# Understanding Security Notifications At Scale

**Frank Li** - University of California Berkeley Zakir Durumeric - University of Michigan Michael Bailey - University of Illinois Urbana-Champaign Vern Paxson - University of California Berkeley

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However, those who find security issues are often not the same party as those who need the information.

Security notifications serve as a bridge

There has been little academic study of security notifications

#### Our Research Agenda

Better understand the nature of these notifications and the most effective approach to conducting them

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Today:

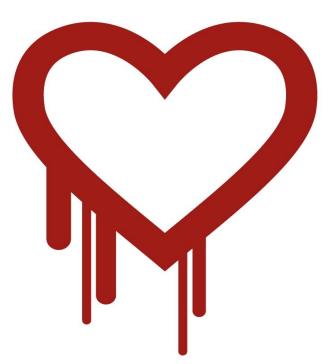
- Share our experiences and analysis from conducting several notification efforts
- Hear from you about your experiences and lessons learned

#### Experiences

We have measured and analyzed notification sent for:

- Heartbleed bug
- Security misconfigurations and vulnerabilities
- Compromised websites

The Heartbleed Bug





#### What is Heartbleed?

• Allows access to sensitive data in memory, such as passwords, secret keys, etc., on OpenSSL servers

• Fix: Update to patched version, or disable TLS "Heartbeats"

#### The Matter of Heartbleed

\*Zakir Durumeric<sup>1</sup>, James Kasten<sup>1</sup>, David Adrian<sup>1</sup>, J. Alex Halderman<sup>1</sup>, Michael Bailey<sup>1,2</sup>

<sup>1</sup> University of Michigan <sup>2</sup> University of Illinois, Urbana Champaign

{zakir, jdkasten, davadria, jhalderm}@umich.edu, mdbailey@illinois.edu

ABSTRACT

The Heartbleed vulnerability took the Internet by surprise in April 2014. The vulnerability, one of the most consequential since the advent of the commercial Internet allowed attackers to remotely read

\*Frank Li<sup>3</sup>, Nicholas Weaver<sup>3,4</sup>, Johanna Amann<sup>4</sup>, Jethro Beekman<sup>3</sup>, Mathias Payer<sup>3,5</sup>, Vern Paxson<sup>3,4</sup> <sup>3</sup> EECS, University of California, Berkeley <sup>4</sup> International Computer Science Institute <sup>5</sup> Purdue University

{frankli, nweaver, jbeekman, vern}@cs.berkeley.edu, johanna@icir.org, mpayer@purdue.edu

the Alexa Top 100. Two days after disclosure, we observed that 11% of HTTPS sites in the Alexa Top 1 Million remained vulnerable, as did 6% of all HTTPS servers in the public IPv4 address space. We find that vulnerable hosts were not randomly distributed, with more

#### ACM Internet Measurement Conference 2014

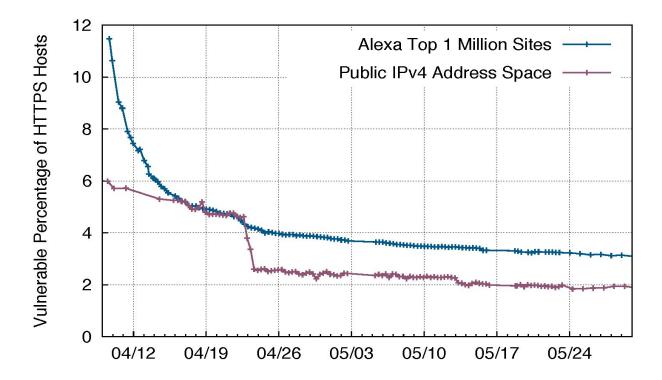
#### **Detecting Vulnerable Hosts**

Used the ZMap scanner to scan HTTPS servers

Ethical consideration: probe packet *does not* exploit Heartbleed or read any data from memory



#### **Patch Rates**



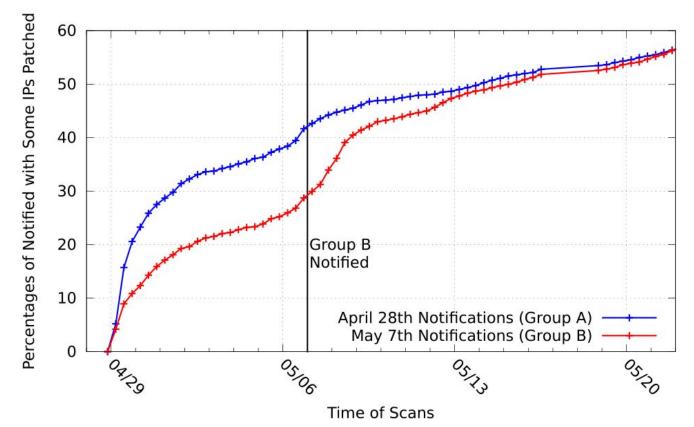
#### **Notification Effort**

• April 24: Grabbed 4646 unique contact emails from WHOIS lookups for ~250k still-vulnerable IPs

