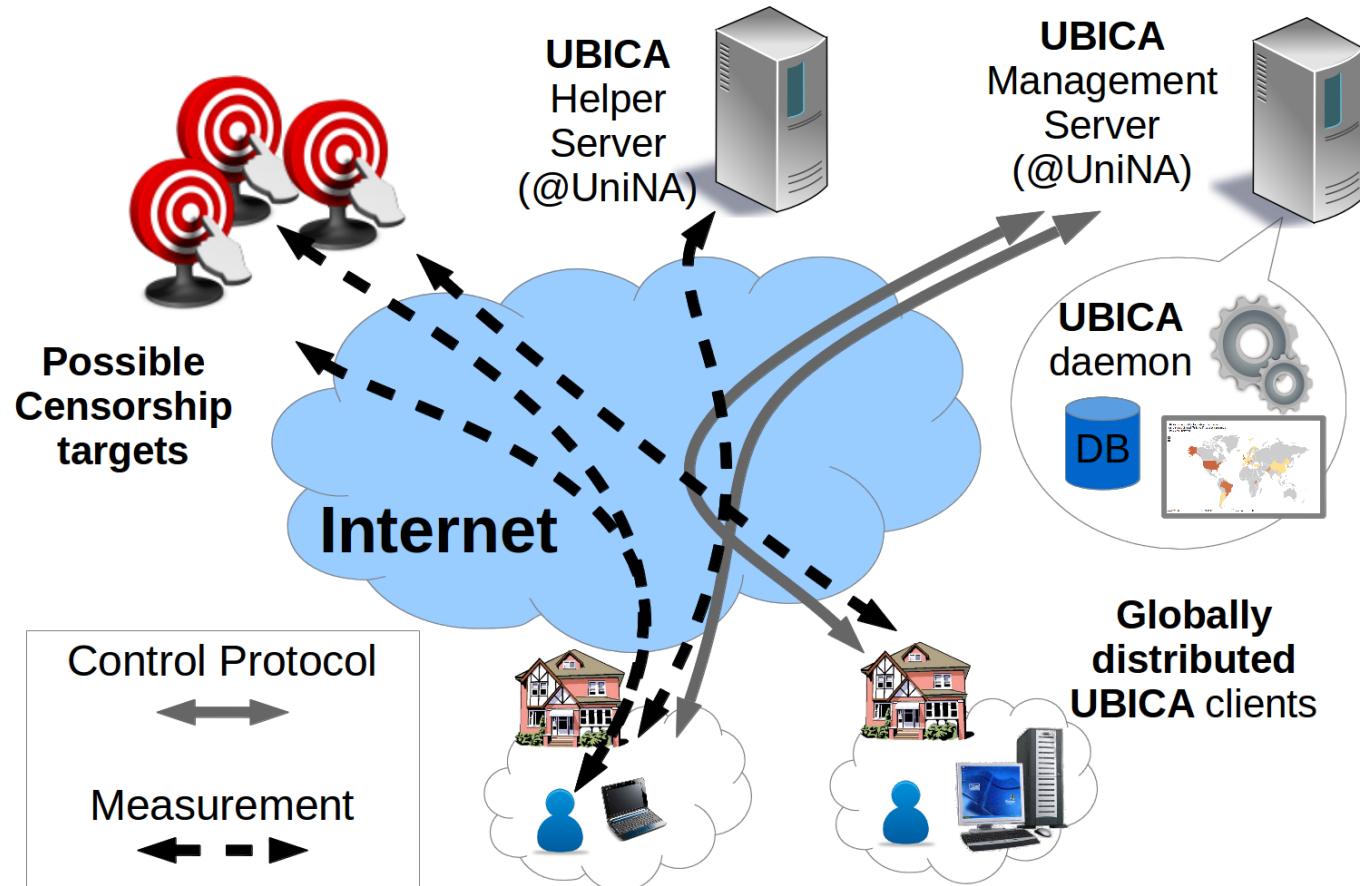
---



- Motivations
- **UBICA platform**
- Size Ratio test
- Case study
  - Pakistan
  - Korea
  - Italy
- Conclusions



# User-Based Internet Censorship Analysis





# Probe types

---

- **Home gateways**
  - BISMark platform (custom OpenWRT)
- **GUI-client**
  - Linux, Windows, OSX
- **Headless client**
  - Linux



# DNS tests

---

- **Collection:** an A query for the target hostname is requested
  - to the default DNS server and
  - to a small number of open resolvers
- **Local Check:** returned IPs are checked against a list\* of known *troublemakers*
  - non-publicly routable
  - failing to provide resource/service
  - explicit block pages

\*highlighted by UBICA, manually validated



# TCP tests

---

- **Collection:** a TCP handshake is initiated towards the target IP address (repeated up to 3 failures)
- **Local Check:** consider symptoms
  - Timeout (15s)
  - RST response
  - Network errors



# HTTP tests

---

- **Collection:** GET of the target URL is requested
  - User Agent string is specified (taken from a list)
  - HTTP 30X redirects followed (max 50)
  - does *not* parse/execute JavaScript
  - HTTP headers and body are saved
- **Local check:** response HTTP code
- **Global check:** evaluate content size (*size ratio* below a threshold)

Related work: Jones, Ben, et al. "Automated Detection and Fingerprinting of Censorship Block Pages." ACM Internet Measurement Conference, 2014.

# Outline

---



- Motivations
- UBICA platform
- **Size Ratio test**
- Case study
  - Pakistan
  - Korea
  - Italy
- Conclusions



# Size Ratio

---

For a given URL  $u$ , and a set of probes  $P$  (single probe, ISP, Country), we define the *size ratio*  $r(u, P)$  as

$$r(u, P) = \frac{\text{avg}_P[s(u)]}{\text{avg}_{P'}[s(u)]}$$

where  $s(u)$  is the size of resource at  $u$ , and  $P'$  is the complement of  $P$  in the set of all probes from where  $u$  was tested



# Threshold on Size Ratio

---

Goal:

Choose threshold that maximizes  
a reliability\* metric for detection algorithm



Ground Truth is needed  
for training and validation

\*defined later on



# Threshold setting - methodology

---

**Ground Truth:** classification by manual inspection

**Preprocess filters:** (part of the detection algorithm)

- at least 3 different ISPs per target
- at least 3 measurements per target

**Dataset:**

- 19 different countries
- avg ~5 different ISPs per target
- 3.6K measurements, randomly chosen
- 2 weeks long window

**Evaluation:** Leave-One-Out cross-validation



# Algorithm performance

---

Classification metrics adopted for evaluation

$$Prec = \frac{TP}{TP + FP} \quad Rec = \frac{TP}{TP + FN}$$



# Algorithm performance

---

Classification metrics adopted for evaluation

$$Prec = \frac{TP}{TP + FP} \quad Rec = \frac{TP}{TP + FN}$$

$$NPV = \frac{TN}{TN + FN} \quad TNR = \frac{TN}{TN + FP}$$



# Algorithm performance

Classification metrics adopted for evaluation

$$Prec = \frac{TP}{TP + FP} \quad Rec = \frac{TP}{TP + FN}$$

$$NPV = \frac{TN}{TN + FN} \quad TNR = \frac{TN}{TN + FP}$$

Summary metrics:

$F1$

$F2$

$$F_\beta = (1 + \beta^2) \cdot \frac{Prec \cdot Rec}{(\beta^2 \cdot Prec) + Rec}$$



# Algorithm performance

Classification metrics adopted for evaluation

$$Prec = \frac{TP}{TP + FP}$$

$$NPV = \frac{TN}{TN + FN}$$

$$Rec = \frac{TP}{TP + FN}$$

$$TNR = \frac{TN}{TN + FP}$$

Summary metrics:

$F1$

$F2$

**Informedness**

$$F_\beta = (1 + \beta^2) \cdot \frac{Prec \cdot Rec}{(\beta^2 \cdot Prec) + Rec}$$

$$Info = Rec + TNR - 1$$



# Algorithm performance

Classification metrics adopted for evaluation

$$Prec = \frac{TP}{TP + FP}$$

$$NPV = \frac{TN}{TN + FN}$$

$$Rec = \frac{TP}{TP + FN}$$

$$TNR = \frac{TN}{TN + FP}$$

Summary metrics:

$F1$

$F2$

*Informedness*

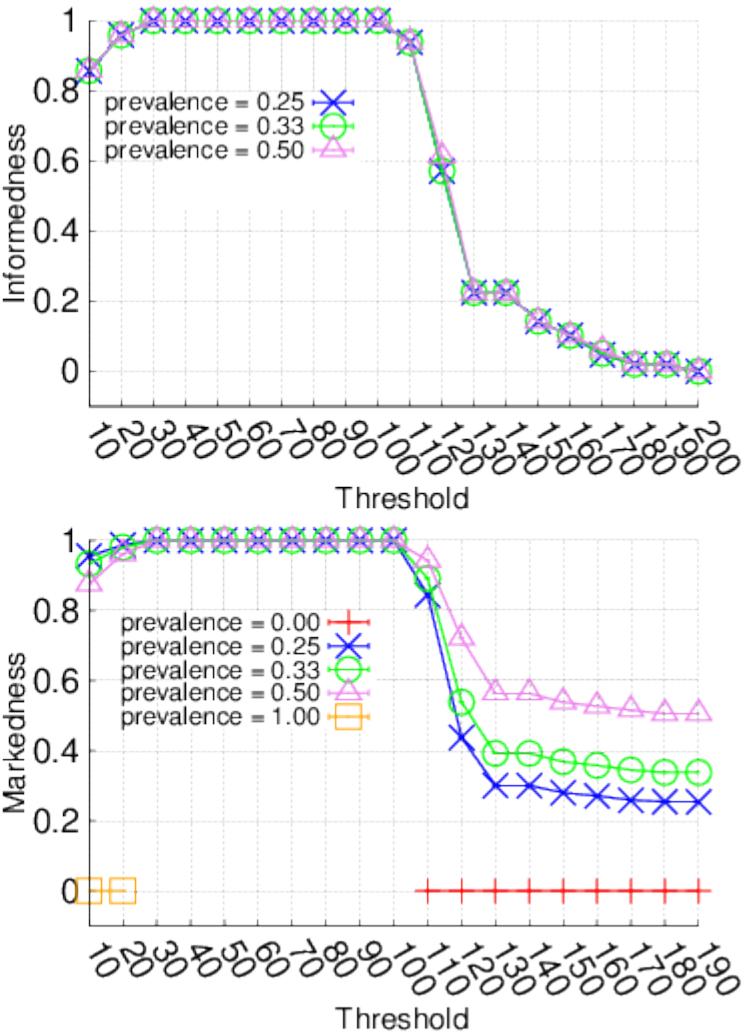
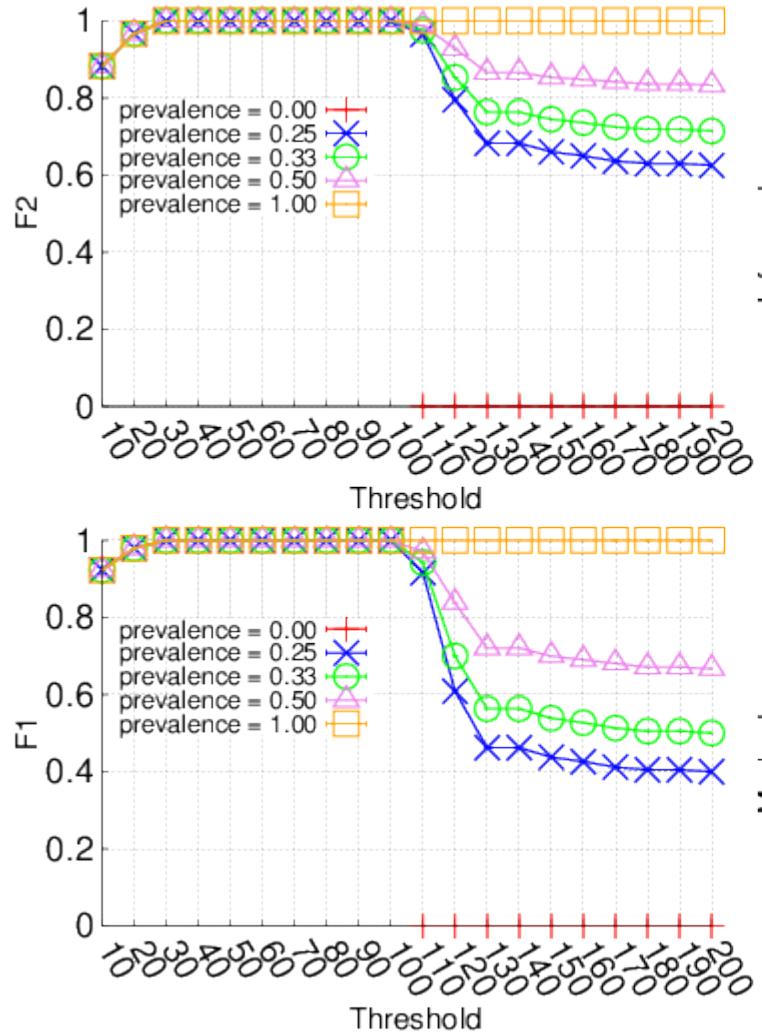
**Markedness**

$$F_\beta = (1 + \beta^2) \cdot \frac{Prec \cdot Rec}{(\beta^2 \cdot Prec) + Rec}$$

$$Info = Rec + TNR - 1$$

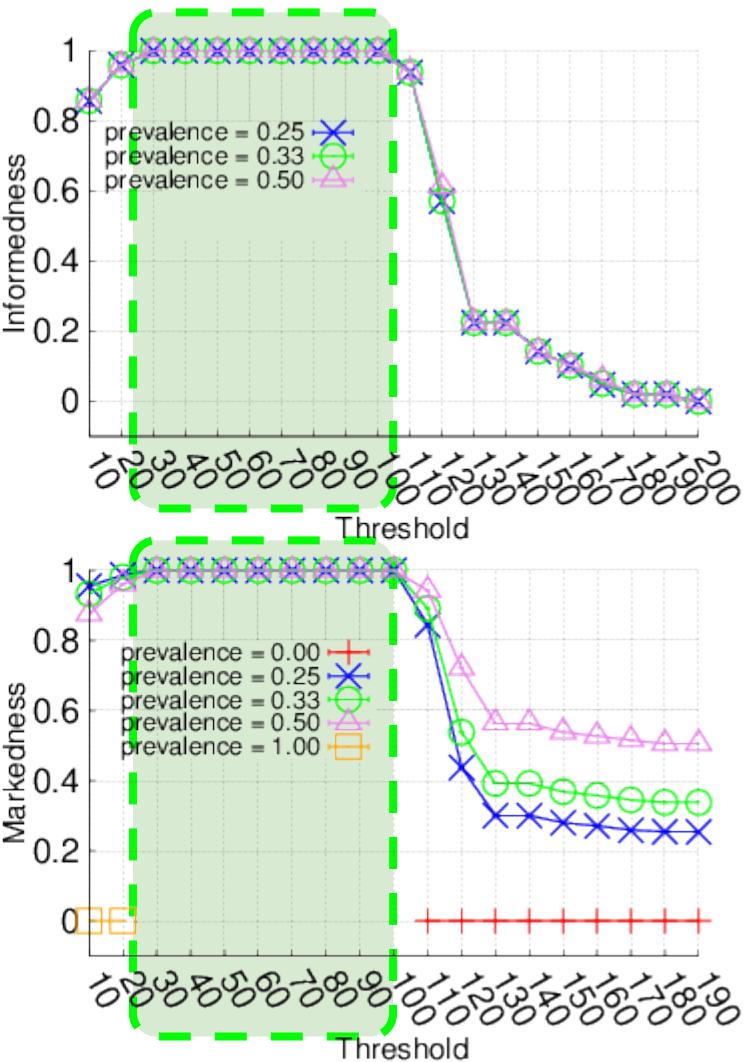
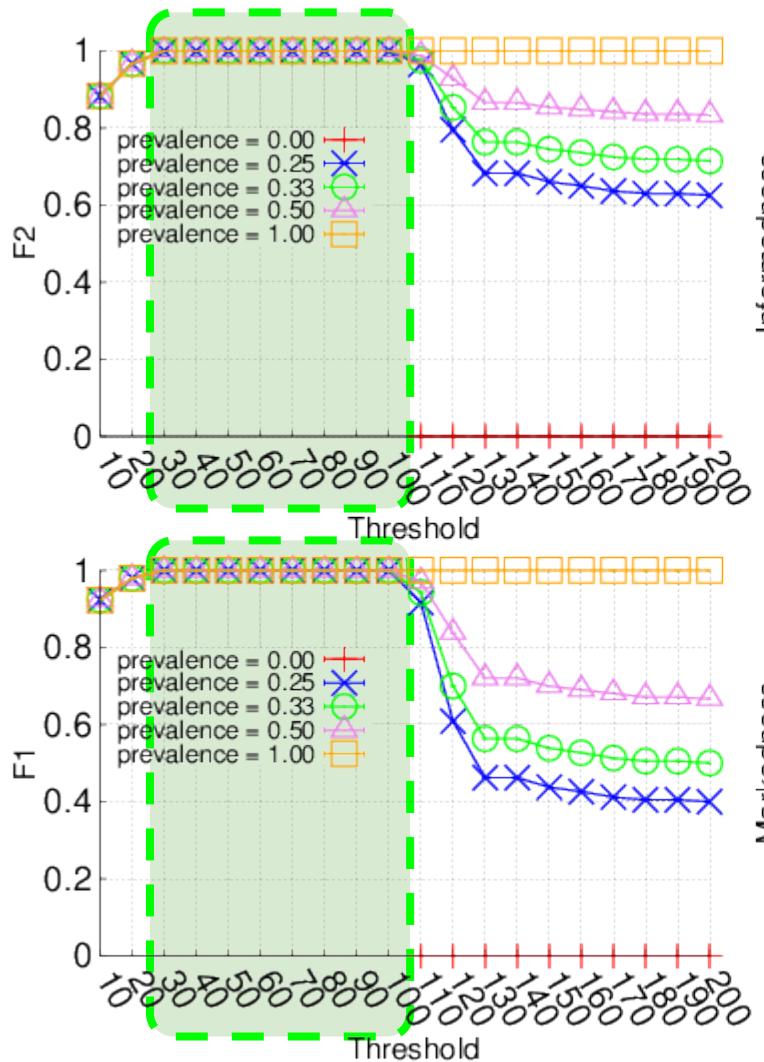
$$Mark = Prec + NPV - 1$$

