



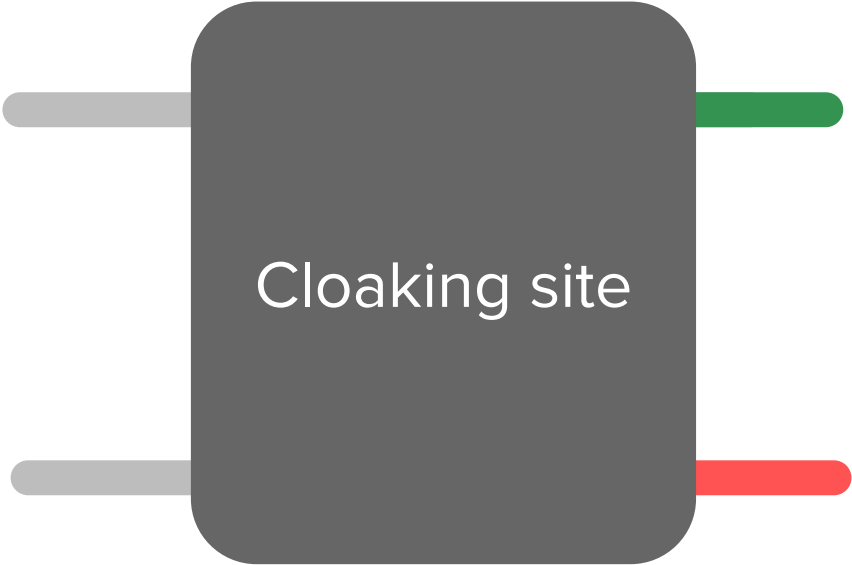
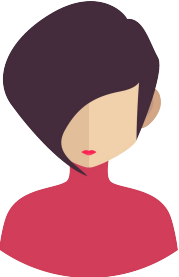
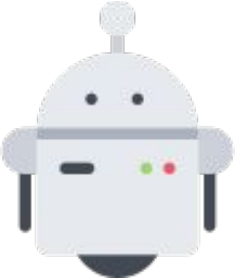
Cloak of Visibility: Detecting When Machines Browse a Different Web

Luca Invernizzi*, Kurt Thomas*, Alexandros Kapravelos[†],
Oxana Comanescu*, Jean-Michel Picod*, and Elie Bursztein*