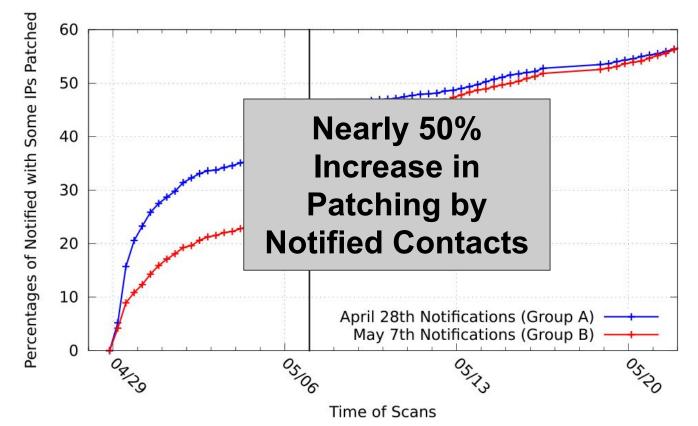
• Randomly selected half to notify via email on April 28th, the other half notified on May 7th

• Scanned every 8 hours to track behavior

#### **Notification Groups Patching Rates**



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- Of human contacts:
  - 92% positive
  - 5% neutral
  - 3% negative

## **First Round Responses**

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- 11.1% human responses, 40.2% automated, and 48.7% delivery failures
- Automated messages
  - Confirmations
  - Tickets
  - Trackers (many incorrectly configured)

#### Lessons Learned

• Notifications *can* be effective at promoting patching.

• Mass notifications are doable and can be well-received.

#### New Questions...

• How effective are notifications in other scenarios?

• How do we find reliable contacts for more hosts?

• What are best practices for effective notifications?

#### You've Got Vulnerability: Exploring Effective Vulnerability Notifications

Frank Li<sup>½</sup>Zakir Durumeric<sup>⊕</sup>Jakub Czyz<sup>⊕</sup>Mohammad Karami<sup>≜</sup>Michael Bailey<sup>⊕</sup>Damon McCoy<sup>∱</sup>Stefan Savage<sup>®</sup>Vern Paxson<sup>½↓</sup>

<sup>\*</sup>University of California Berkeley <sup>©</sup>University of Michigan <sup>\*</sup>George Mason University
<sup>\*</sup>University of Illinois Urbana-Champaign <sup>\*</sup>New York University
<sup>®</sup>University of California San Diego <sup>®</sup>International Computer Science Institute

#### Abstract

The security community has made tremendous strides in developing techniques to detect various security issues at scale. Internet-wide scanning, network monitoring, and

#### 1 Introduction

Maintaining a secure Internet ecosystem requires continual discovery and remediation of software vulnerabilities and critical misconfigurations, of which inves-

#### **USENIX Security 2016**

Notifications for 3 classes of misconfigurations:

- Publicly Accessible Industrial Control Systems (ICS)
- DDoS Amplifiers
- Misconfigured IPv6 Firewall Policies

Publicly Accessible Industrial Control Systems (ICS):

- Remotely control physical infrastructure, but lacks important security features
- Detection/tracking: Protocol-specific fingerprints with ZMap
- *Fix*: Firewall or remove from public Internet



**DDoS Amplifiers** 

- Protocols abused for DDoS attacks
- Detection: Monitoring DDoS attacks against a network
- *Tracking*: Custom protocol specific probing
- *Fix*: Firewall or disable protocols or abused functions



Misconfigured IPv6 Firewall Policies

- v6-only services may indicate firewall misconfiguration
- Detection/tracking: Large-scale probing with CAIDA's Scamper tool
- *Fix*: Correct firewall policies, or disabling applications



#### **Experiment Variables**

• Who to contact?

WHOIS contact, our local US-CERT, host's local CERT

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• What to say to server admins (WHOIS contacts)?

Terse message

Terse message with a link to detailed info site

Verbose message with details

## Notification Methodology

• Found abuse contacts via WHOIS

• Grouped hosts by their abuse contacts

 Randomly assigned contacts to control vs CERT vs WHOIS groups

#### **Experiment Groups**

-

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Group	ICS	IPv6	Ampl.
Control	657	3,527	1,484
National CERTs	174	650	379
US-CERT	493	578	1,128
WHOIS: English Terse	413	633	777
WHOIS: English Terse w/ Link	413	633	777
WHOIS: English Verbose	413	632	777

#### Results

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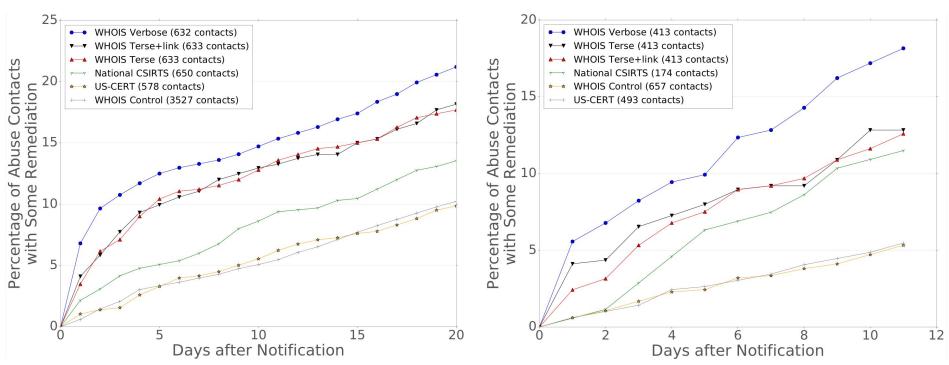
Our notifications had no effect on DDoS Amplifiers...