# Threshold setting and prevalence

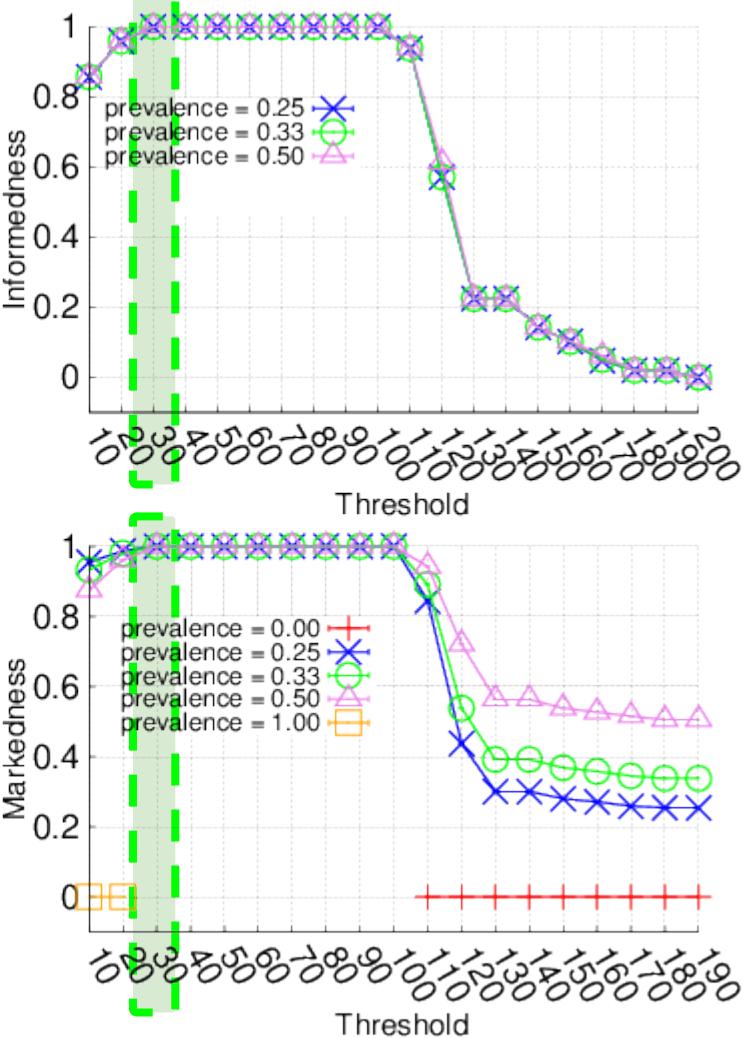
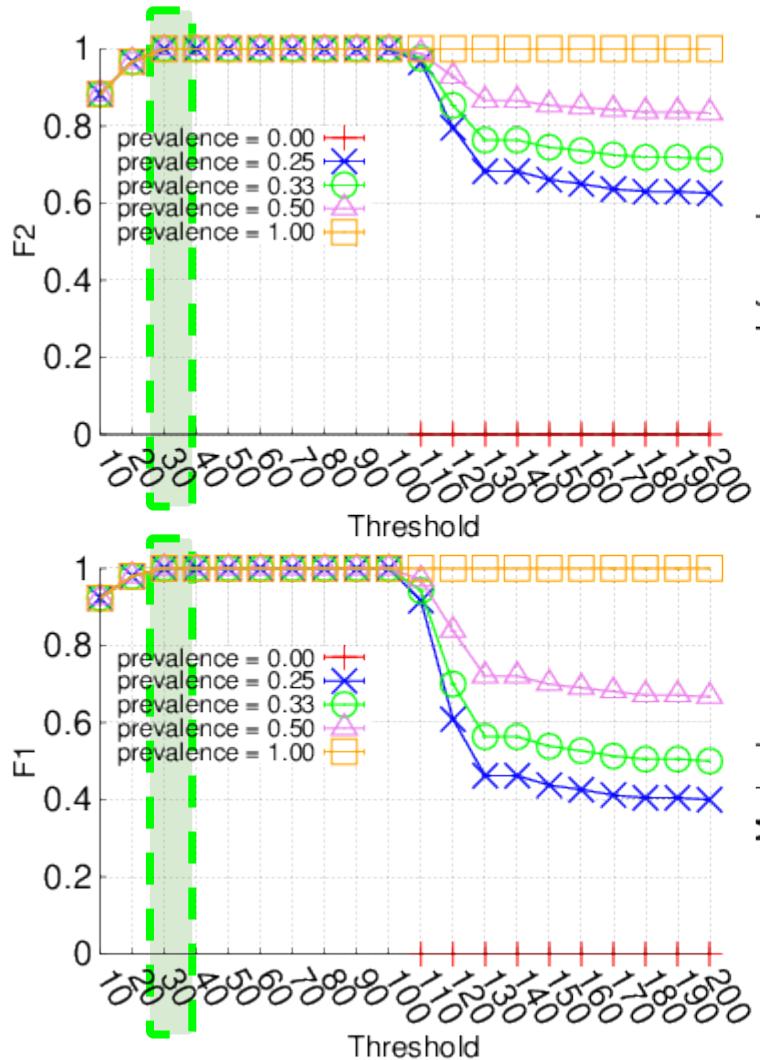




# Robust to prevalence



# Best threshold = 30%





- Motivations
- UBICA platform
- Size Ratio test
- **Case study**
  - Pakistan
  - Korea
  - Italy
- Conclusions



# Experimental setup

---

More than 200 probes

- 47 clients with GUI  
(run by volunteers both in Italy and abroad);
- 188 headless clients  
(of which 19 run by volunteers worldwide and 169 in PlanetLab nodes);
- 16 BISmark home routers run by volunteers  
(mostly in Pakistan)

probes running from 31 different countries



# Targets

---

The target lists for each country included

- *Herdict* URL list for the country
- a list of worldwide top accessed websites
- and URLs suggested by local volunteers

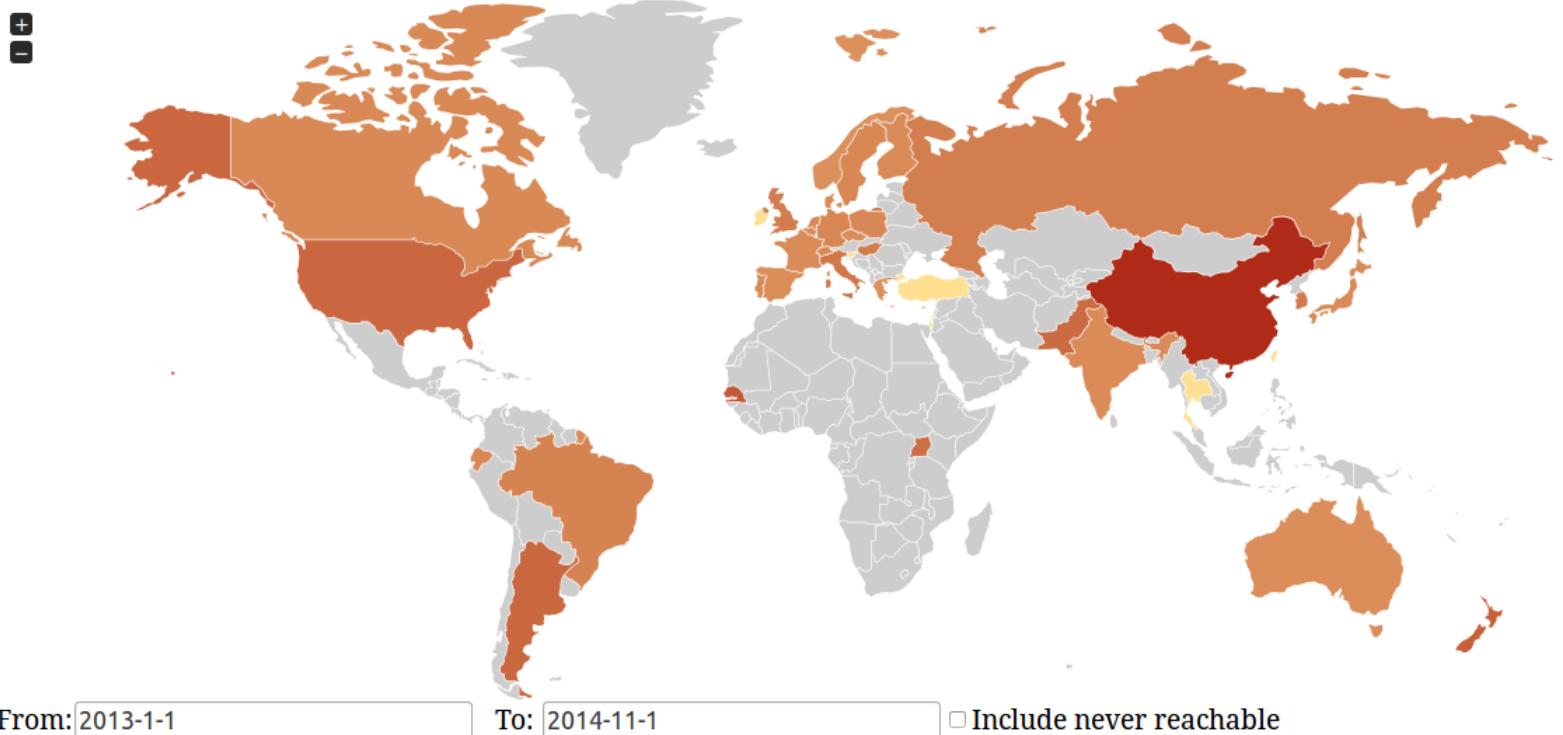
testing more than 16K different targets  
( ~ 15K different domains)

timespan of 4 months



# Report interface (detail:global map)

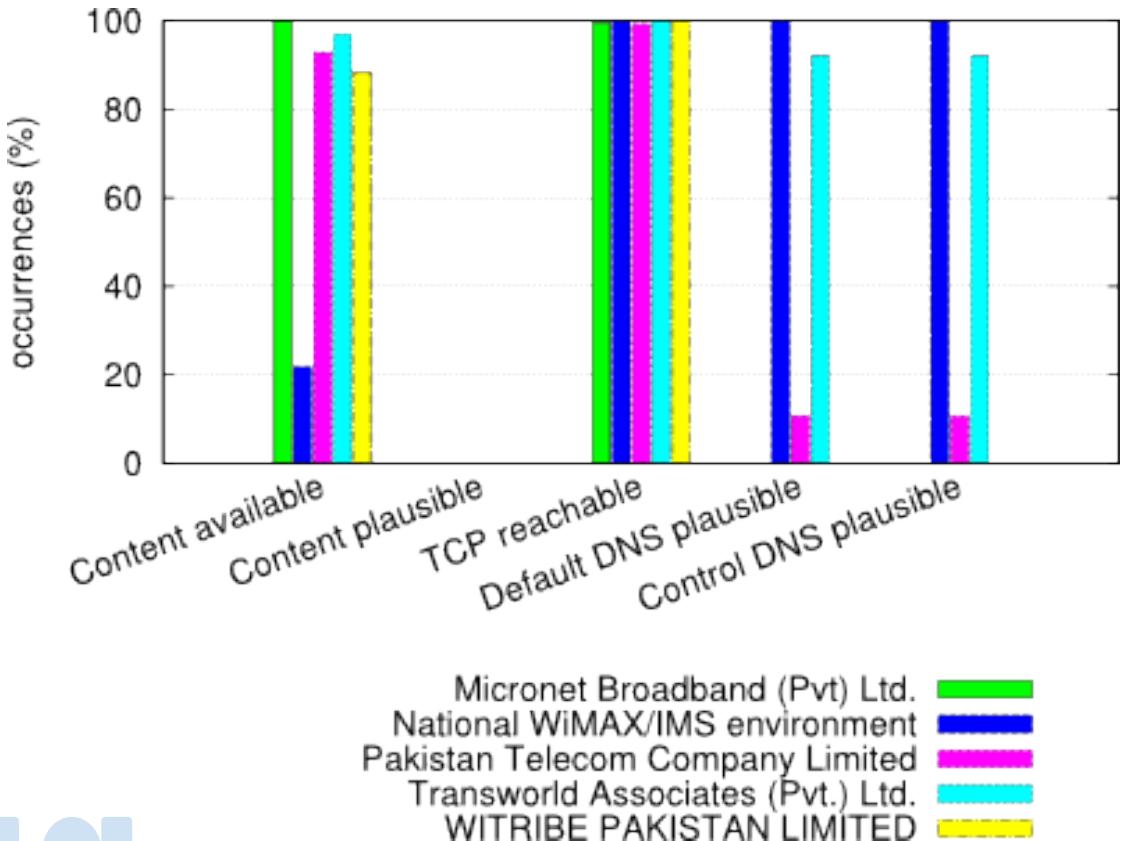
UBICA - Censorship detection and monitoring project  
from University of Napoli "Federico II" - [ubica.comics.unina.it](http://ubica.comics.unina.it)  
Global View - UbicaVM