* Google - Anti-fraud and abuse research

[†] North Carolina State University

Web cloaking



Web cloaking

Search

Effective for Search Engine Optimization

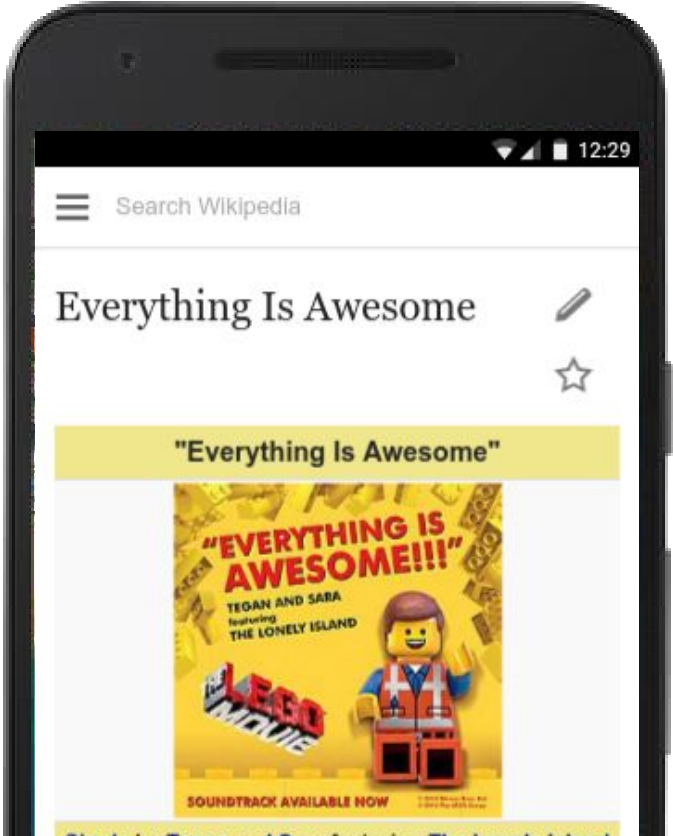
Ads

Effective to infringe policies

Malware

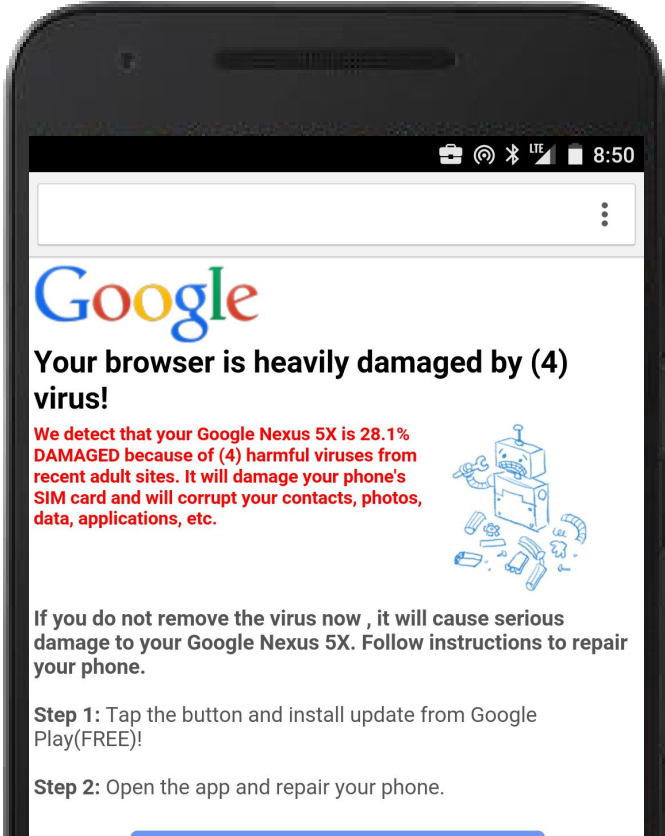
~~Effective to evade security crawlers~~

Responsive design vs cloaking



This is **not** cloaking.

Responsive design vs cloaking



This is **cloaking**.

Research goals



Keep up with
arms race



Identify
trends



Explore
alternatives

Blackmarket Investigation

Can't go wrong with
Cloaky McCloakyFace.