- Prior notification efforts
- Population bias

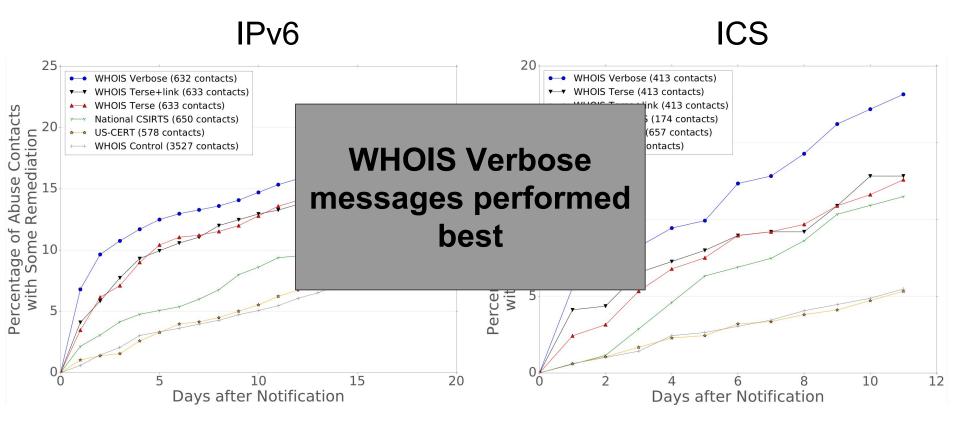
#### **Remediation Rates**

IPv6

ICS

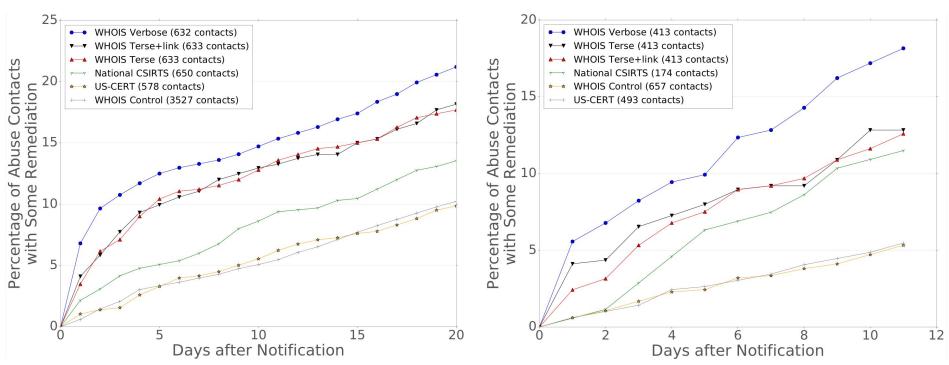


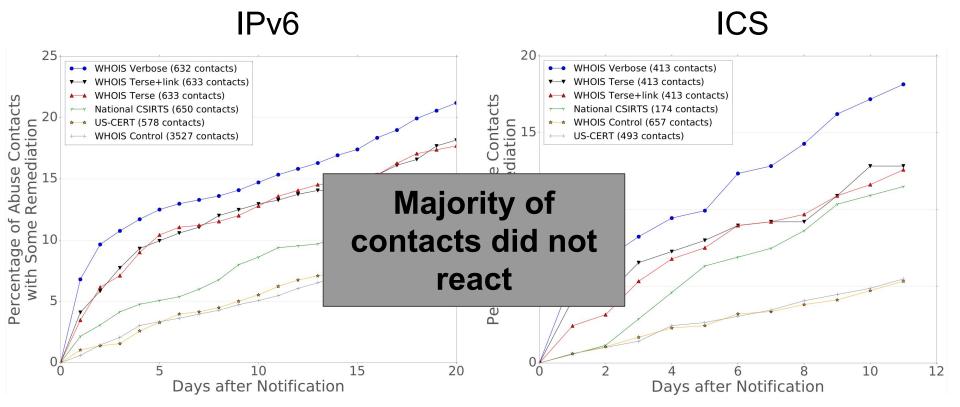
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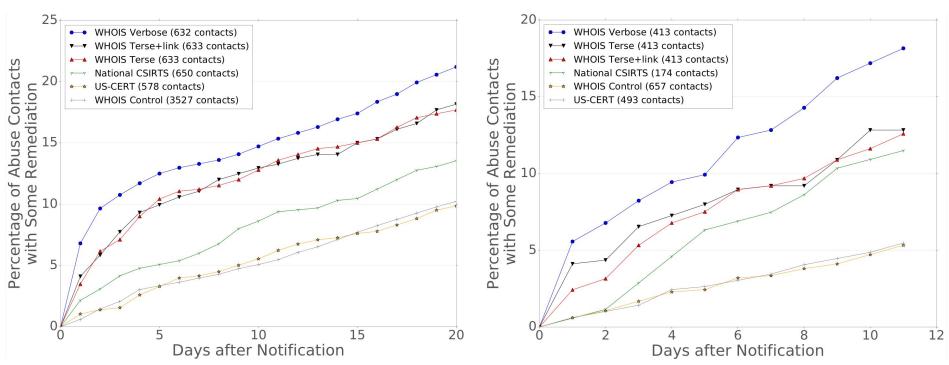
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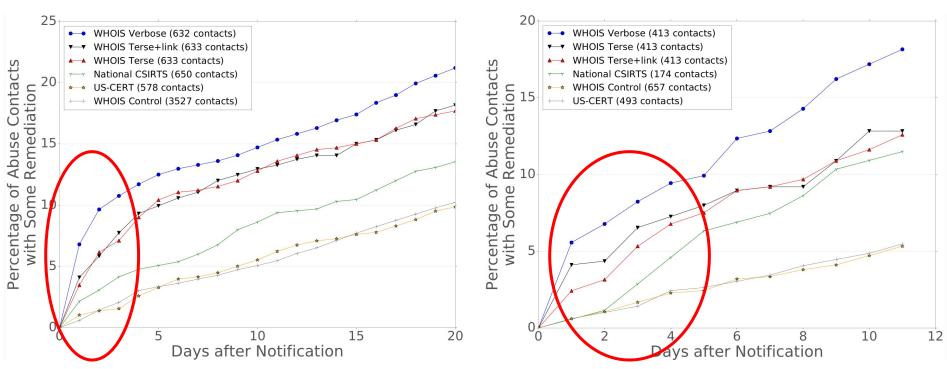
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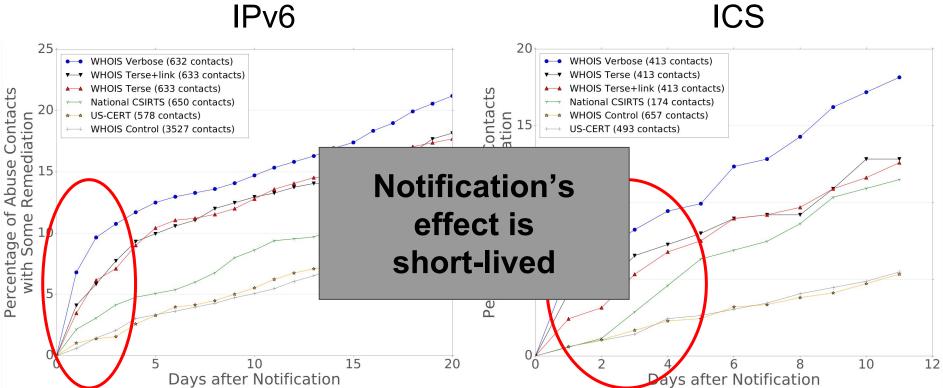
ICS



IPv6

ICS





#### Staying Power of Notification's Effect

IPv6 ICS WHOIS Verbose (632 contacts) Proportion WHOIS Verbose (413 contacts) Proportion WHOIS Terse+link (633 contacts) WHOIS Terse (413 contacts) WHOIS Terse (633 contacts) WHOIS Terse+link (413 contacts) 6 5 National CSIRTS (650 contacts) WHOIS Control (657 contacts) US-CERT (578 contacts) US-CERT (493 contacts) \* \* Previous Day WHOIS Control (3527 contacts) National CSIRTS (174 contacts) Day Remediation Remediation Previous 3 from from in the the 2 2 .⊆ Change Change 1 1 0, 0+ 10 15 20 5 2 Δ 6

Days after Notification

10

Days after Notification

12

#### **Notification Response**

- Received 685 emails
- 13.6% were human, 77.4% were automated responses, and 9.1% were bounces

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- Of human responses:
  - $\circ$  77% were positive
  - 19% neutral
  - 4% negative

## Insights

• Verbose messages to WHOIS contacts can be relatively effective.

• However, overall effectiveness is limited.

• Notification's effect is short-lived, partly due to lack of reliable points of contact.

