# Examining the Impact of Website Take-down on Phishing

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APWG eCrime Researchers Summit Oct. 4, 2007, Pittsburgh, PA, USA



#### Outline

- Mechanics of phishing
- Rock-phish attacks
- Who's winning the phishing arm's race?
- Comparing performance of defenders





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#### Technical requirements for phishing attacks

- Attackers send out spam impersonating banks with link to fake website
- Hosting options for fake website
  - Free webspace
     (http://www.bankname.freespacesitename.com/signin/)
  - Compromised machine (http://www.example.com/~user/images/www.bankname.com/)
  - Registered domain (bankname-variant.com) which then points to free webspace or compromised machine
- Personal detail recovery
  - Completed forms forwarded to a webmail address
  - Stored in a text file on the spoof website





# Defending against phishing attacks

- Proactive measures
  - Web browser mechanisms to detect fake sites, multi-factor authentication procedures, restricted top-level domains, etc.
  - Not the focus of this paper
- Reactive measures
  - Banks tally phishing URLs
  - Reported phishing URLs are added to a blacklist, which is disseminated via anti-phishing toolbars
  - Banks send take-down requests to the free webspace operator or ISP of compromised machine
  - If a malicious domain has been registered, banks ask the domain name registrar to suspend the offending domain



#### Data collection methodology

- Phishing website availability
  - Several organizations collate phishing reports; we selected reports from PhishTank
  - PhishTank DB records phishing URLs and relies on volunteers to confirm whether a site is wicked
  - 33710 PhishTank reports overs 8 weeks early 2007
  - Unfortunately, PhishTank does not indicate exactly when sites are removed and is regularly misled when sites are not disabled, but rather replaced with generic pages
  - We constructed our own testing system to continuously query sites until they stop responding or change
- Caveats to our data collection
  - Sites removed before appearing in PhishTank are ignored
  - We do not follow web-page redirectors





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#### Rock-phish attacks are different!

- 'Rock-phish' gang operate different to 'ordinary' phishing sites
  - Purchase several innocuous-sounding domains (e.g., lof80.info)
  - Send out phishing email with URL http://www.volksbank.de.netw.oid3614061.lof80.info/vr
  - Gang-hosted DNS server resolves domain to IP address of one of several compromised machines
  - Compromised machines run a proxy to a back-end server
  - Server loaded with many fake websites (around 20), all of which can be accessed from any domain or compromised machine
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# Rock-phish attacks (cont'd.)

- Rock-phish strategy is more resilient to failure
  - Dynamic pool of domains maps to another pool of IP addresses
- Also increase confusion by splitting the attack components over disjoint authorities
  - Registrars see non-bank domains
  - Compromised machine owners don't see bank webpages
- Wildcard DNS confuses phishing-report collators
  - 18 680 PhishTank reports during 8 week sample (52.6% of all reports)
  - Reduces to 421 unique domains

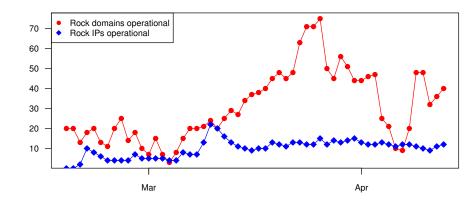


# 'Fast-flux' phishing domains

- Rock-phish gang's strategy is evolving fast
- In a fast-flux variant, domains resolve to a set of 5 IP addresses for a short time, then abandon them for another 5
- Burn through 400 IP addresses per week, but the upside (for the attacker) is that machine take-down becomes impractical
- Fast-flux strategy demonstrates just how cheap compromised machines are