# Pakistan: YouTube

## techniques overview

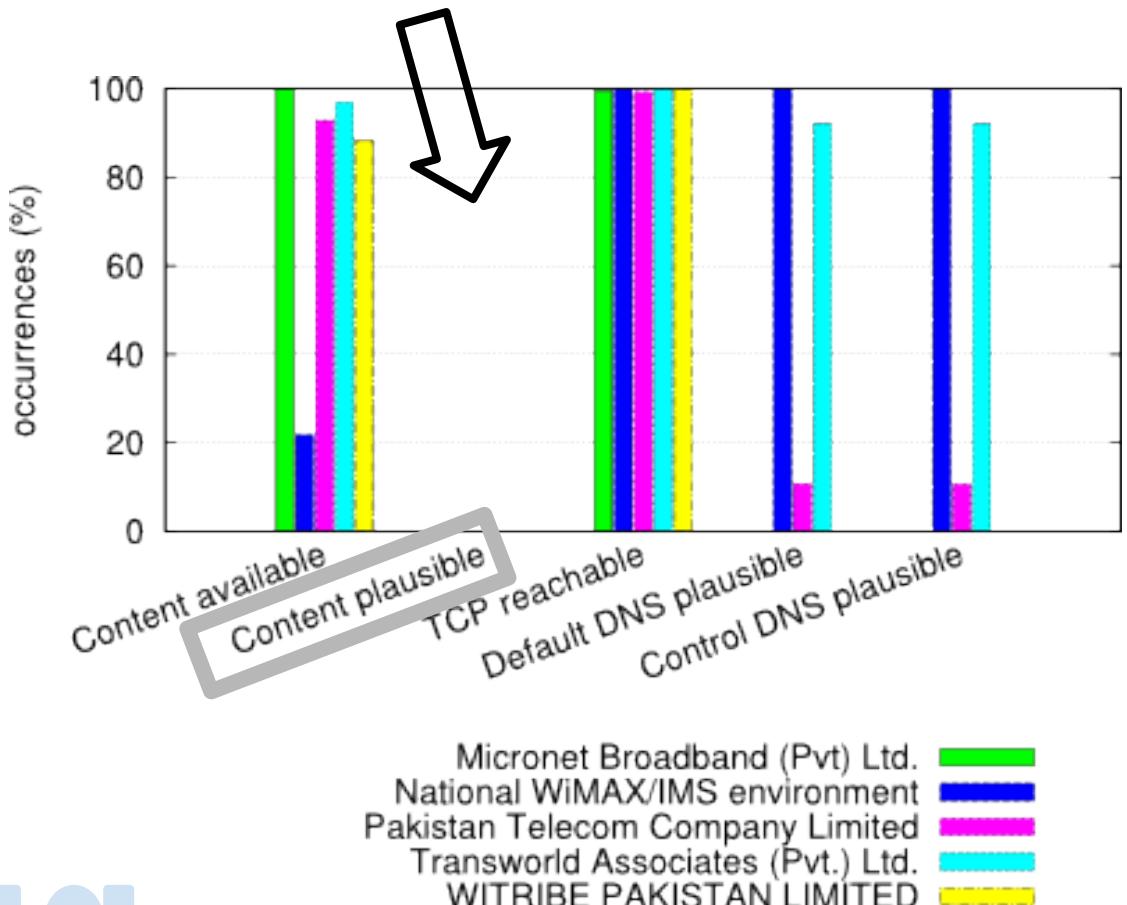




# Pakistan: YouTube

## techniques overview

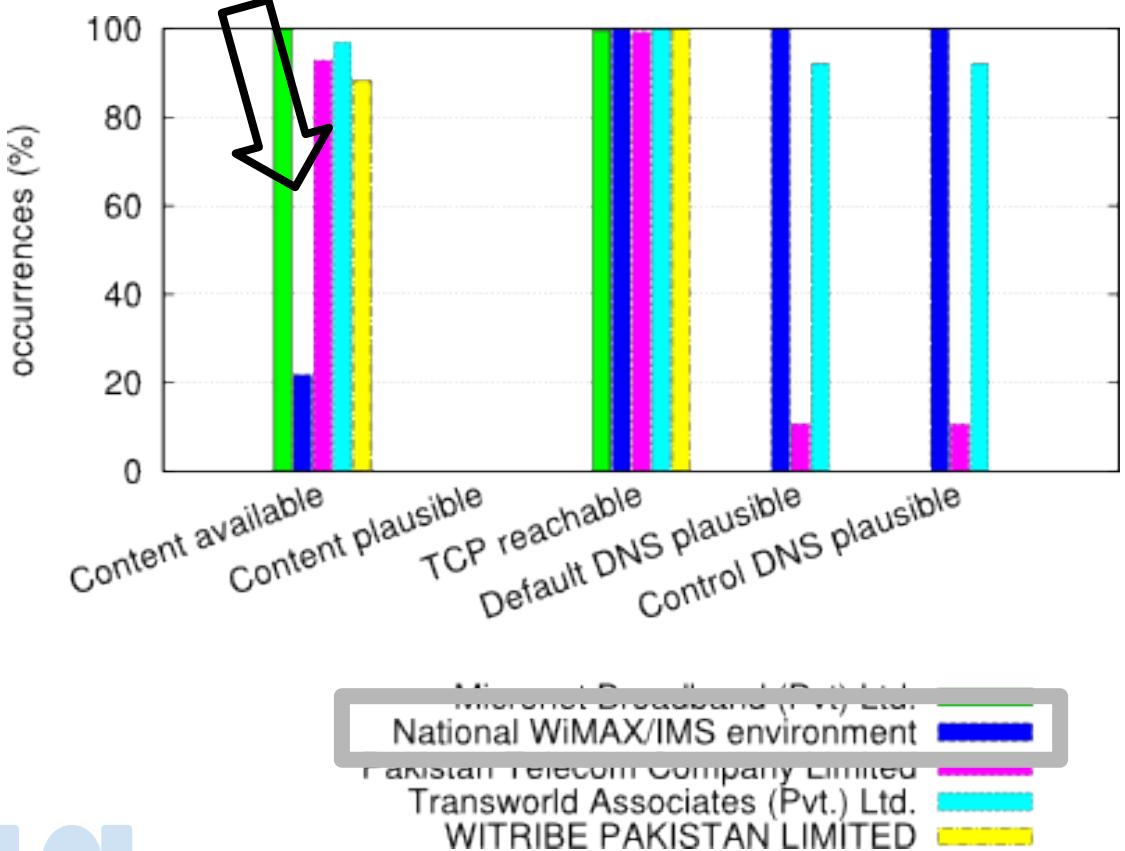
for all ISPs  
Content never plausible





# Pakistan: YouTube

## techniques overview

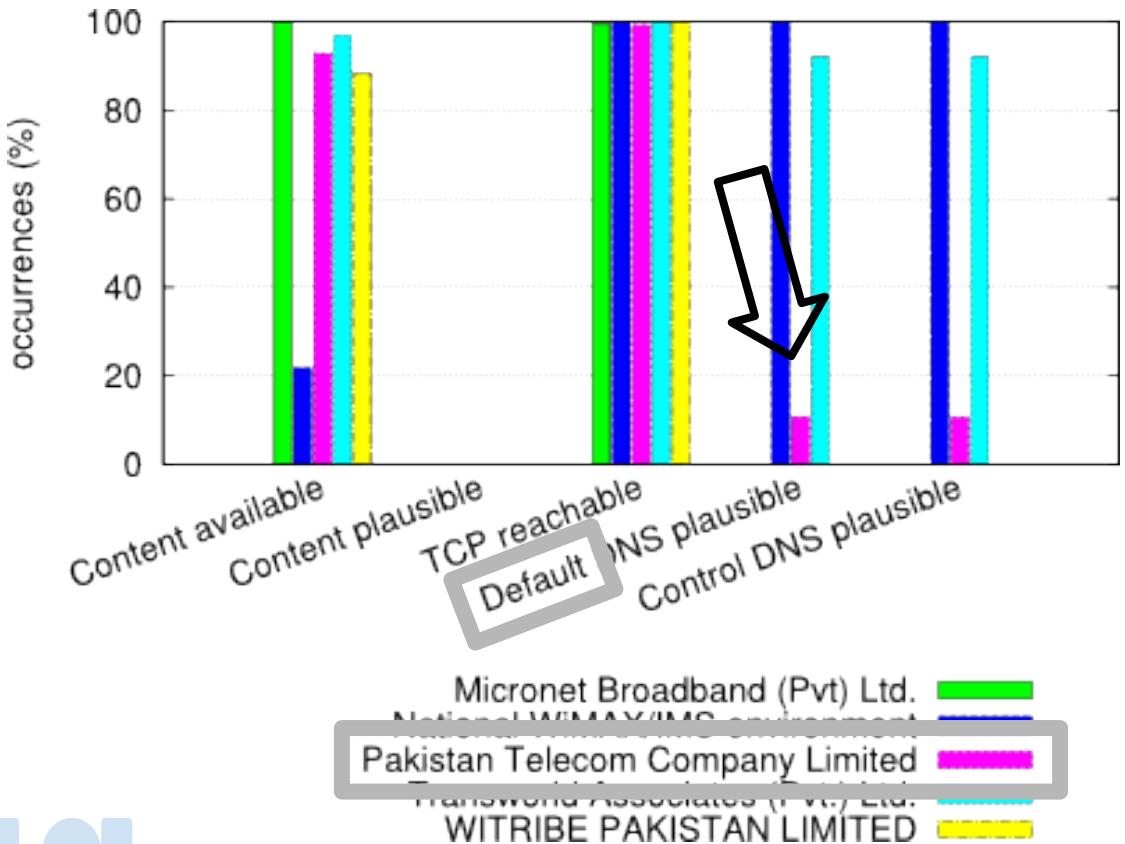


for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

# Pakistan: YouTube

## techniques overview



for all ISPs  
Content never plausible

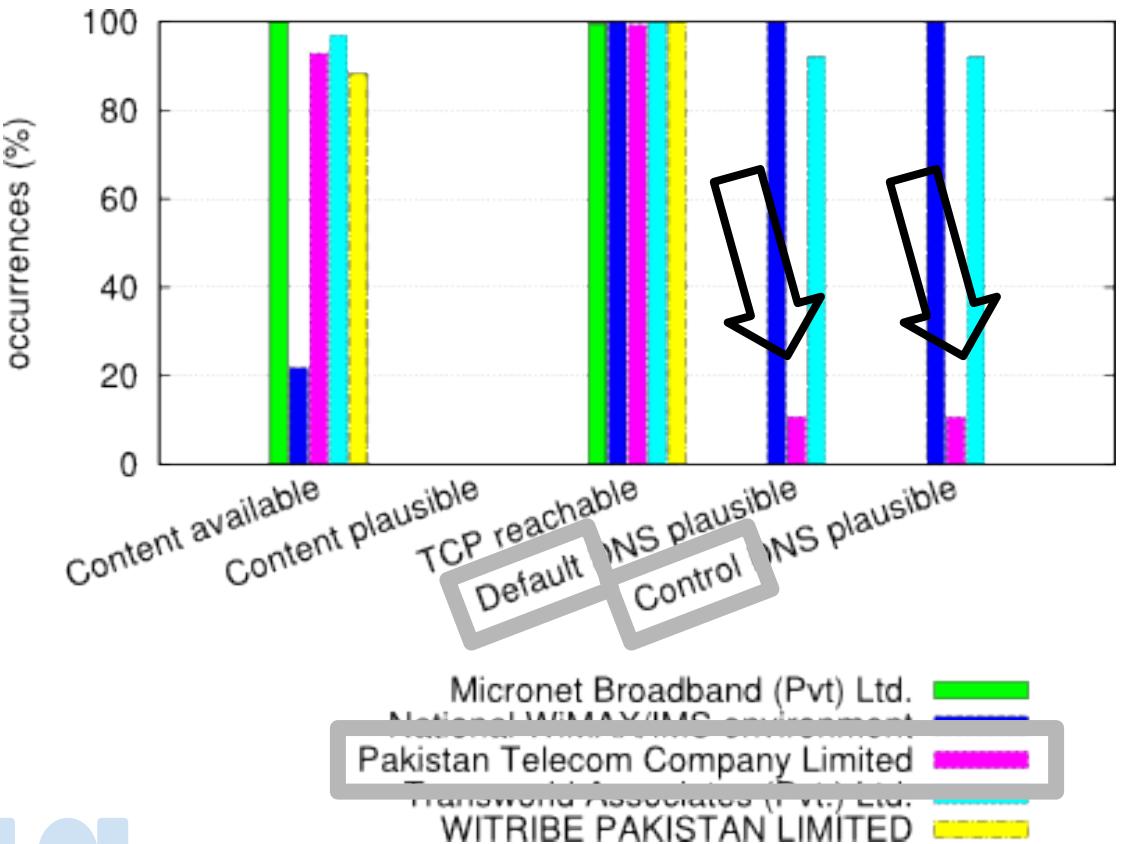
for WiMAX  
Content mostly unavailable

for PTCL  
DNS rarely plausible



# Pakistan: YouTube

## techniques overview



for all ISPs  
Content never plausible

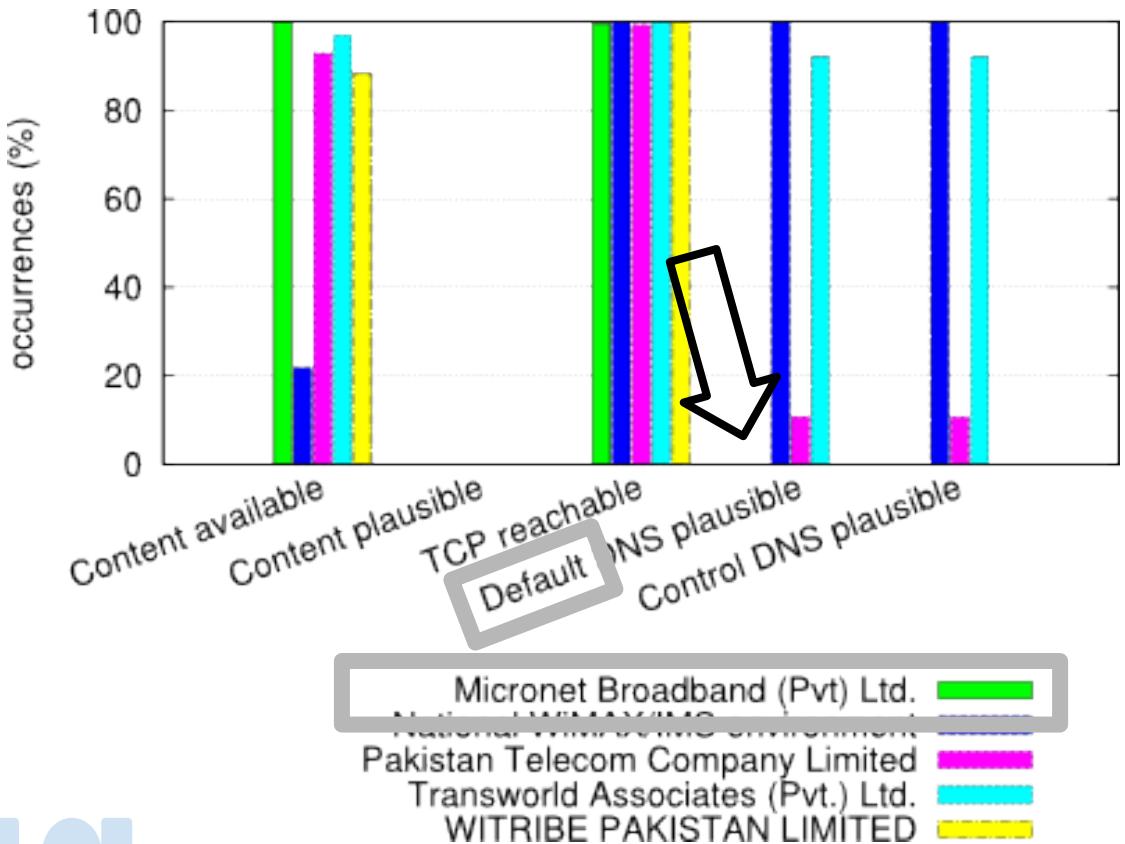
for WiMAX  
Content mostly unavailable

for PTCL  
DNS rarely plausible  
technique: **injection**



# Pakistan: YouTube

## techniques overview



for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

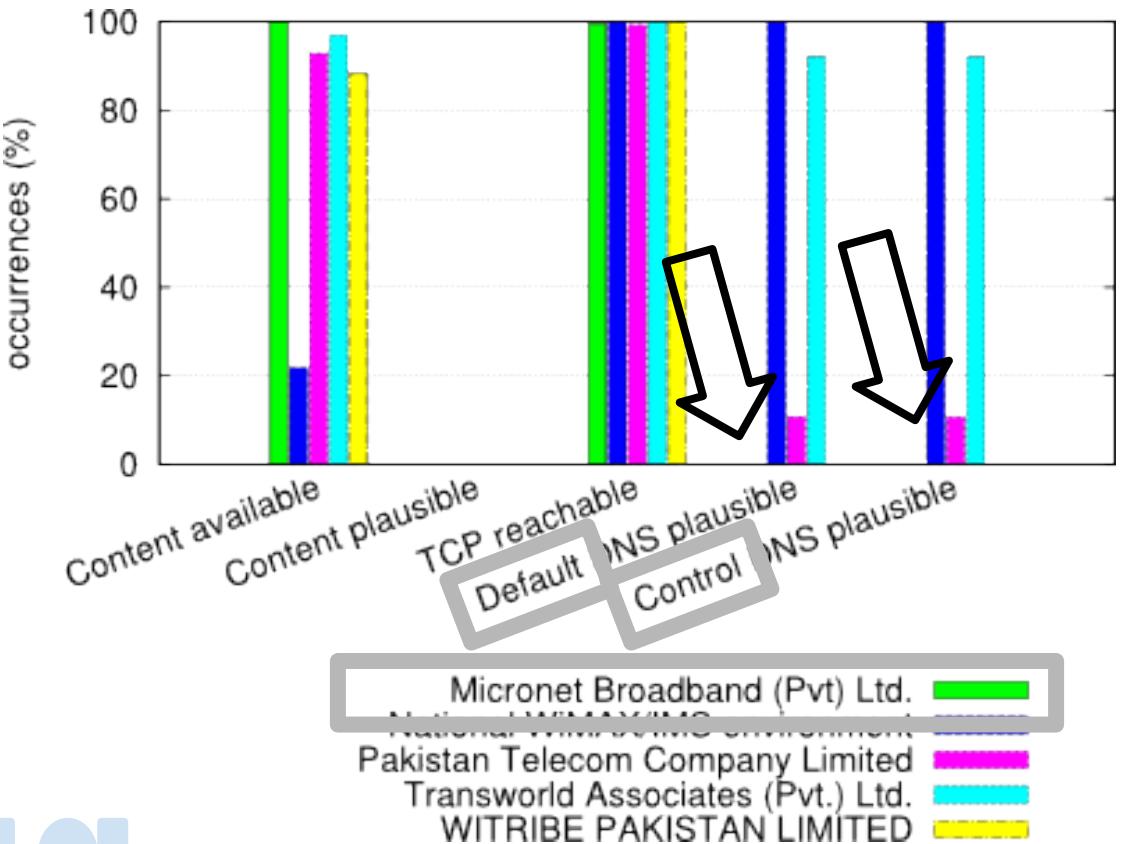
for PTCL  
DNS rarely plausible  
technique: **injection**