#### Another context: Hijacked Websites

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#### World Wide Web Conference (WWW) 2016

#### Remedying Web Hijacking: Notification Effectiveness and Webmaster Comprehension

Frank Li<sup>†</sup> Grant Ho<sup>†</sup> Eric Kuan<sup>°</sup> Yuan Niu<sup>°</sup> Lucas Ballard<sup>°</sup> Kurt Thomas<sup>°</sup> Elie Bursztein<sup>°</sup> Vern Paxson<sup>†\*</sup> {frankli, grantho, vern}@cs.berkeley.edu {erickuan, niu, lucasballard, kurtthomas, elieb}@google.com <sup>†</sup>University of California, Berkeley <sup>°</sup>Google Inc. <sup>\*</sup>International Computer Science Institute

#### ABSTRACT

As miscreants routinely hijack thousands of vulnerable web servers weekly for cheap hosting and traffic acquisition, security services have turned to notifications both to alert webmasters of ongoing incious URLs [16,23]. While effective at reducing traffic to malicious pages, this user-centric prioritization ignores long-term webmaster cleanup, relegating infected pages to a dark corner of the Internet until site operators notice and take action.

#### Websites are constantly hijacked...

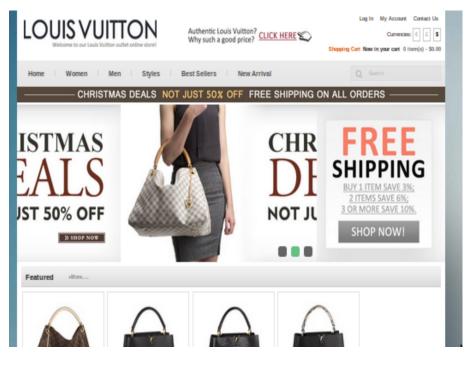
sanfranciscobaycoffee.com



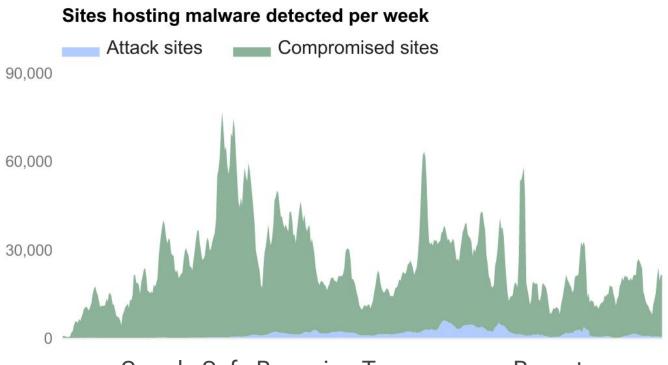
#### San Francisco Bay Coffee

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#### Websites are constantly hijacked...



Google Safe Browsing Transparency Report

#### Compromised sites lead to...

- Drive-by downloads
- Cloaked redirections
- Scams
- Phishing
- Defacements

What works effectively for notifying webmasters?

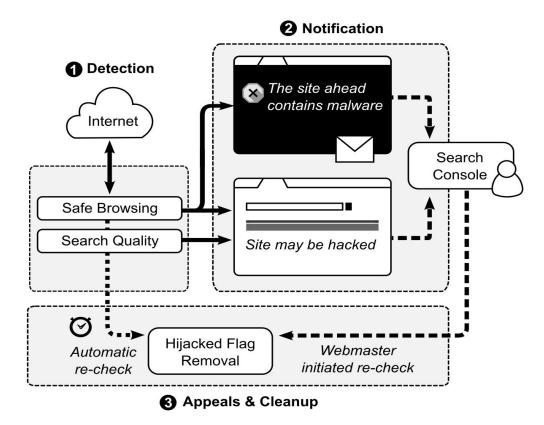
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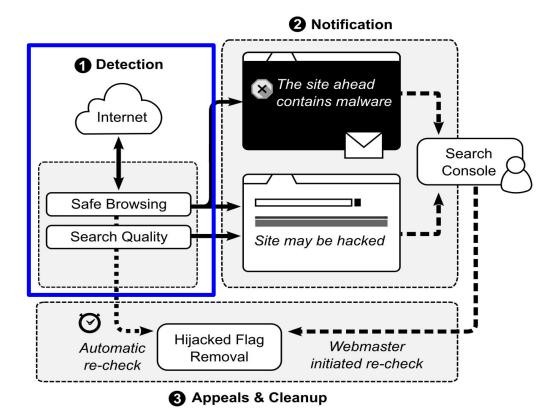
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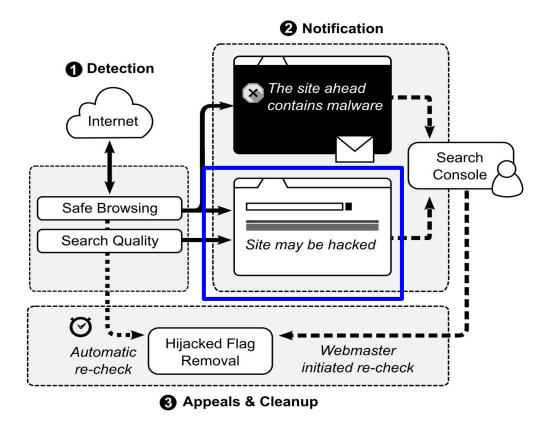
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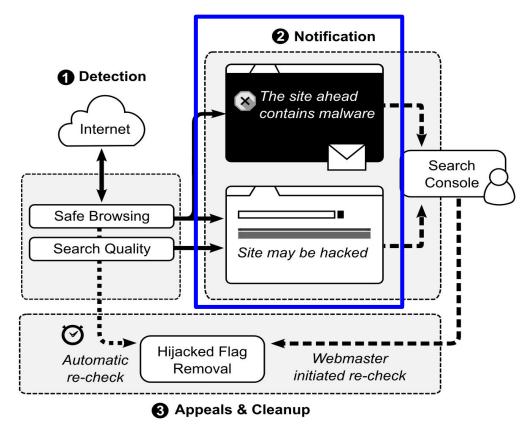
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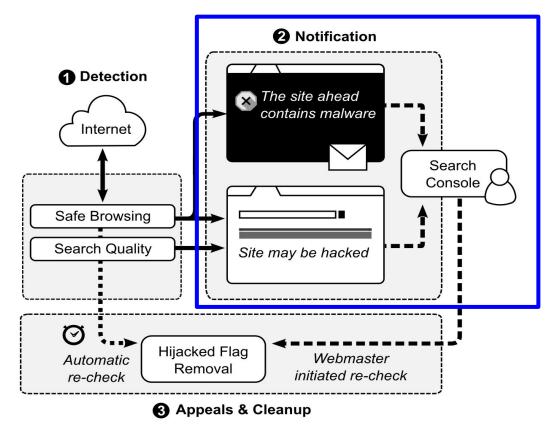
How well are webmasters able to comprehend the remediation process?