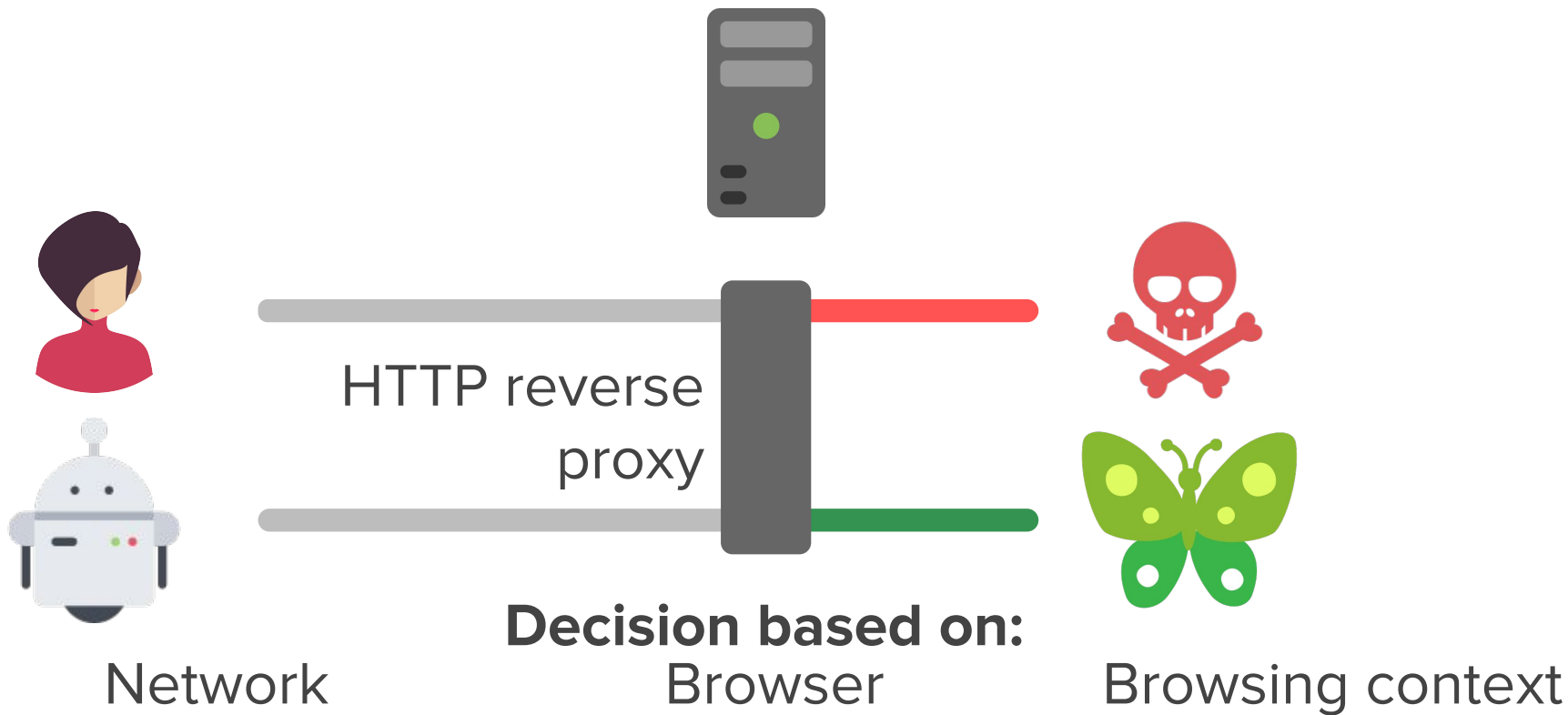


I swear by
NowYouSeeMe!

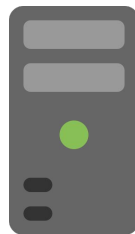
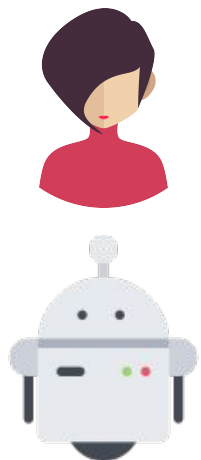


Acquired
Top 10
Cloaking software samples

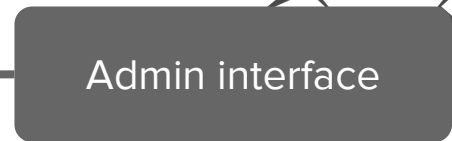
\$3500+ cloaking software



\$3500+ cloaking software



Configures



Generates



Admin interface

Step 1: Build CSV File	Build CSV keyword database	Build CSV File 
-------------------------------	-----------------------------------	--

Step 2: Get URLs	Select sources for fillertext	Get URLs 
-------------------------	--------------------------------------	--

Step 3: Get Content	Get fillertext	Get Content 
----------------------------	-----------------------	---

Step 4: Create Site	Generate pages	Create Site 
----------------------------	-----------------------	---

Step 5: Check Setup	Check + Control	Check Setup 
----------------------------	------------------------	---

Tools

Process Center	Monitor and Stop Processes	Monitor Process 
-----------------------	-----------------------------------	---