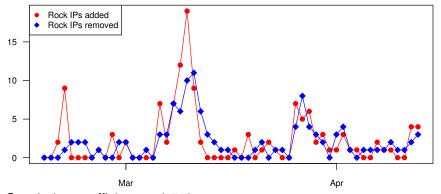


# Rock-phish site activity per day





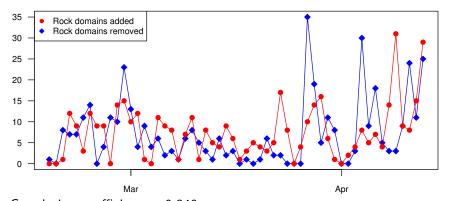
# New and removed rock-phish IPs per day



Correlation coefficient r: 0.740 Synchronized  $\implies$  automated replenishment



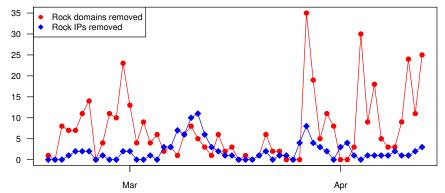
#### New and removed rock-phish domains per day



Correlation coefficient r: 0.340Unsynchronized  $\implies$  manual replenishment



# Rock-phish domain and IP removal per day



Correlation coefficient r: 0.142 Unsynchronized  $\implies$  uncoordinated response



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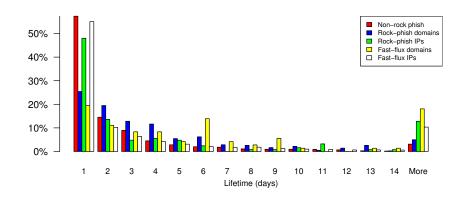


# Phishing-site lifetimes

		Lifetime (hours)		
	Sites	Mean	Median	
Non-rock	1 695	61.69	19.52	
Rock domains	421	94.68	55.14	
Rock IPs	125	171.8	25.53	
Fast-flux domains	57	196.2	111.0	
Fast-flux IPs	4 287	138.6	18.01	

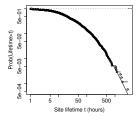


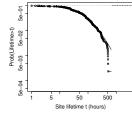
#### Histogram of phishing-site lifetimes

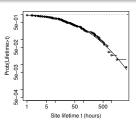




# And now for some curve fitting







	Lognormal				Kolmogorov-Smirnov	
	$\mu$	Std err.	$\sigma$	Std err.	D	p-value
Non-rock	3.011	0.03562	1.467	0.02518	0.03348	0.3781
Rock domains	3.922	0.05966	1.224	0.04219	0.06289	0.4374
Rock IPs	3.434	0.1689	1.888	0.1194	0.09078	0.6750

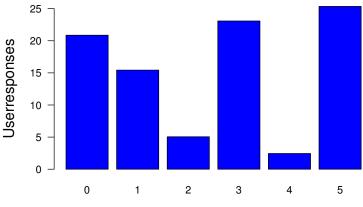


# User response to phishing

- Webalizer data
  - Web page usage statistics are sometimes set up by default in a world-readable state
  - Gives daily updates of which URLs are visited
  - We can view how many times a 'thank you' page is visited
  - We automatically checked all sites reported to PhishTank for the Webalizer package, revealing over 700 sites
- On-site text files
  - We retrieved around two dozen text files with completed user details from phishing sites
  - 200 of the 414 responses appeared legitimate



#### User responses to phishing sites over time



Days after phish reported





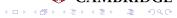
# Estimating the cost of phishing attacks

- Having measured how many phishing sites exist, how long they stick around, and how many people give away their details, we can estimate the losses due to phishing
- DISCLAIMER: Cost is the product of several fuzzy estimates
  - 1 438 banking phishing sites implies 9 347 p.a.
  - 2 61 hours on average implies 30 victims per site
  - Gartner estimate cost of identity theft to be \$572 per victim
  - 9347 \* 30 = 280410 victims \* \$572 = \$160.4 m