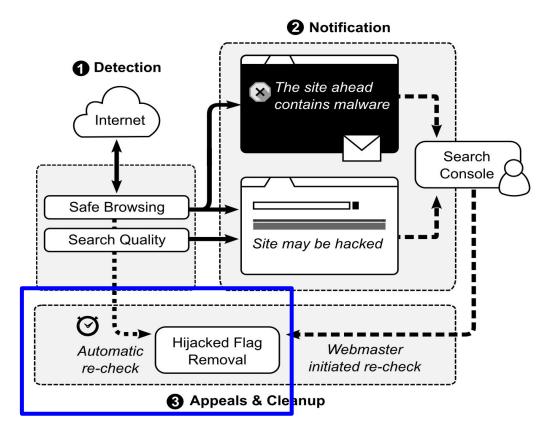


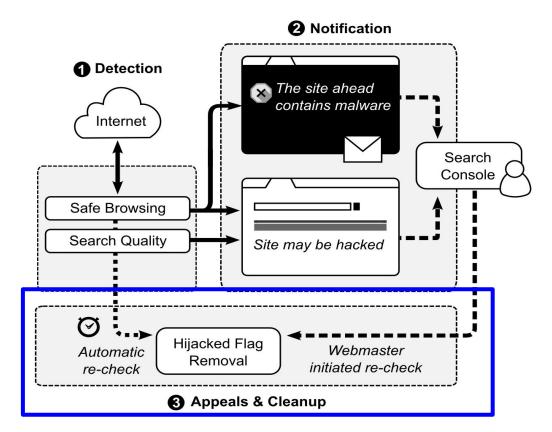


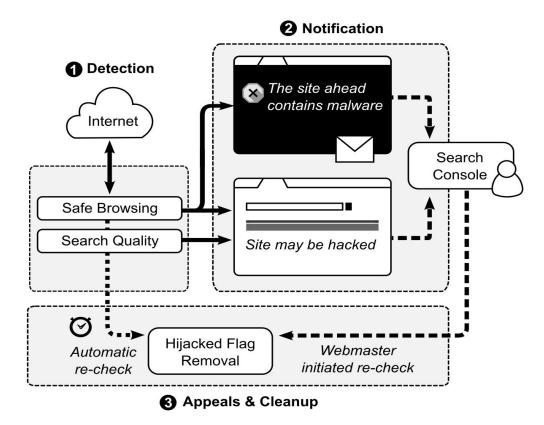








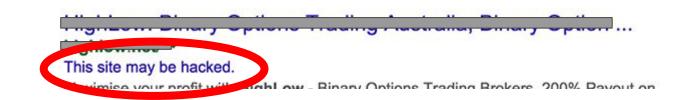




#### **Data Sources**

- 1. Compromised *incidents* detected by Safe Browsing (drive-bys) and Search Quality (blackhat SEO)
- 2. Search Console + WHOIS alerts sent for hijacked sites
- 3. Webmaster appeals (requests for re-check)

Dataset	Safe Browsing	Search Quality
Time frame	7/15/14–6/1/15	7/15/14–6/1/15
Hijacked websites	313,190	266,742
Hijacking incidents	336,122	424,813
Search console alerts	51,426	88,392
WHOIS emails	336,122	0
Webmaster appeals	124,370	48,262



#### Search Warning Only (Search Quality sites):

# 43.4%



#### Browser Warning + WHOIS alert (Safe Browsing sites):

#### 54.6%

#### Malware Detected

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- www.\_\_\_\_.com/
- www.\_\_\_\_.com/downloads/download.htm
- www.\_\_\_\_.com/downloads/download.htm