for Micronet  
DNS never plausible



# Pakistan: YouTube

## techniques overview



for all ISPs  
**Content** never plausible

for WiMAX  
**Content** mostly unavailable

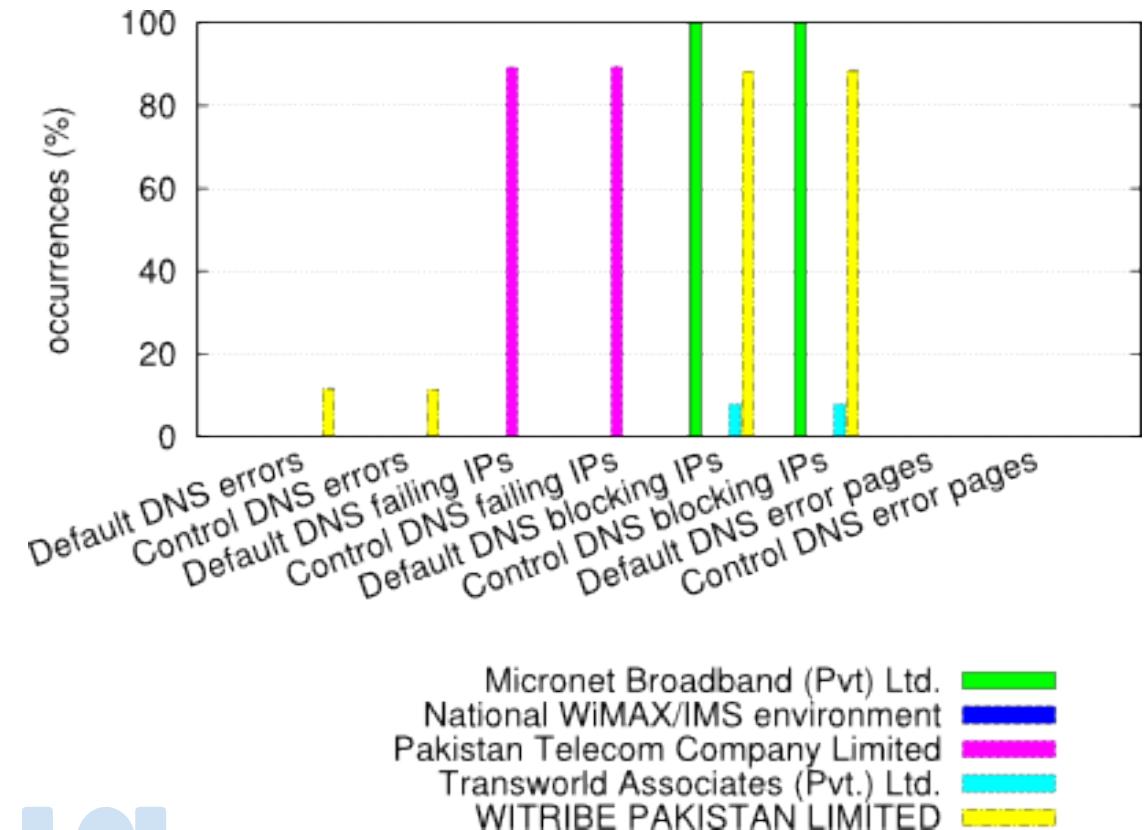
for PTCL  
**DNS** rarely plausible  
technique: **injection**

for Micronet  
**DNS** never plausible  
technique: **injection**



# Pakistan: YouTube

## DNS analysis detail



for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

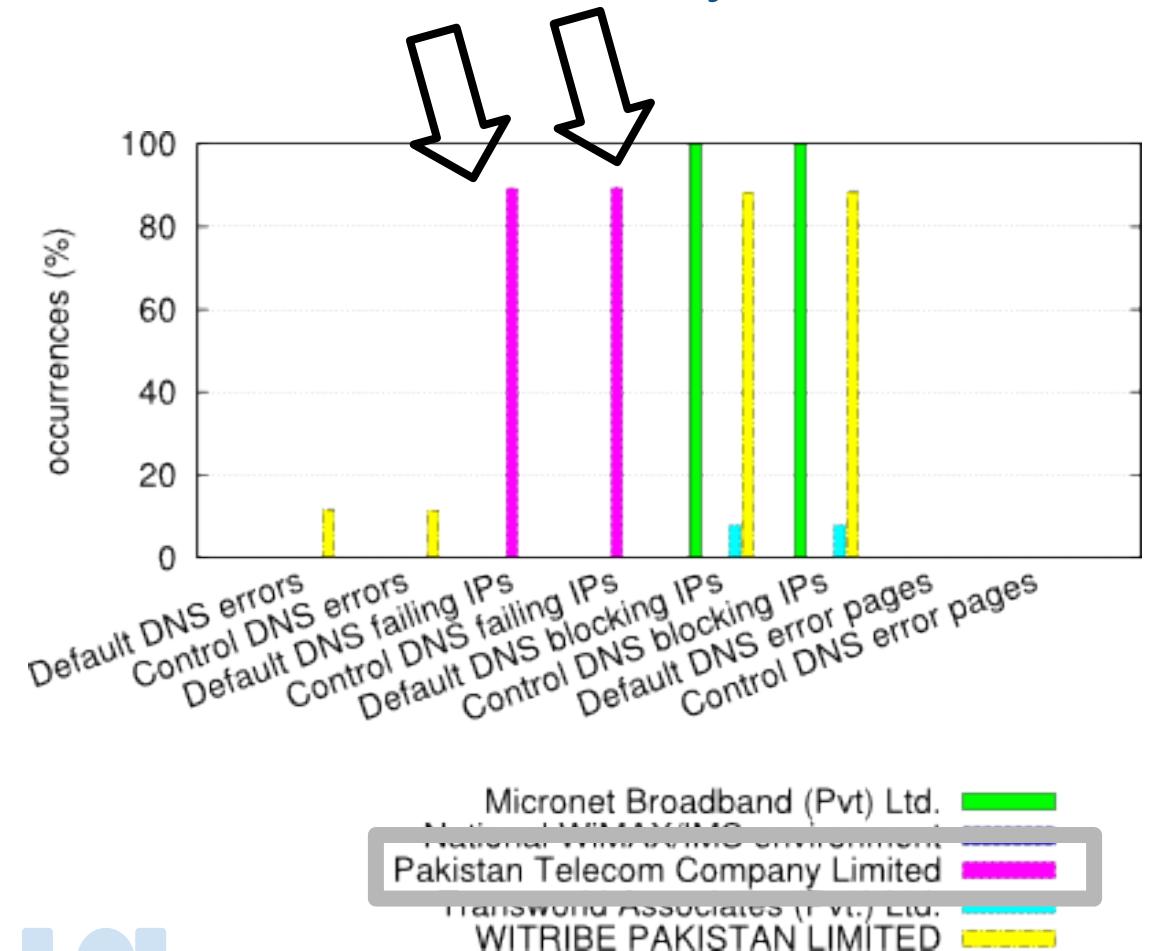
for PTCL  
DNS rarely plausible  
technique: injection

for Micronet  
DNS never plausible  
technique: injection



# Pakistan: YouTube

## DNS analysis detail



for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

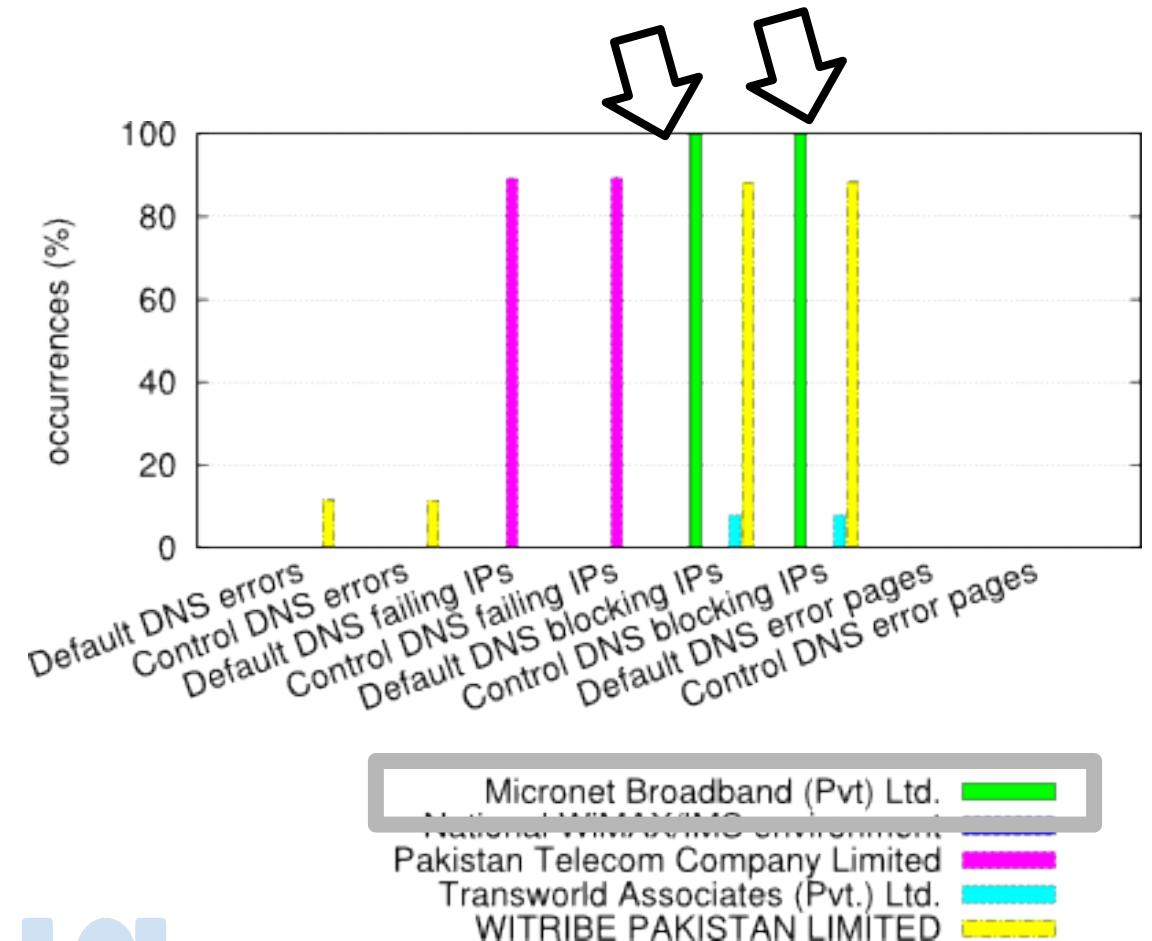
for PTCL  
DNS rarely plausible  
technique: **injection**  
symptom: **failing IP**

for Micronet  
DNS never plausible  
technique: **injection**



# Pakistan: YouTube

## DNS analysis detail



for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

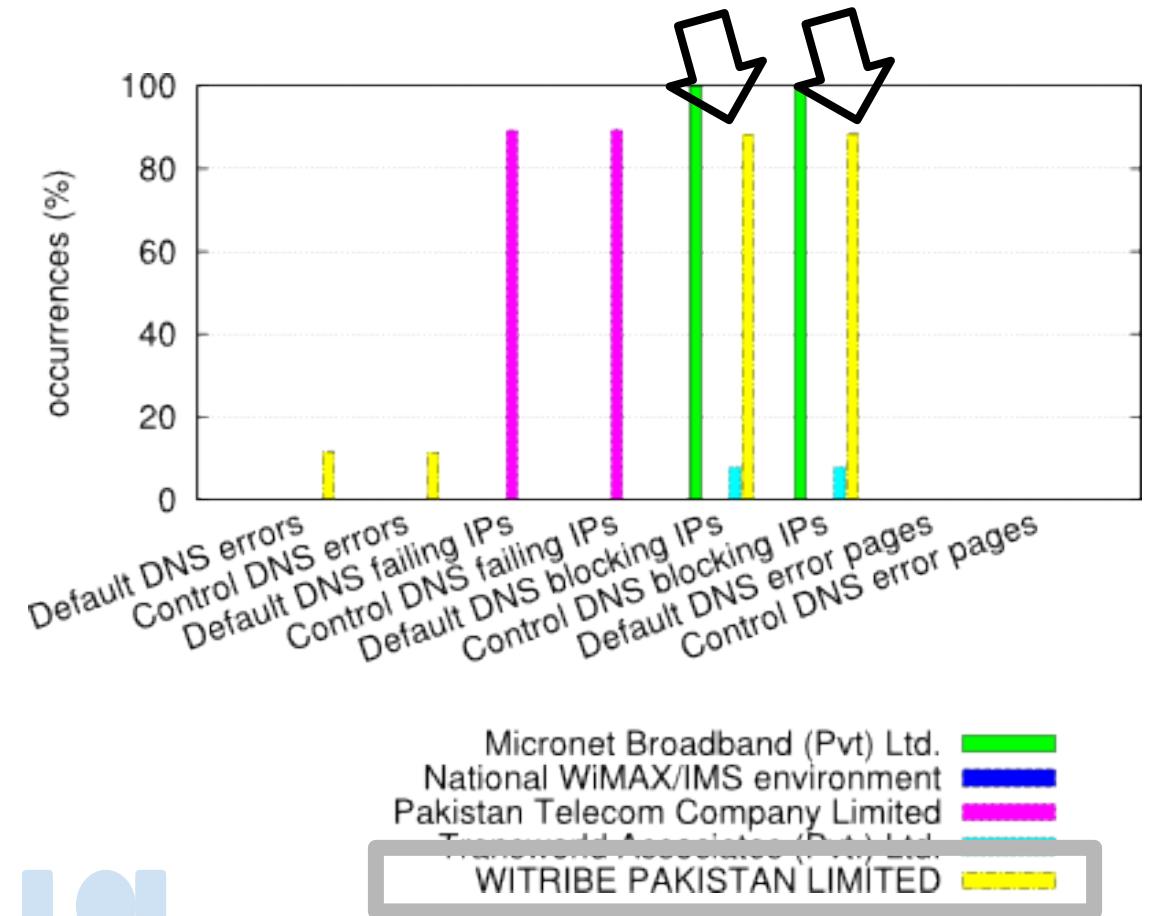
for PTCL  
DNS rarely plausible  
technique: **injection**  
symptom: **failing IP**

for Micronet  
DNS never plausible  
technique: **injection**  
symptom: **block page**



# Pakistan: YouTube

## DNS analysis detail



for all ISPs  
Content never plausible

for WiMAX  
Content mostly unavailable

for PTCL  
DNS rarely plausible  
technique: **injection**  
symptom: **failing IP**

for Micronet  
DNS never plausible  
technique: **injection**  
symptom: **block page**

for WITRIBE  
DNS never plausible  
technique: **injection**  
symptom: **block page**