Input

keywords => <http://money.site>

Features

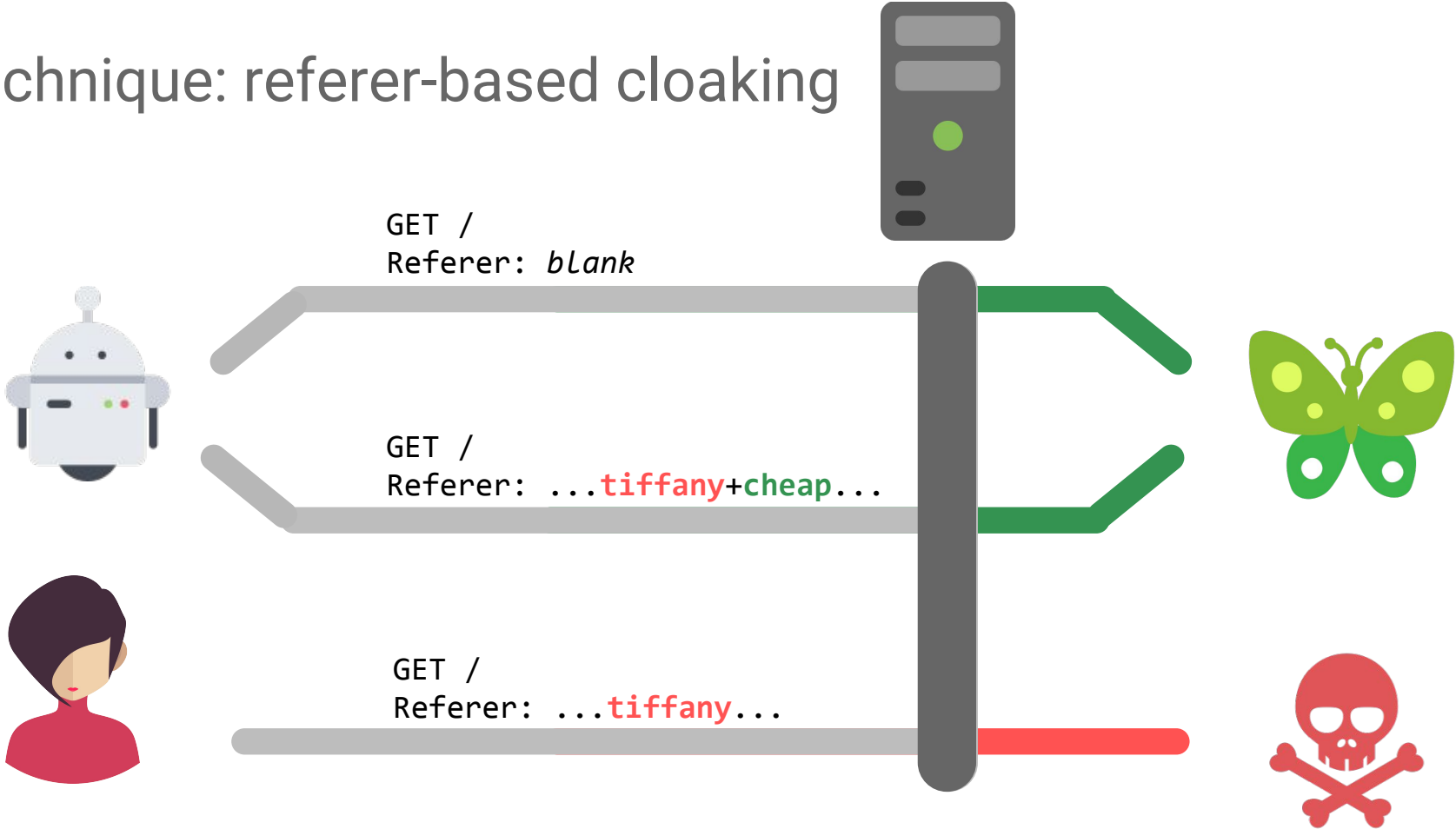
- Find similar sites through SERPs
- Content/Template spinning
- Drip-feeding