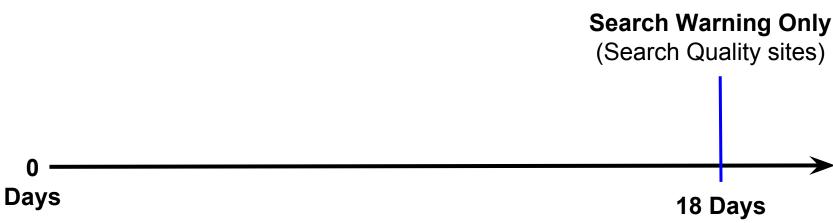
If your site is serving malware, a hacker has taken control of your site's content. Your users are now vulnerable to phishing, viruses, and spyware. Search engines and browsers may direct users away from your site.

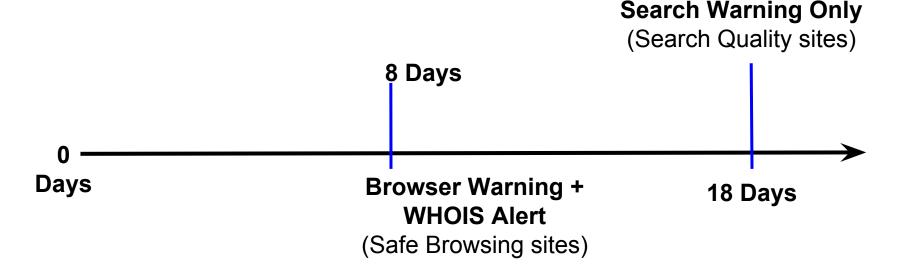
Action should be taken immediately, see Google Webmaster Tools or the help link below to fix this problem.

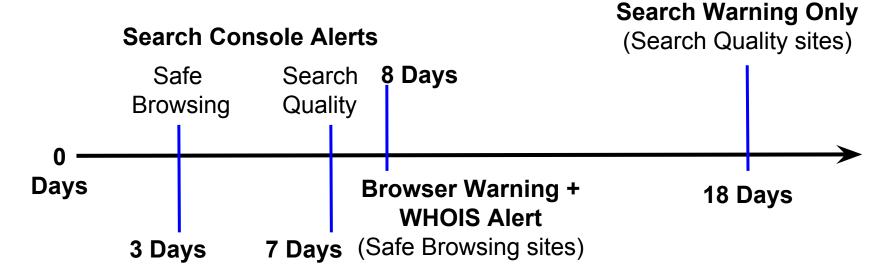
#### **Search Console Alert:**

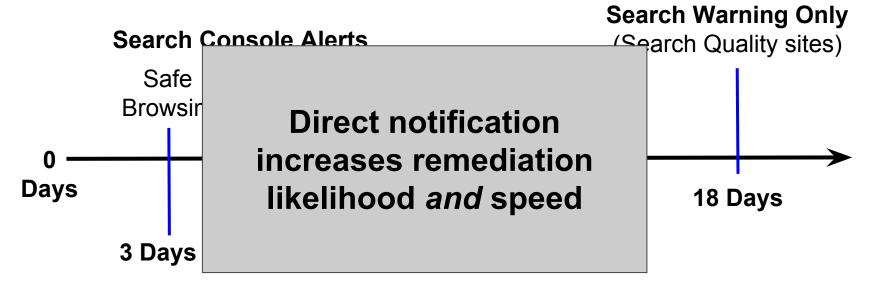
82.4% - Safe Browsing 76.8% - Search Quality



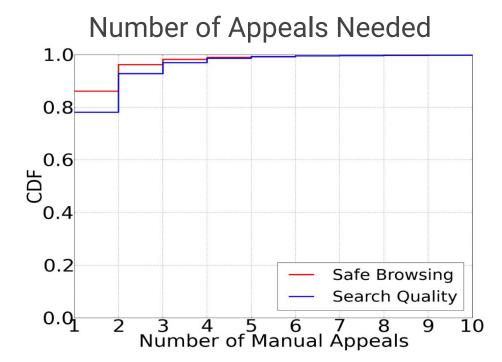




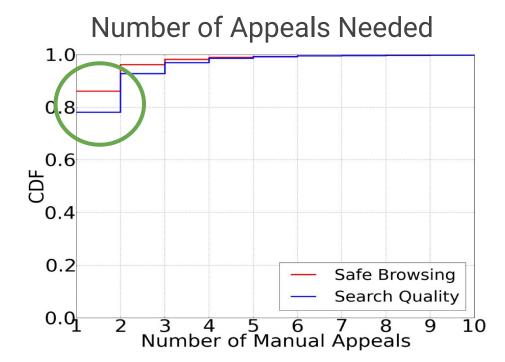




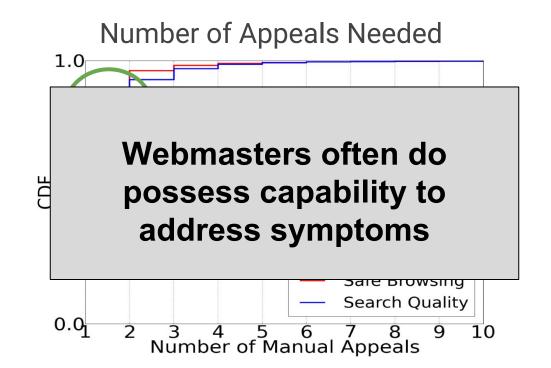
30.7% of Safe Browsing, 11.3% of Search Quality webmasters appeal