# Pakistan: YouTube

## UBICA responses

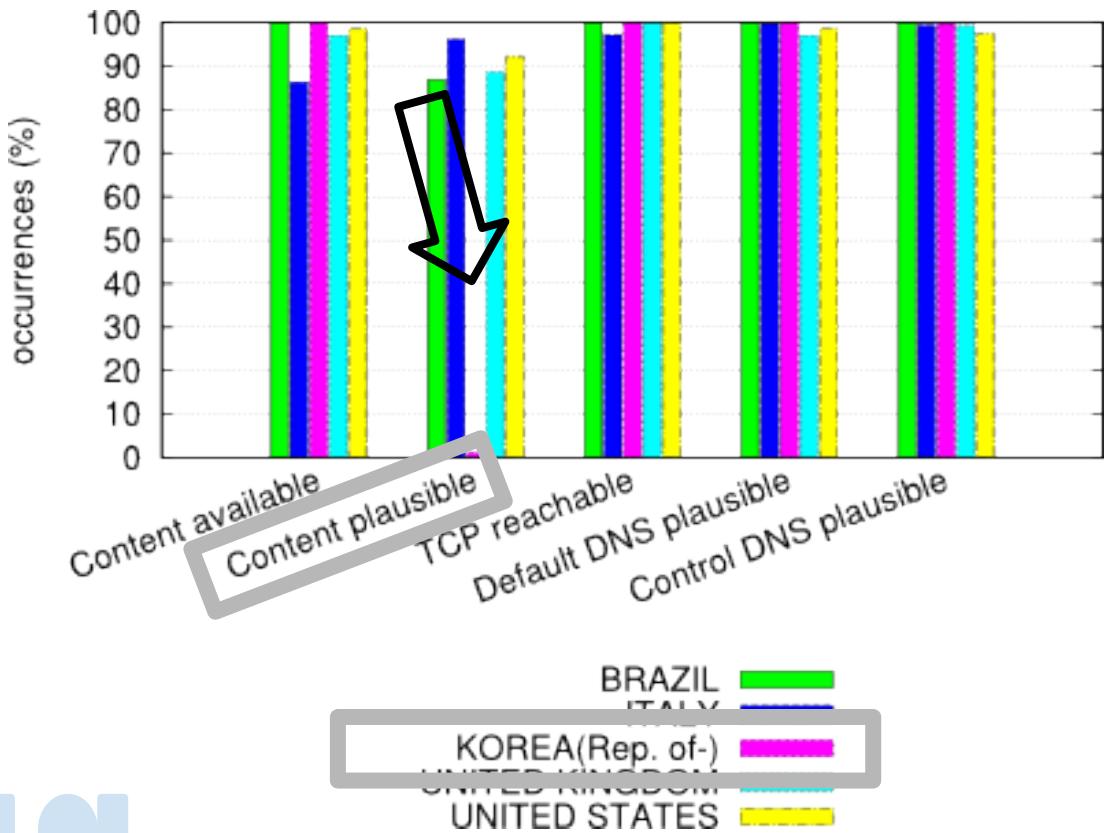
Micronet Broadband	DNS injection - send to <i>blocking page</i>
National WiMAX	HTTP tampering
PTCL	DNS injection - send to <i>failing IP</i>
WITRIBE	DNS injection - send to <i>blocking page</i>





# Rep. of Korea: porn websites

## techniques overview inter-countries

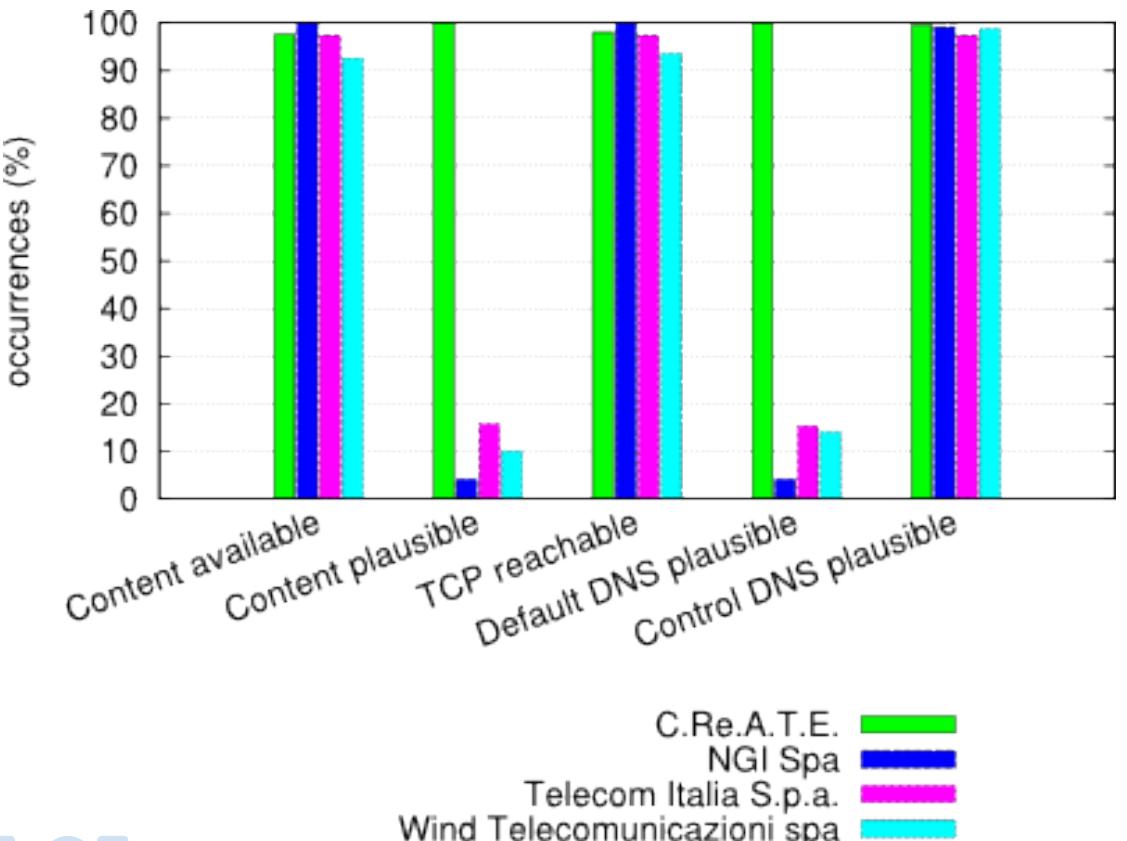


**No Content** plausible:  
HTTP tampering



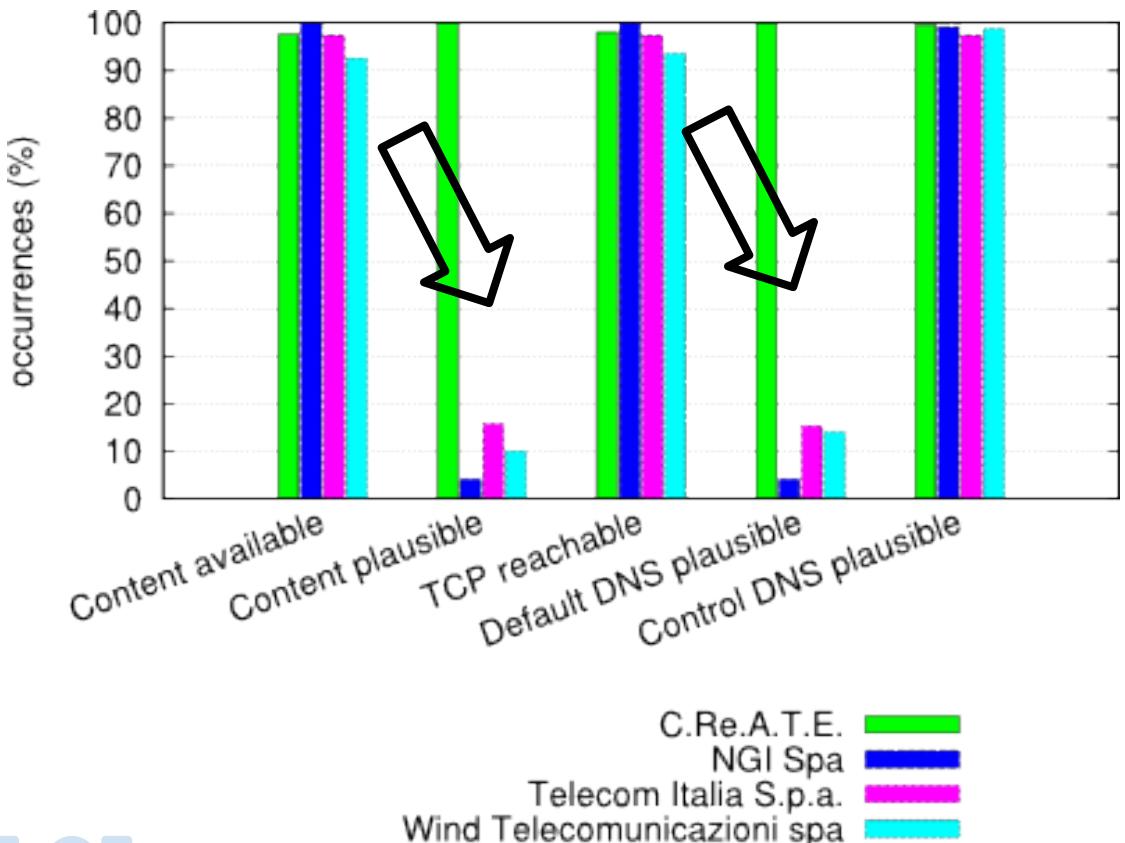
# Italy: gaming and betting websites

## bet365.com - techniques overview



# Italy: gaming and betting websites

## bet365.com - techniques overview

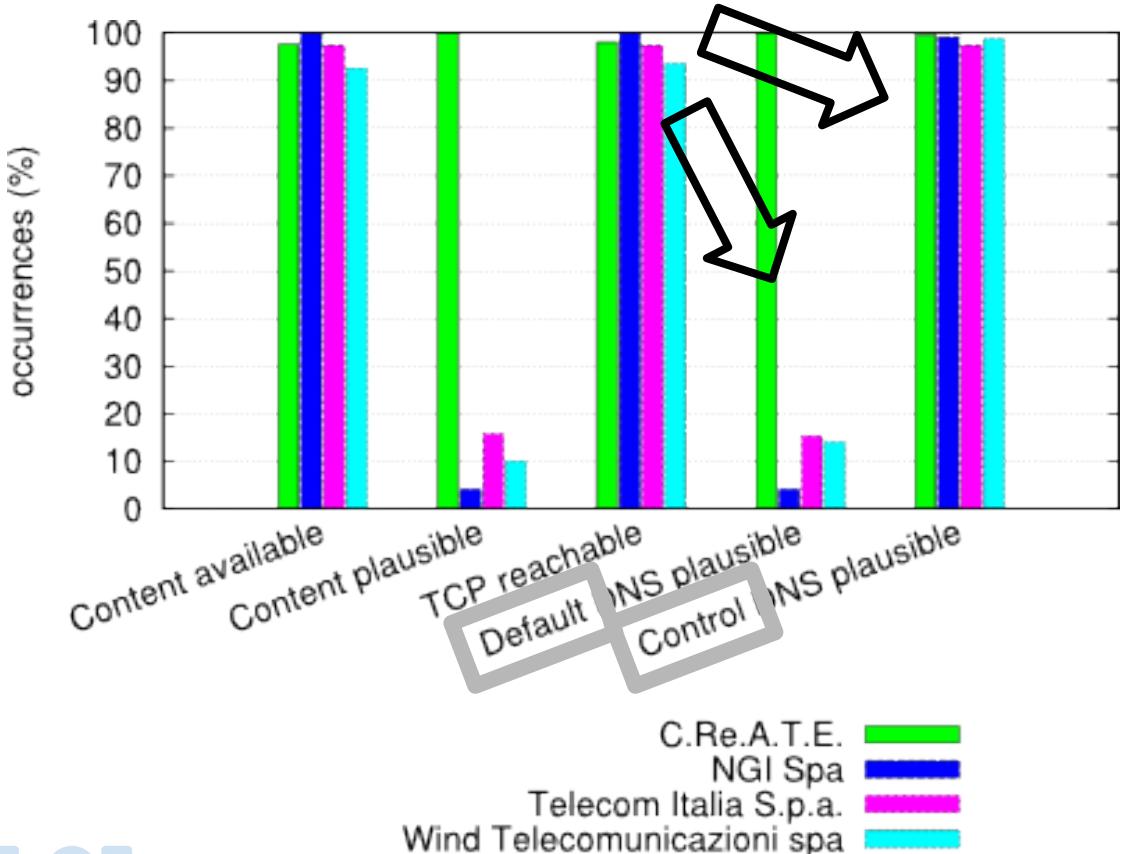


for all but one ISP  
**DNS** and **Content** both low:  
DNS tampering



# Italy: gaming and betting websites

## bet365.com - techniques overview

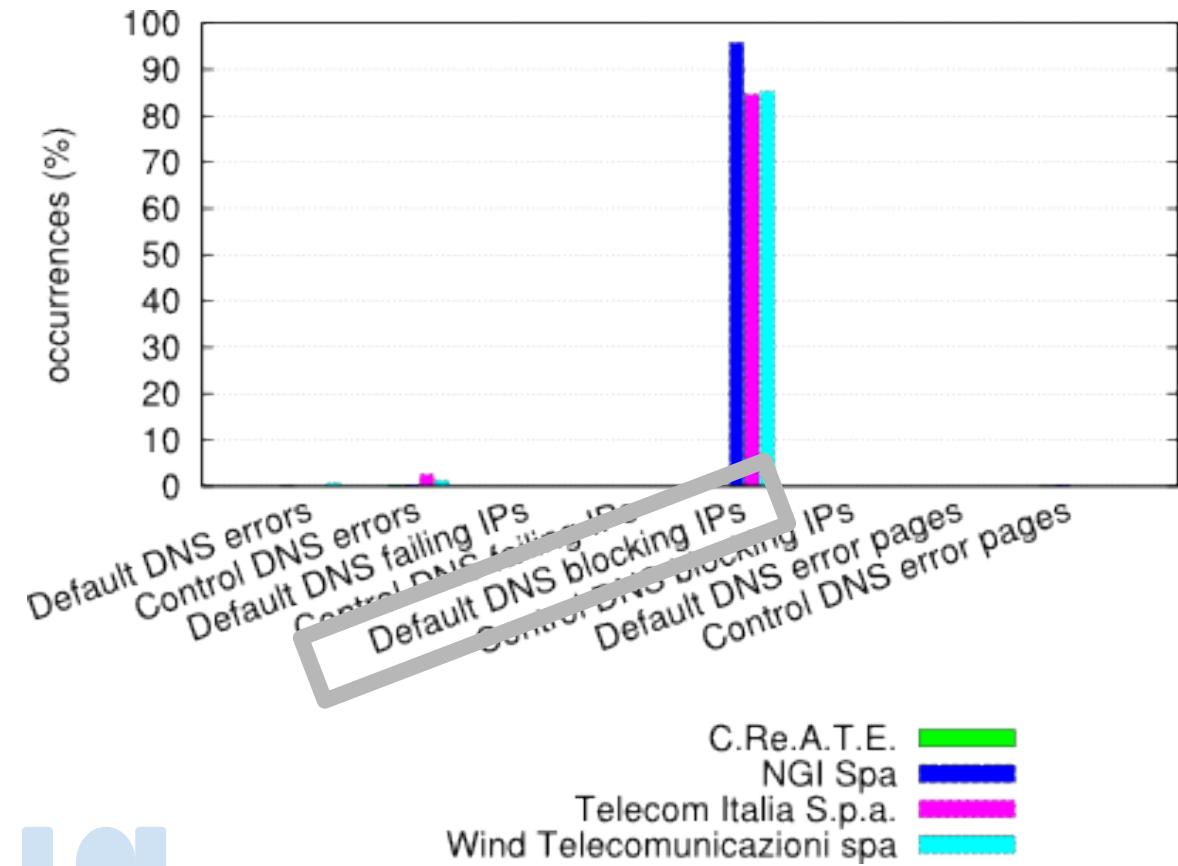


for all but one ISP  
**DNS** and **Content** both low:  
DNS tampering  
of subtype: **hijacking**



# Italy: gaming and betting websites

## bet365.com - DNS detail



for all but one ISP  
**DNS** and **Content** both low:  
DNS tampering  
of subtype: **hijacking**  
symptom: **block page**