Added services

- Plagiarism detection
- SERP ranking

Cloaking techniques

Technique: referer-based cloaking



Technique: IP blacklisting

51m

Blacklisted IPs

30

Security companies

3

Proxy networks

983

Subnets

2

Hacking collectives

122

Entities: companies,
universities, registrars

Crowdsourced blacklist



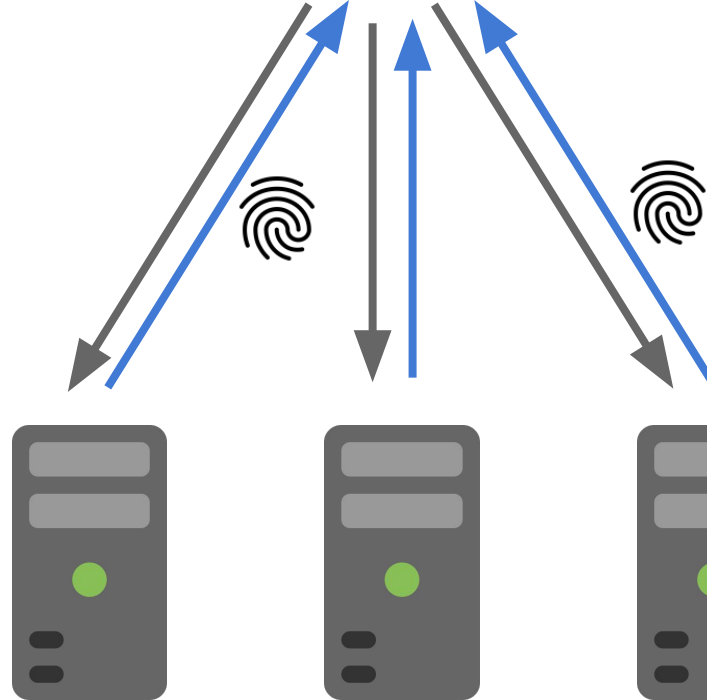
50k

Blacklisted IPs

\$350+

Subscription

Honeypot

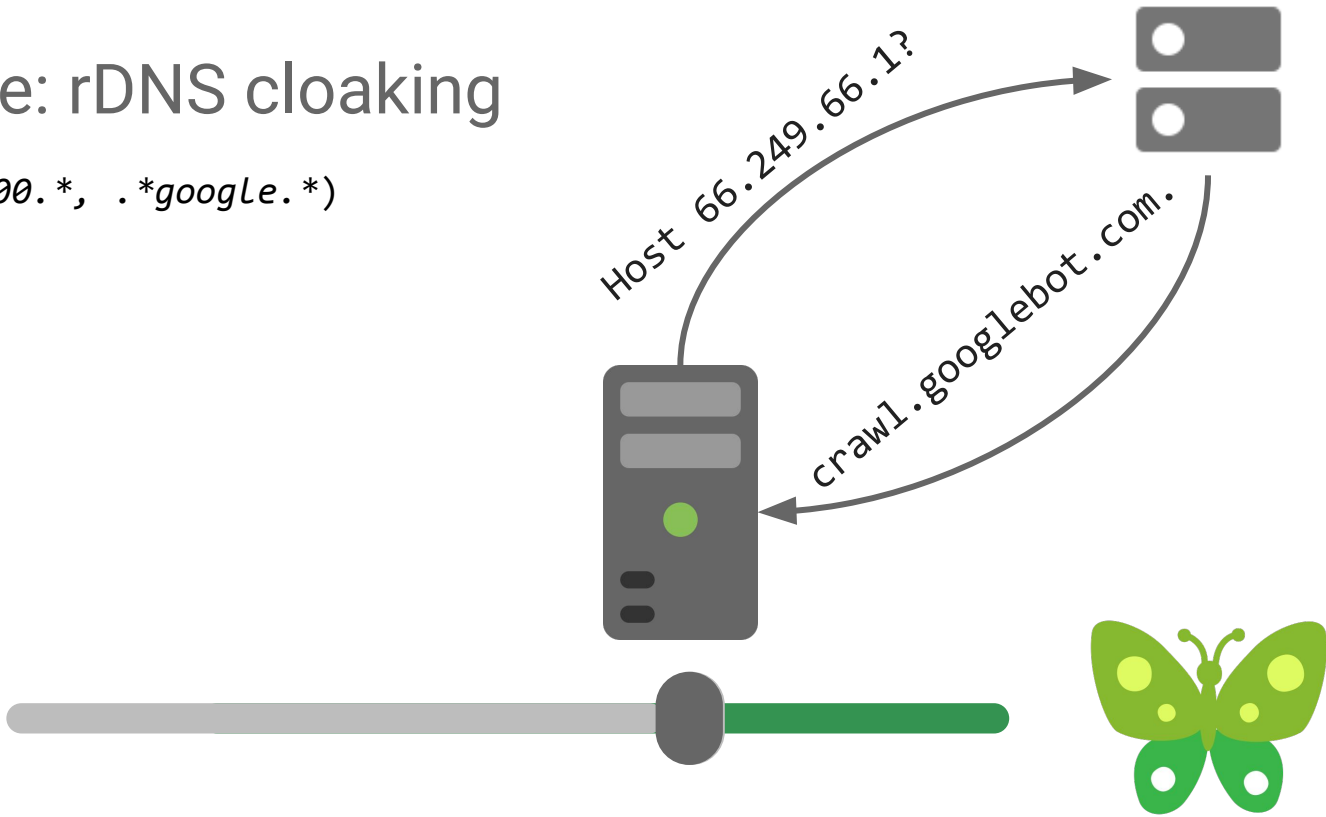


Technique: rDNS cloaking

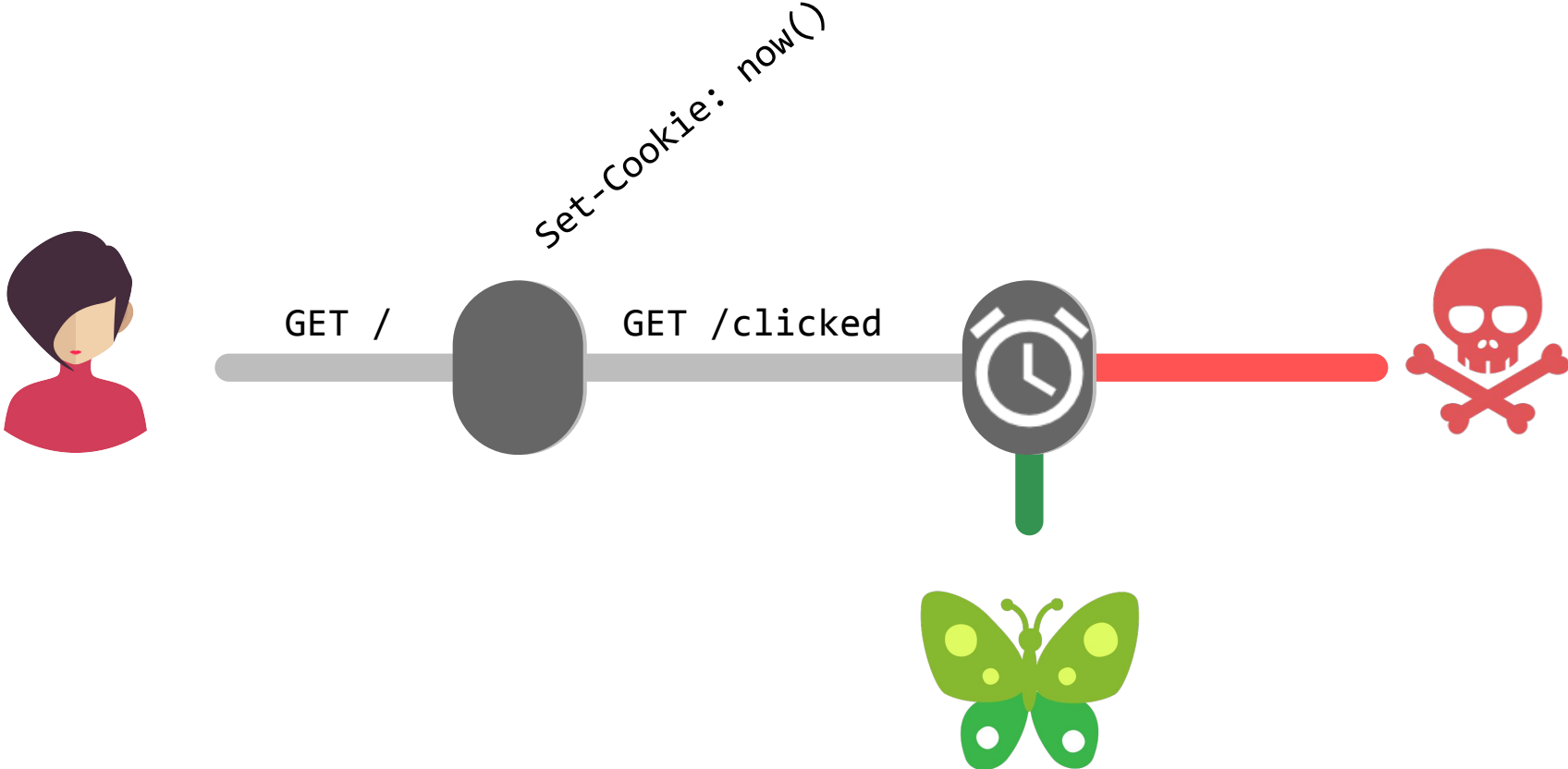
Google (*.1e100.*, *.google.*)
Microsoft
Yahoo
Yandex
Baidu
Ask
Rambler
DirectHit
Theoma