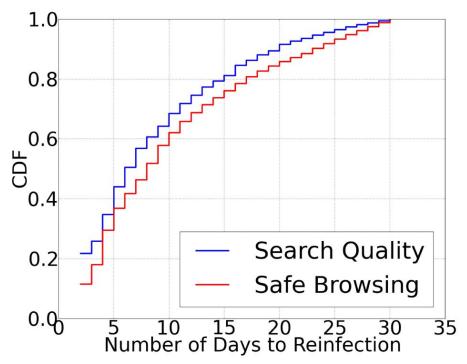


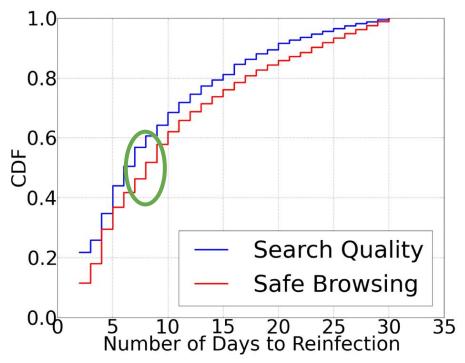
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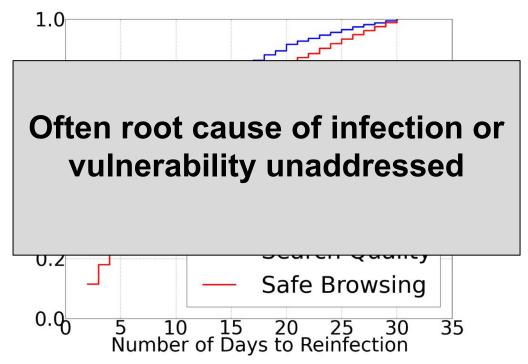


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# Insights

• Direct notifications help improve remediation.

• Webmasters can remedy hijacking symptoms.

• However, root causes are often unaddressed.



• Increased direct communication coverage

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- Further investigation of notification factors

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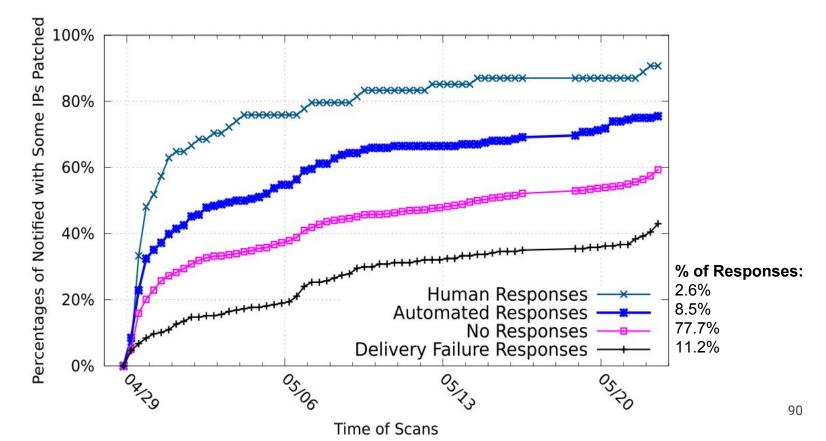
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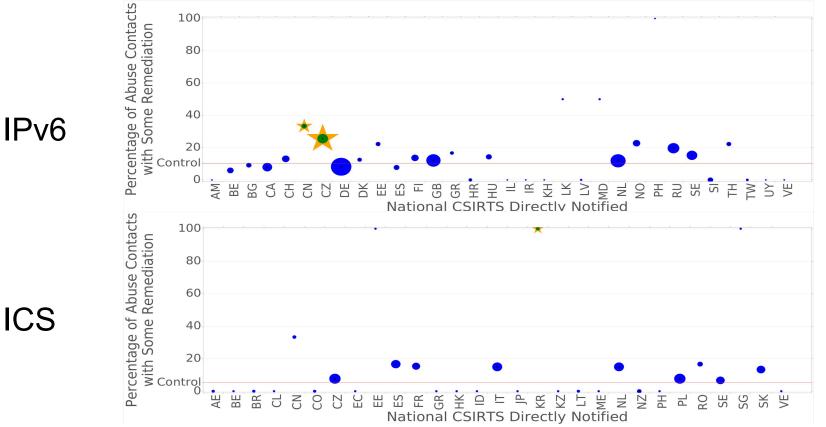


### **Extra Slides**

### **Notification Responses + Reactions**



## **Remediation Rates for CERTs**



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