# Italy: gaming and betting websites

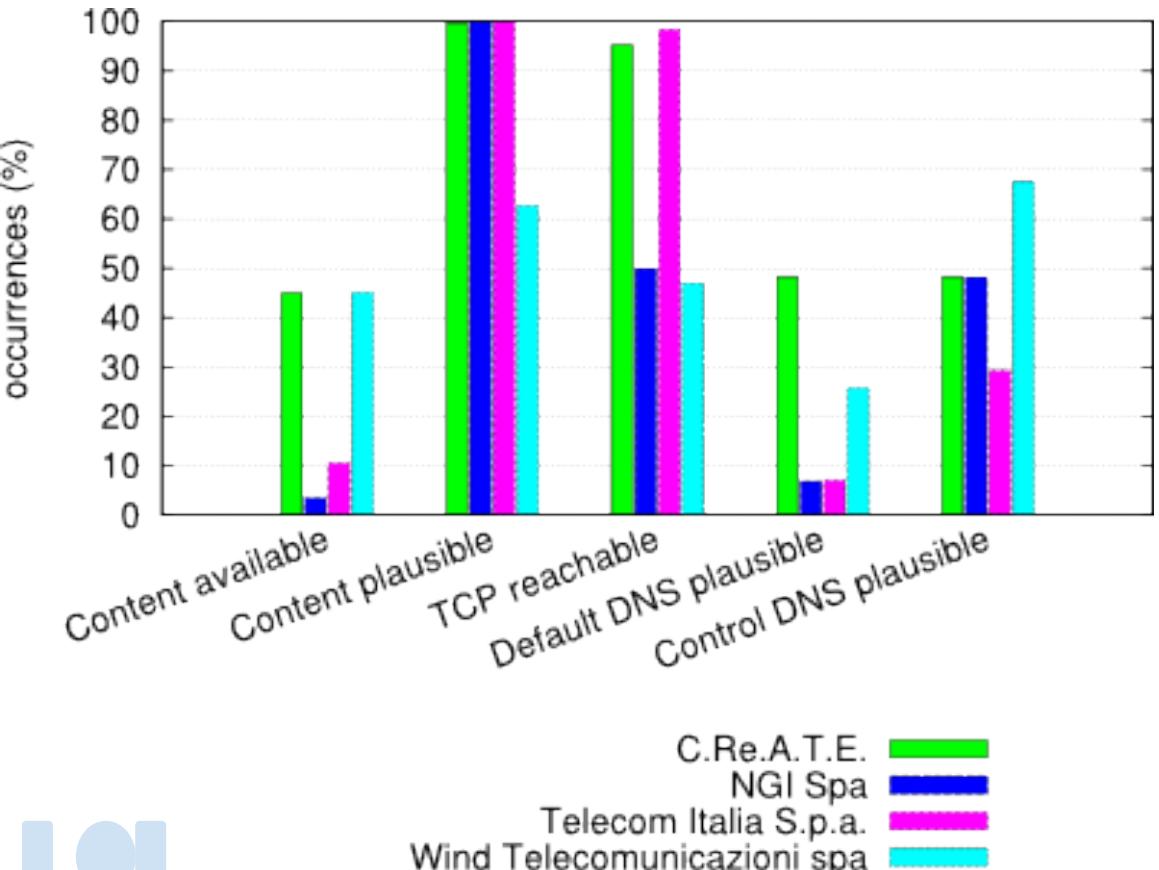
## UBICA responses

C.Re.A.T.E.	No censorship
NGI	DNS hijacking - send to <i>block page IP</i>
Telecom IT	DNS hijacking - send to <i>block page IP</i>
WIND	DNS hijacking - send to <i>block page IP</i>



# Italy: file sharing websites

## thepiratebay.sx - techniques overview

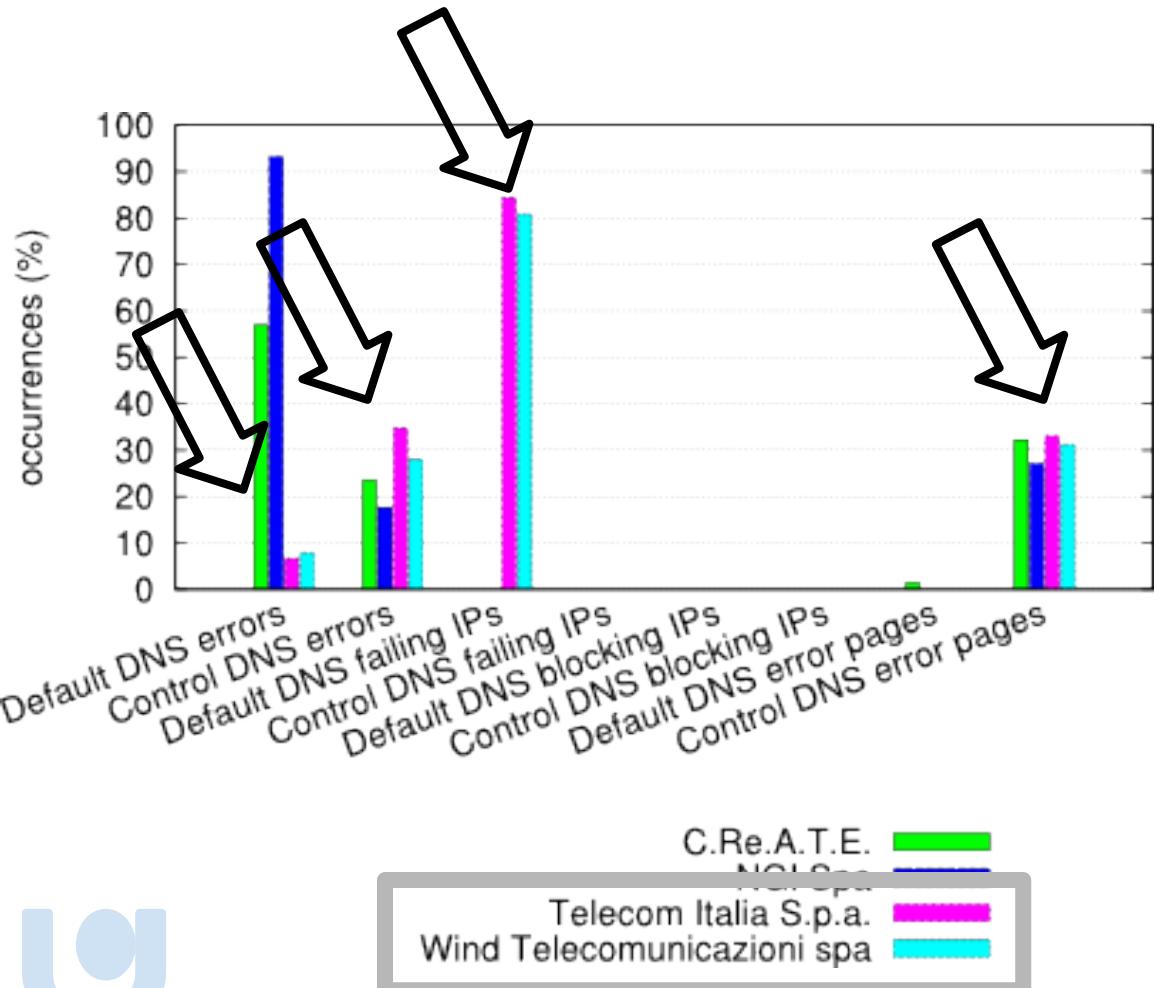


for all ISPs  
Content partially available



# Italy: file sharing websites

## thepiratebay.sx - DNS analysis detail



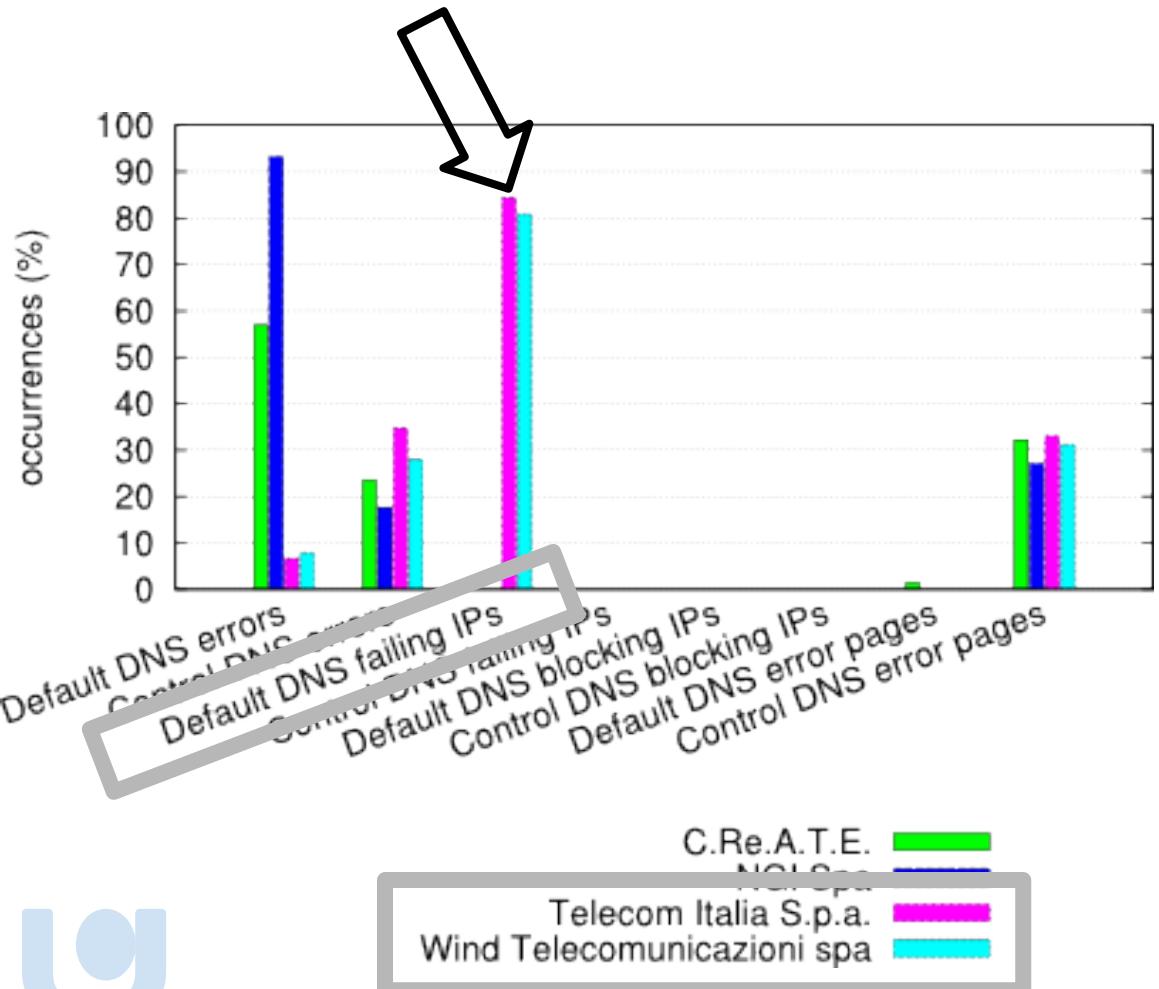
for all ISPs  
Content partially available  
No blocking pages

both Telecom IT  
and WIND Tlc  
Different DNS errors



# Italy: file sharing websites

## thepiratebay.sx - DNS analysis detail



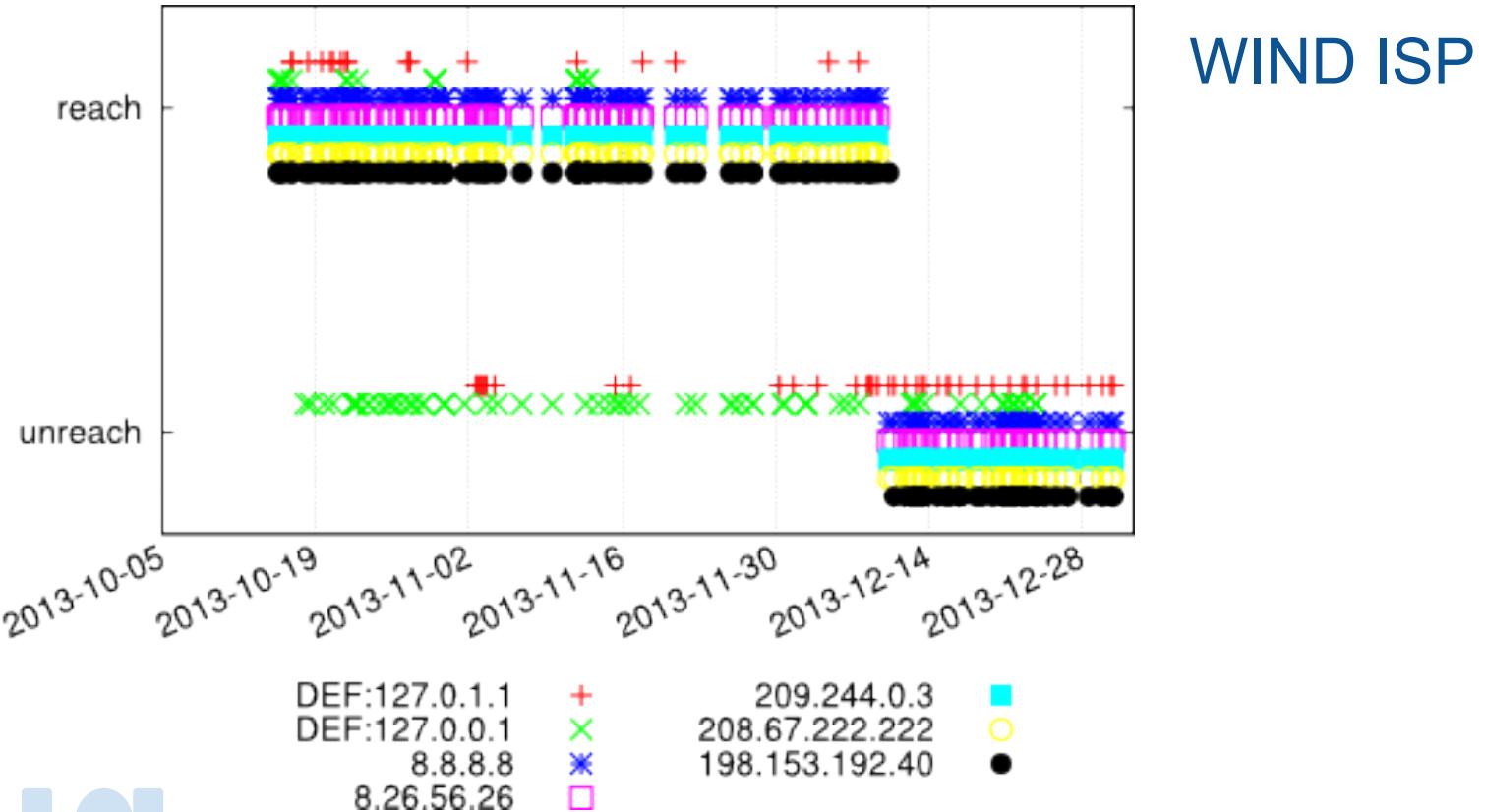
for all ISPs  
Content partially available  
No blocking pages

both Telecom IT  
and WIND Tlc  
Different DNS errors  
censor with **Failing IP**