# Estimating the cost of phishing attacks (cont'd.)

- Estimate ignores rock-phish and fast-flux
  - Since rock-phish account for a large proportion of spam, we assume that they are at least as successful as ordinary phishing sites
  - Our final minimum cost estimate: \$320m p.a.
- Gartner estimates 3.5m people fall victim to identity theft at a cost of \$2Bn p.a.
  - Part of the disparity can be accounted for our conservative counting of sites
  - The difference can also be accounted for by other types of identity theft (theft of merchant databases, Trojan programs operating keyloggers, etc.)
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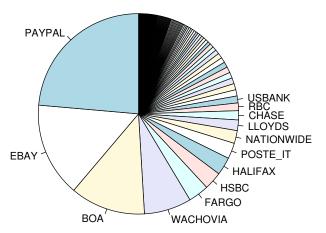


# Breaking down site lifetimes

- Phishing site lifetimes vary greatly, but can we make sense of the differences?
  - We have already established that the rock-phish gang are more effective than other attackers
  - Do some banks perform better than others?
  - Do some ISPs respond better than others?
  - Does the timing of attacks make any difference?
- Identifying exceptional performers (both good and bad) could help encourage improved response times



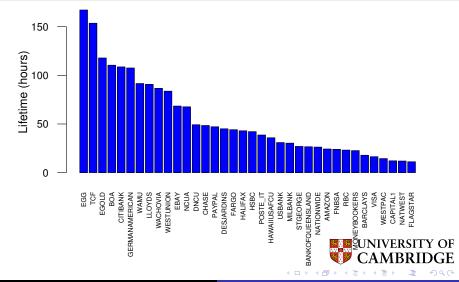
# Number of phishing sites per bank







# Phishing-site lifetimes per bank (only banks >= 5 sites)



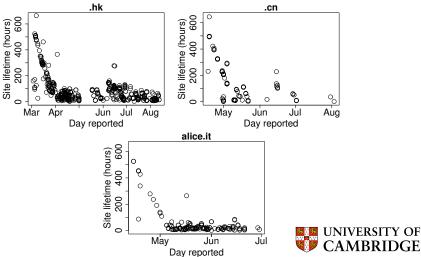
#### Take-down performance of free-website hosts

- Some phishing attacks are hosted on free webspace
- Overall, these sites are removed more quickly than sites hosted on compromised web servers
- But significant variation remains

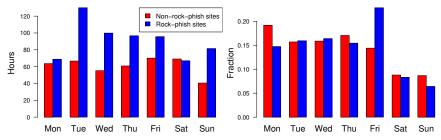
	Sites	Mean lifetime	Median lifetime
yahoo.com	174	23.79 hours	6.88 hours
doramail	155	32.78 hours	18.06 hours
pochta.ru	1 253	33.79 hours	16.83 hours
alice.it	159	52.43 hours	18.83 hours
by.ru	254	53.11 hours	38.16 hours



# 'Clued-up' effect on free host & registrar take-down times



# Do weekends adversely impact phishing site removal?



Phishing site lifetime by weekday (left) and number of reported phishing sites by weekday (right)



#### Discussion

- Collusion dividend for rock-phish gang
  - Cooperation has strengthened the gang: pooling resources to swap between machines while impersonating many banks per domain
  - Should have attracted more attention from the banks, but perhaps sum-of-efforts nature of the cooperation enables banks to free-ride off each other's vigilance
- Countermeasures
  - Direct tactics like reducing the # of compromised machines available or rate-limiting domain registration appears futile
  - Transparency could help: publishing take-down performance by bank, ISP and country may pressure improvements
  - Increasing awareness to targeted banks of rock-phish tactics may trigger cooperation
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#### Conclusions

- We have established that there is wide disparity in phishing site lifetimes
  - Long-tailed distribution of lifetimes implies that a few long-lived sites are undermining the effectiveness of take-down countermeasures
  - Some banks and ISPs are doing better than others
  - Disparity also suggests there is room for improvement through better monitoring
- We have also seen that attackers innovate: rock-phish sites outlive ordinary phishing sites through clever adaptations in strategy
- For more, see http://www.cl.cam.ac.uk/~twm29/ and
   http://www.lightbluetouchpaper.org/
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