66.249.66.1



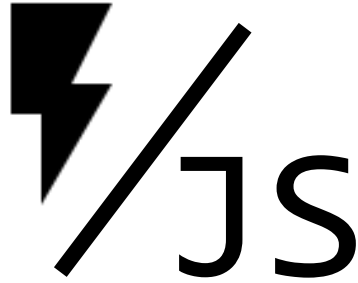
Technique: browsing pattern cloaking



More techniques



Geolocation:
country, city,
carrier level.

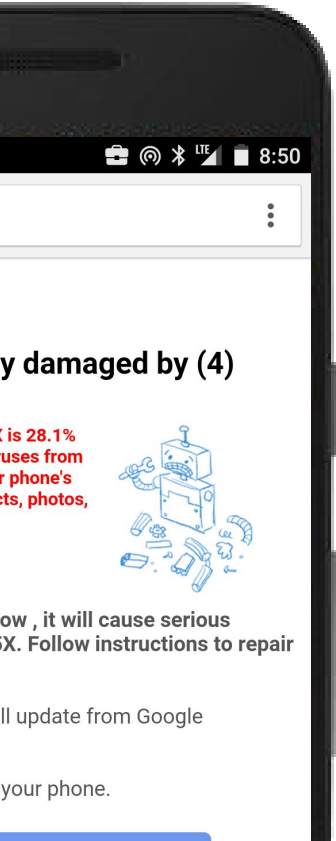


Flash/JS
support &
fingerprints



User-Agent

Prevalence and dominant techniques



Is this cloaking?
How do they cloak?



Browser farm



Pretend Google bots

User-Agent: GoogleBot
Referer: blank
Google IP



Simple honey clients

User-Agent: Chrome
Referer: blank, or simple
Cloud provider IPs



Realistic honey clients

User-Agent: Chrome
Referer: context-aware
Residential and mobile IPs

Features



HTML



Image

Syntactic

Content similarity

Screenshot similarity

Semantic

Topic similarity

Screenshot topic similarity

Classification

82%

True positive rate

.9%

False positive rate

95k labeled samples

75k legitimate websites (Alexa) + 20k cloaked storefronts

Prevalence

4.9%

Cloaking pages in
Google AdWords,
for health and
software ads.

11.7%

Cloaking pages in
Google Search, for
luxury storefronts
keywords.