# Italy: file sharing websites

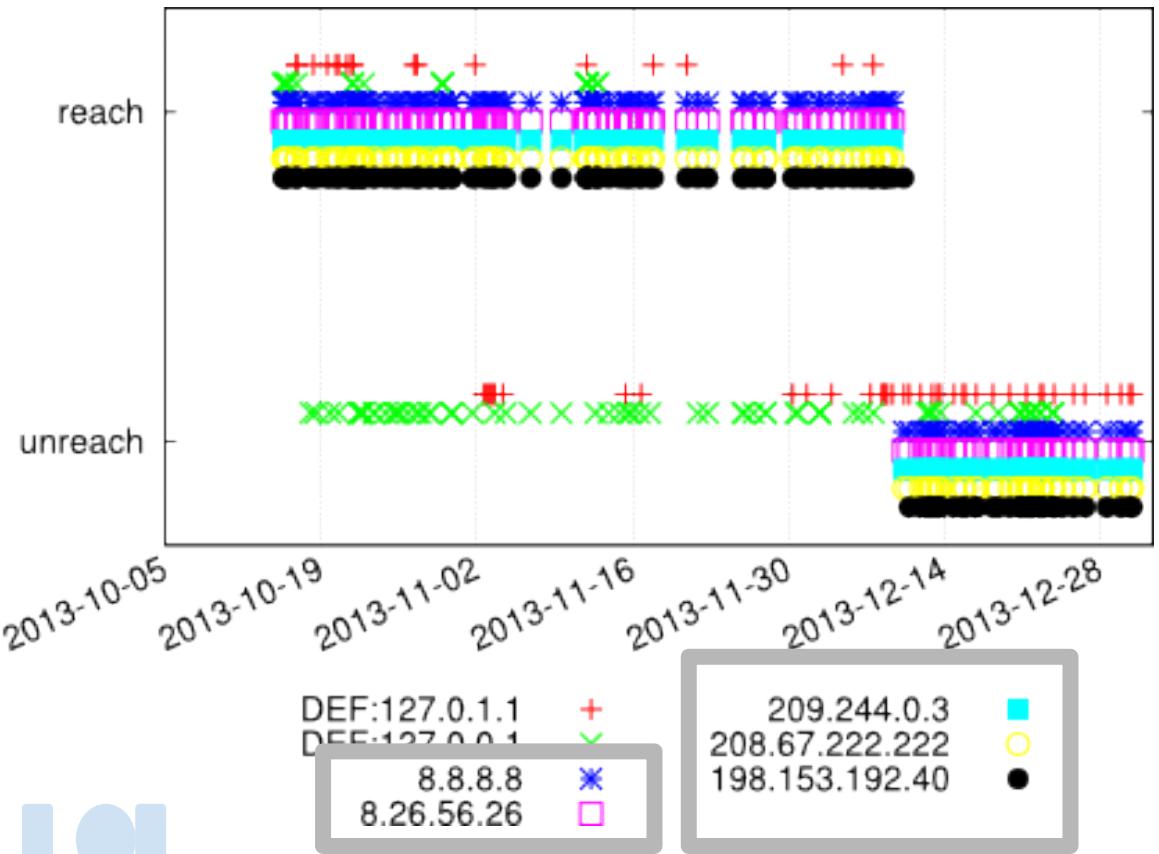
## thepiratebay.sx - DNS time analysis





# Italy: file sharing websites

## thepiratebay.sx - DNS time analysis

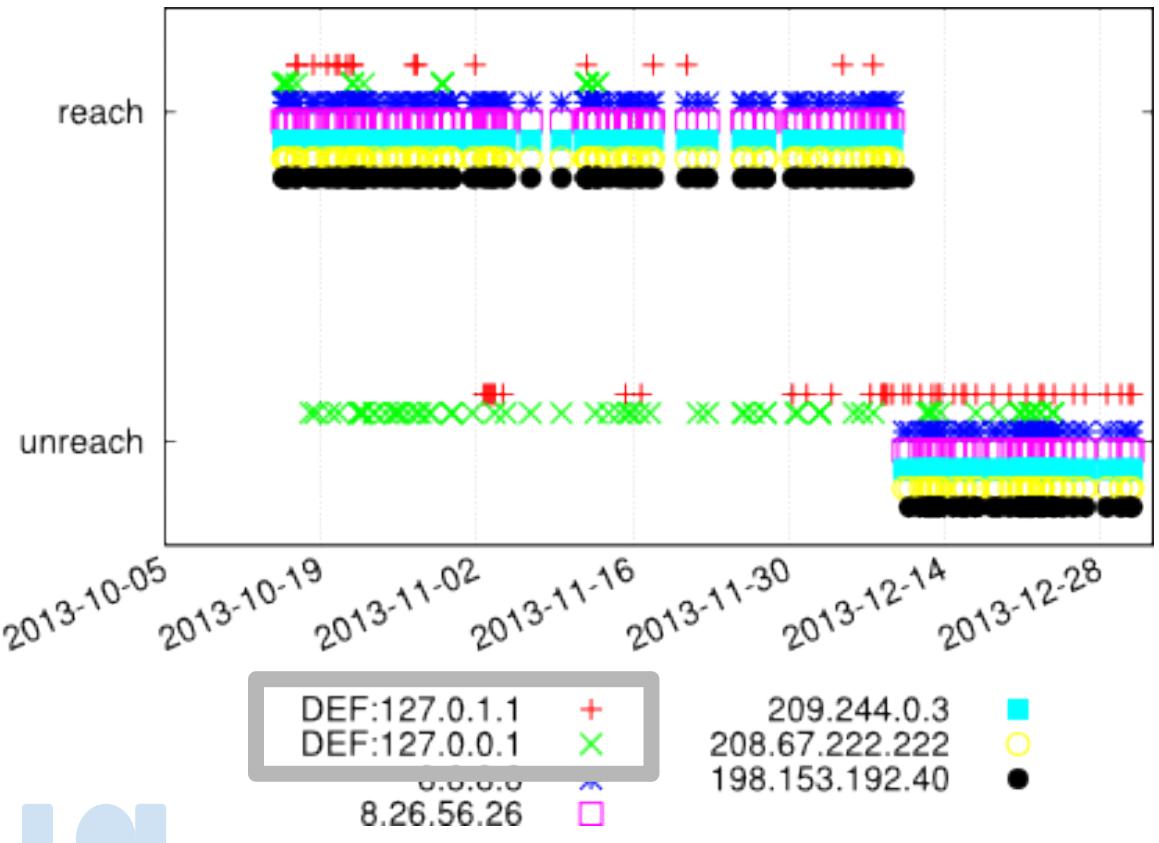


WIND ISP  
Control resolvers OK



# Italy: file sharing websites

## thepiratebay.sx - DNS time analysis



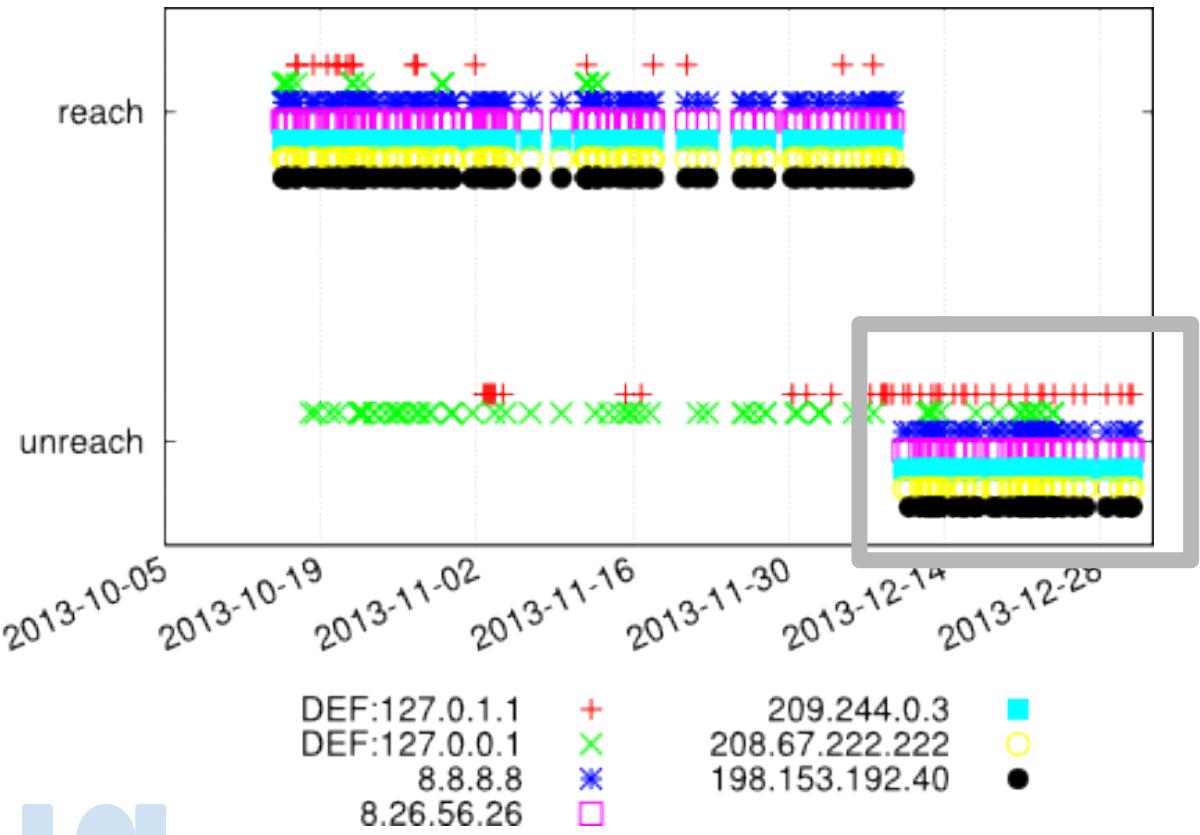
WIND ISP  
Control resolvers OK

Default resolvers  
one **hijacking**  
one **oscillates**



# Italy: file sharing websites

## thepiratebay.sx - DNS time analysis



WIND ISP  
Control resolvers OK

Default resolvers  
one **hijacking**  
one **oscillates**

All agree on  
unreachability



# Italy: file sharing websites

thepiratebay.sx - response

C.Re.A.T.E.	No censorship - domain expired
NGI	No censorship - domain expired
Telecom IT	DNS hijacking - send to <i>failing IP</i>
WIND	DNS hijacking - send to <i>failing IP</i>



# Outline

---

- Motivations
- UBICA platform
- Size Ratio test
- Case study
  - Pakistan
  - Korea
  - Italy
- **Conclusions**



# Concluding remarks

---

- Variability over time and space (ISP, country)
- Different censoring techniques with similar symptoms (e.g. RST from wrong host)
- Internet Censorship detection can be tricky



# Concluding remarks

---

- Variability over time and space (ISP, country)
- Different censoring techniques with similar symptoms (e.g. RST from wrong host)
- Internet Censorship detection can be tricky

**UBICA has proved effective in monitoring it**



# Undergoing/future work

---

- new collection / tests
  - throttling detection (download time)
  - topology information collection (traceroute to target)
  - TLS tampering (SSL certificate check)
  - Tuning *window size* for time analysis
- features
  - tomography setup (with helper server)
  - publish open data
    - anonymize probe IP?*
    - remove/degrade timestamp?*



# “Side” open issues

---

- How to compare different countries?
- How much censorship is “high”?
- Involving users can be dangerous for them?



# Collaborations more than welcome

---

- UBICA is crowdsourced (mostly academic): accuracy and coverage depend on participation
- New tests, analyses, features...

Preview of report interface (a snapshot run), and headless probe:

<http://traffic.comics.unina.it/Traffic/ubica.php>  
drop an email! [giuseppe.aceto@unina.it](mailto:giuseppe.aceto@unina.it)



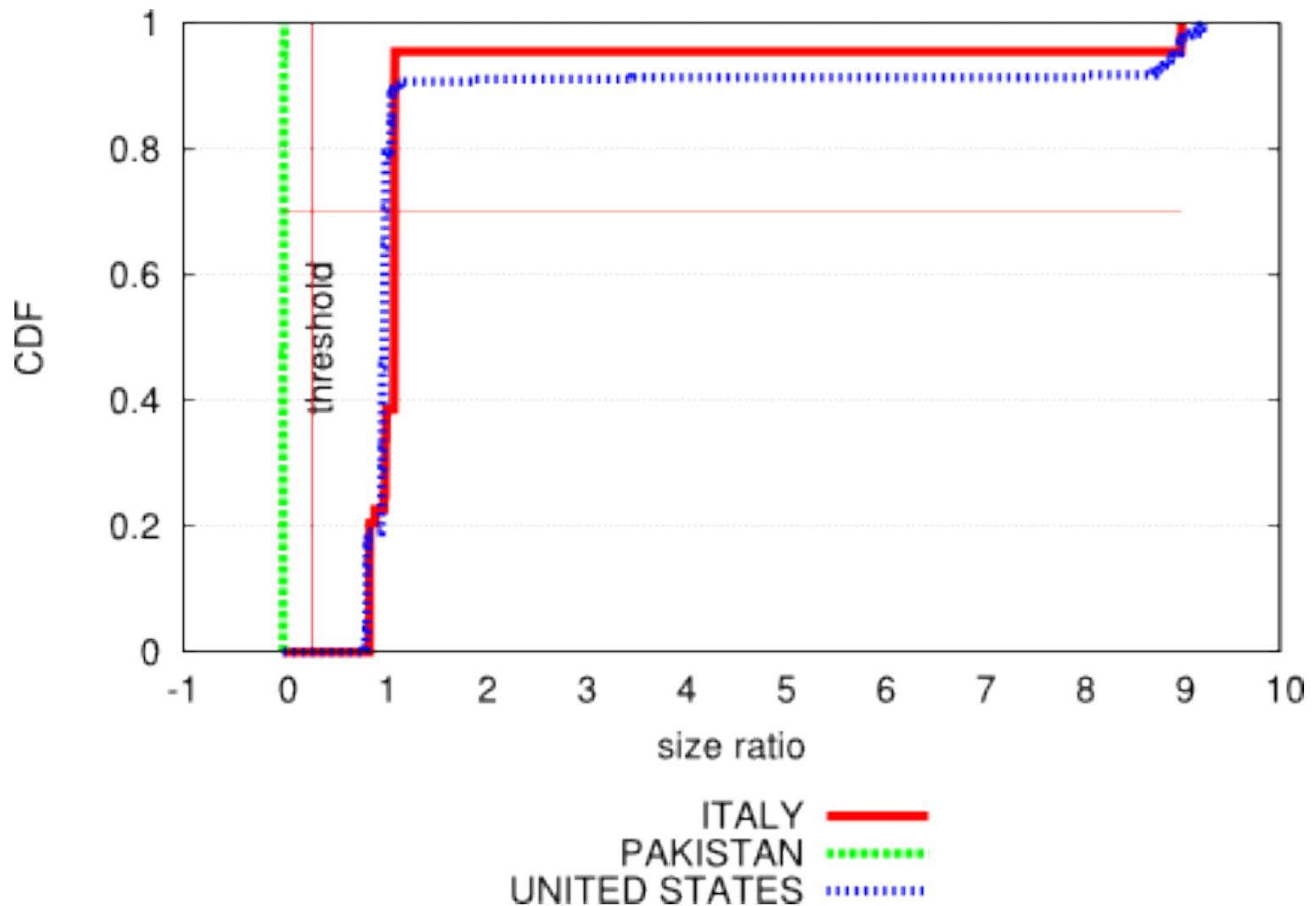
Thanks for your attention



backup stuff

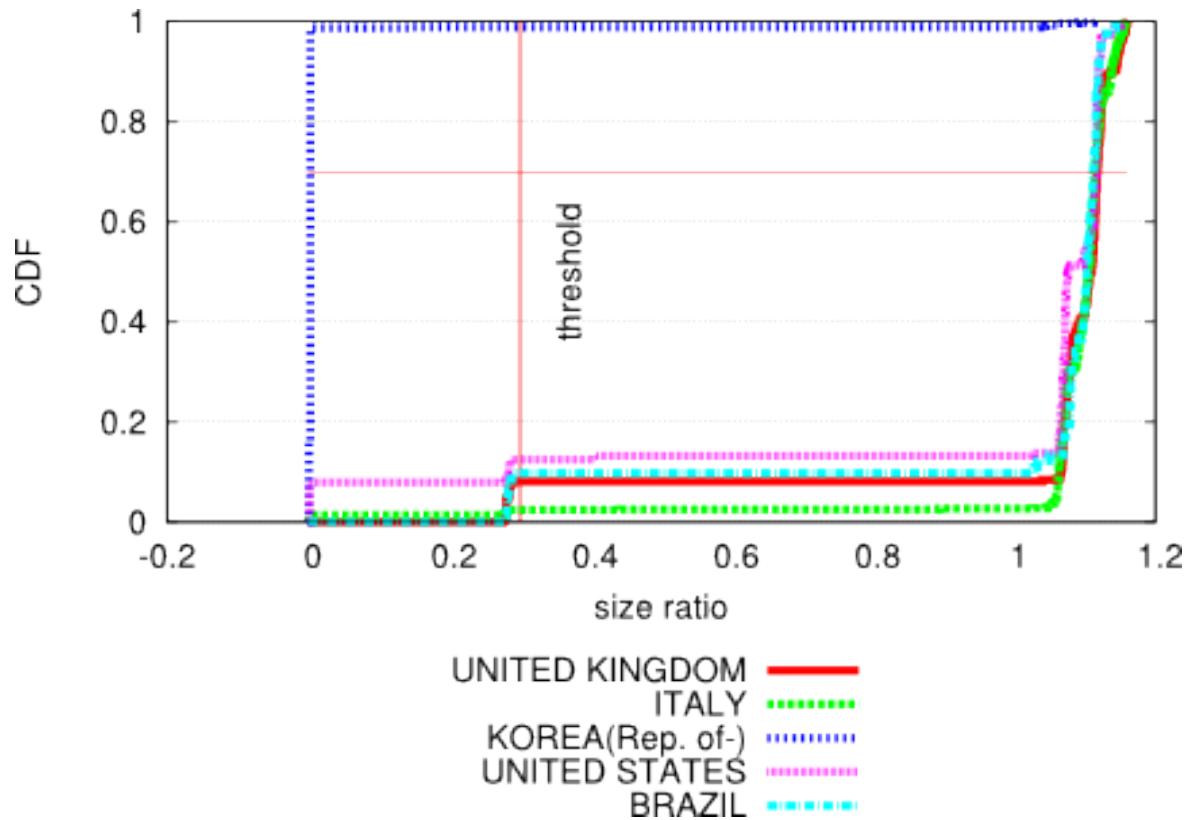


# Censorship in Pakistan: the case of YouTube





# Censorship in Korea: porn websites



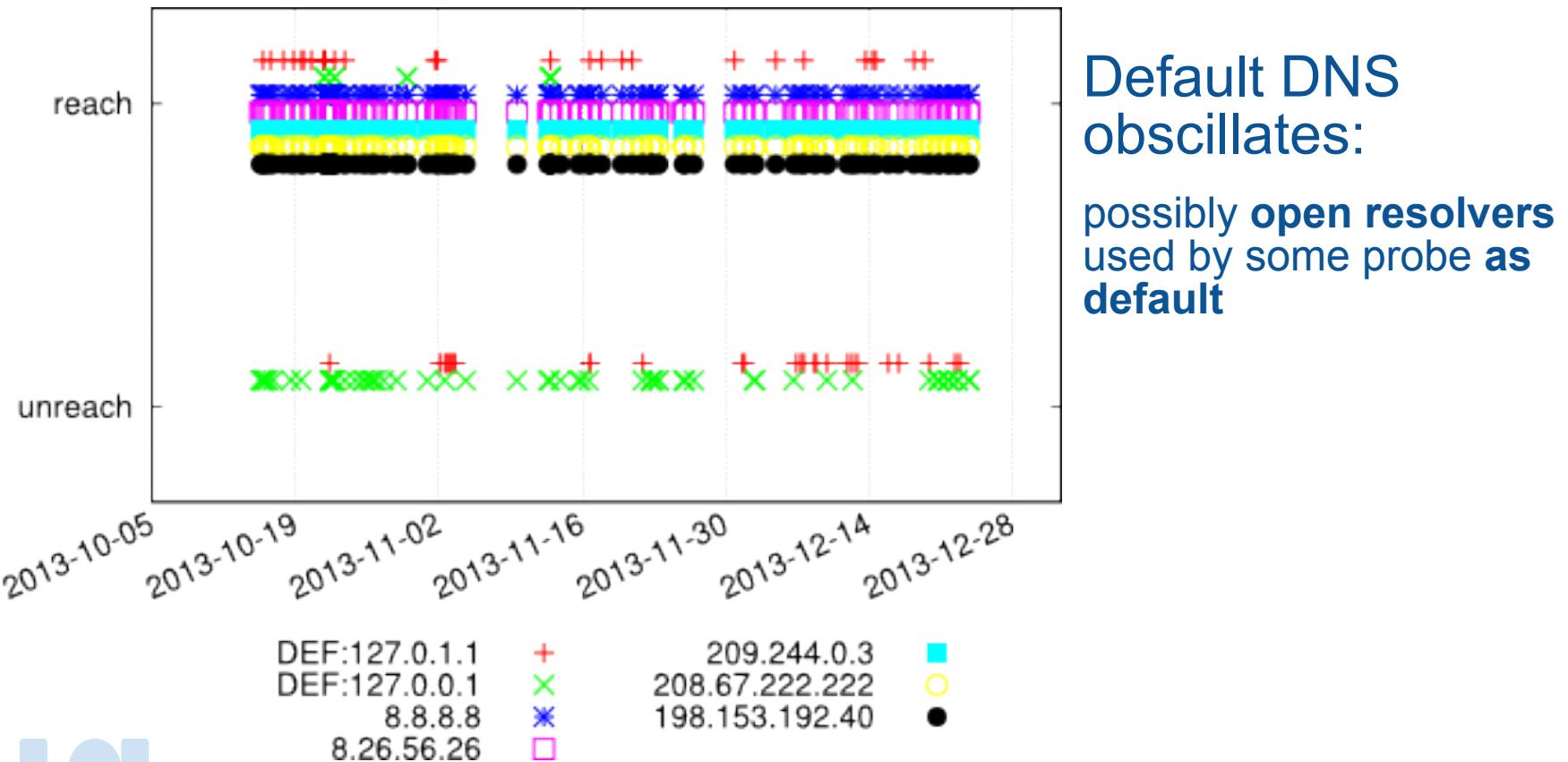
injected JavaScript section:  
redirect to the address <http://warning.or.kr>





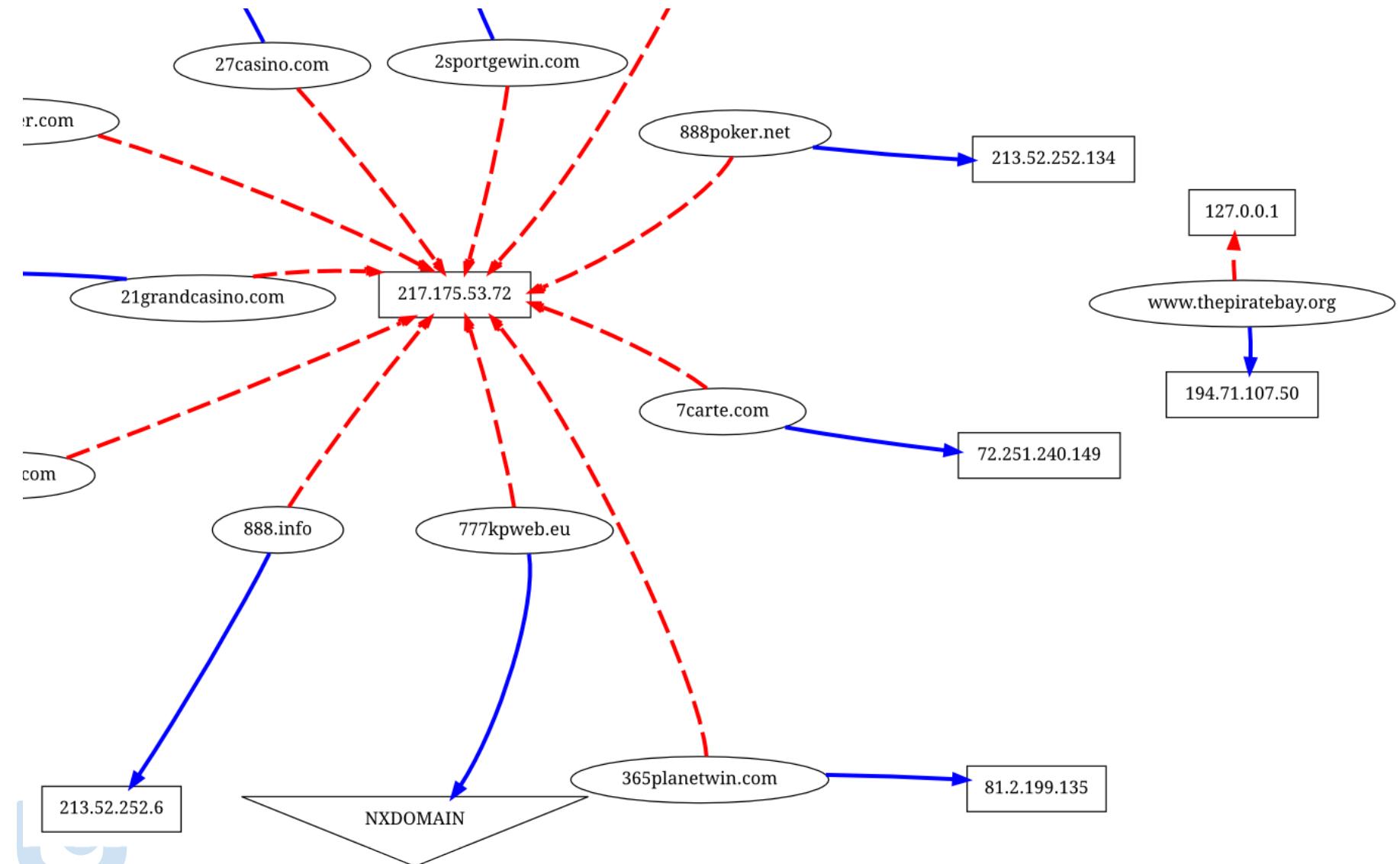
# Italy: gaming and betting websites

## bet365.com - DNS time analysis





# DNS hijacking in Italy: betting websites





# Internet Censorship is widespread

---

Countries may differ in

- motivations
- targets
- duration
- techniques

but great many\* of them censor the Internet

\*OpenNet Initiative <http://map.opennet.net>

Deibert, Ronald. *Access denied: The practice and policy of global Internet filtering*. Mit Press, 2008.



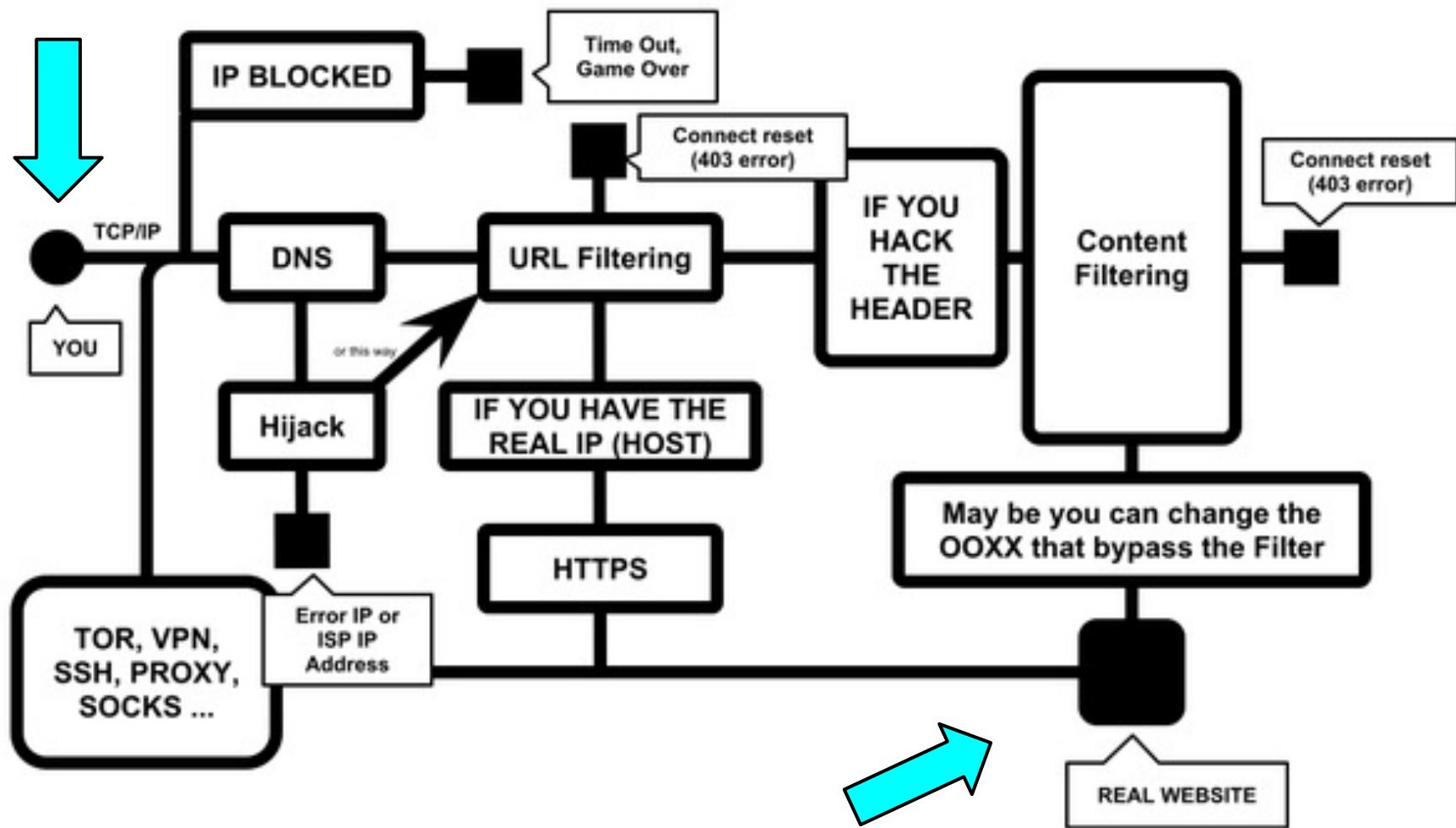
# UBICA control cycle



1. Collection of **targets**
2. **Scheduling** of evidence collection
3. **Evidence** collection by probes
4. **Evidence reporting** and data export
5. **Censorship tests**
6. **Update Targets and Scheduling**

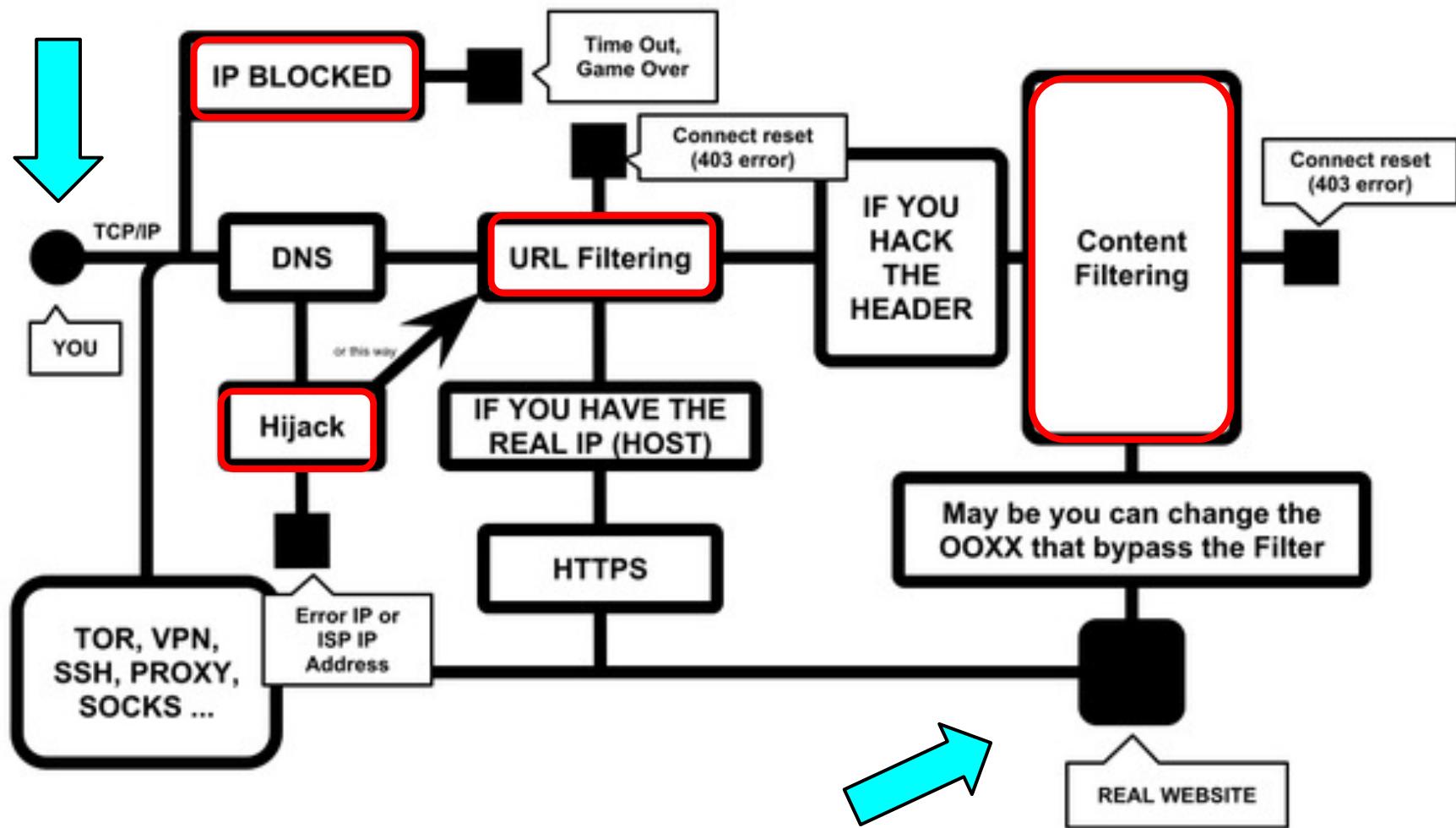


# Several vulnerable phases of communication





# Several techniques to *enforce* censorship





# ... and methods to *circumvent* censorship