Traditional techniques: only IP, Referrer, and User-Agent

Search: 1 out of 5

Ads: 1 out of 4

Current techniques: JavaScript support

Search: Half
Ads: 1 out of 4

Current techniques: wait for click

Search: 1 out of 10

Ads: 1 out of 5

Delivery: same-page cloaking

Search: 1 out of 5
Ads: **2 out of 3**

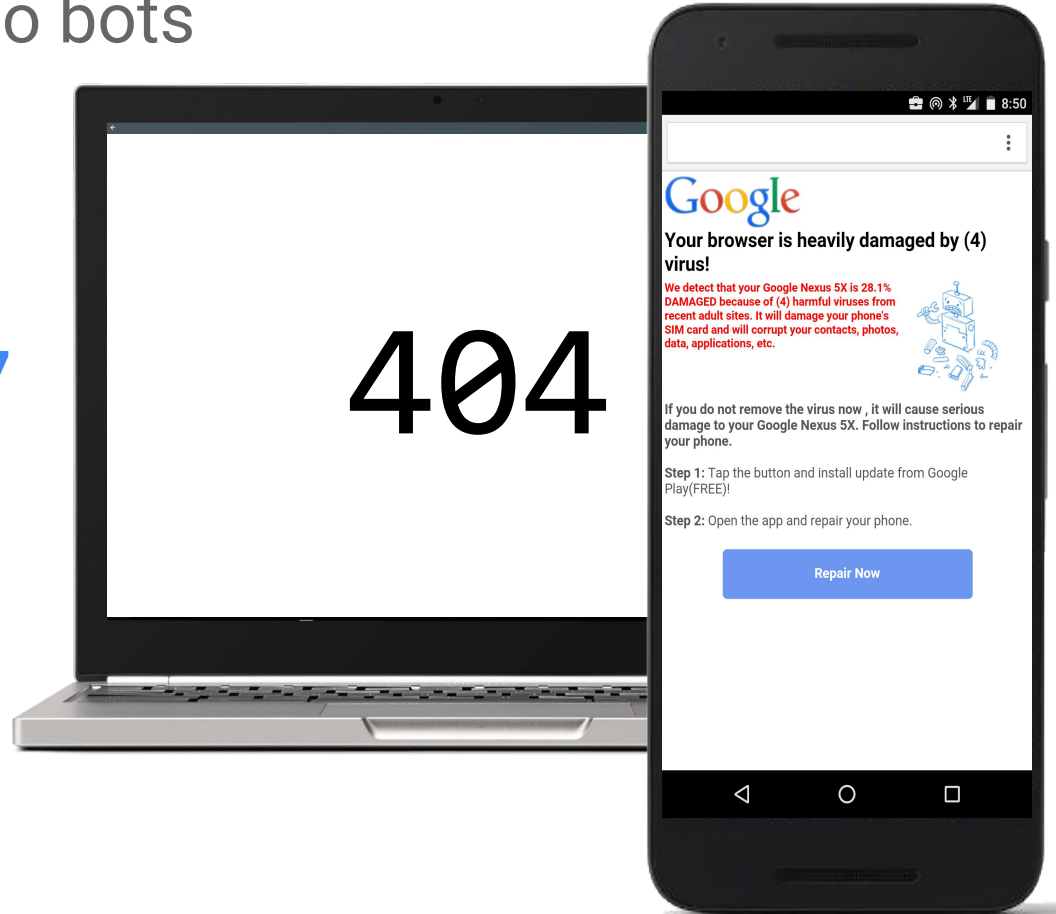


Uncloaked

Cloaked

Delivery: 40x/50x errors to bots

Search: 1 out of 7
Ads: 1 out of 8



Future: client-side detection



Search/Ads links add a parameter with the **topics** found by the bot.



Check that the page matches the **same topics**.

Takeaways



Prevalence

5% of ads and 12% of search results for cloaking-prone keywords cloak.



Techniques

IP/User-Agent/Referer only gets 1/3 of cloaking.



Moving forward

Client side, semantic features needed for hard cases.



Thank you!

Luca Invernizzi
invernizzi@google.com