The Ghosts of Banking Past Empirical Analysis of Closed Bank Websites

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Motivation

- The US has thousands of banks, and each year hundreds close through collapse or by acquisition
- While the FDIC has established an orderly process for winding down many bank assets after closure, the websites are often forgotten
- Customers may still try to visit websites after banks have closed, which could lead to confusion
- We set out to measure how prevalent 'ghost' banking domains are in practice



Outline

- Data Collection and Analysis Methodology
 FDIC Data Collection
 - FDIC Data Collection
 - Methodology for Identifying Domain Usage

2 Empirical Analysis

- The Lifecycle of Closed Bank Websites
- Characteristics Affecting Domain Reuse
- Identifying At-Risk Bank Websites

3 Policy Options



FDIC Data Collection Methodology for Identifying Domain Usage

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FDIC Data Collection Methodology for Identifying Domain Usage

FDIC data collection

- The FDIC provides an online database of all institutions it has supervised, including those which no longer exist due to merger or collapse
- We focused on 3181 banks merged or closed between 1 July 2003 and 6 June 2013
- We obtained 2302 URLs matching 2393 banks
- For each URL, we fetched WHOIS details and a screenshot of the rendered website



FDIC Data Collection Methodology for Identifying Domain Usage

Categorizing bank domain usage

- We manually inspected each of the screenshots and grouped them into one of the following categories
 - Operable bank-held website (old bank, redirect, or interstitial)
 - 2 Domain parking pages with syndicated advertisements
 - Websites used to distribute malware
 - Other forms of reuse (e.g., blog spam, black-hat SEO)
 - Inoperable websites (e.g., blank pages, misconfigured websites)
 - Inactive domains (unregistered, or not resolving)



Identifying whether a bank still controls a domain

- We used the following heuristics to confirm that a bank controls a domain
 - Any website whose screenshot is categorized as a bank and the domain has been continuously registered since before the bank closed
 - Any website that redirects to a currently open bank website URL that appears in the FDIC list
 - Any domain with WHOIS information indicating ownership by a bank



The Lifecycle of Closed Bank Websites Characteristics Affecting Domain Reuse Identifying At-Risk Bank Websites

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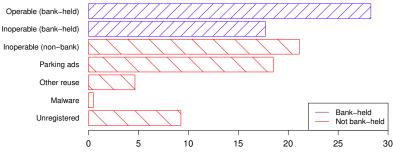
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The Lifecycle of Closed Bank Websites Characteristics Affecting Domain Reuse Identifying At-Risk Bank Websites

How closed banks are used

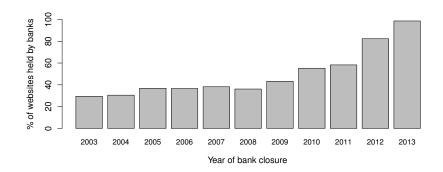


% of all closed bank websites



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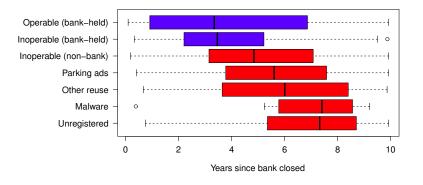
Fraction of closed banks whose domains are still owned by a bank, by year of bank closure





The Lifecycle of Closed Bank Websites Characteristics Affecting Domain Reuse Identifying At-Risk Bank Websites

Lifecycle of domain reuse





What factors affect the chances a bank domain will be abandoned?

Bank size

- Hypothesis: Smaller banks more likely to be abandoned than larger banks
- Indicator: $\log(\text{Deposits})$
- **2** Troubled circumstances at closure
 - Hypothesis: Troubled banks more likely to be abandoned
 - Indicator: Boolean variable set to True if the bank collapsed or was merged with FDIC assistance

Time since closure

- Hypothesis: The longer time since a bank has closed, the *more likely* the domain is to be abandoned
- Indicator: Years since the bank has closed



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Logistic regression 1: Factors affecting abandonment

 $\log \frac{p_{abandoned}}{1 - p_{abandoned}} = c_0 + c_1 \log (\text{Deposits}) + c_2 \text{ Troubled} + c_3 \text{ Years closed} + c_2 \text{ Troubled} + c_3 \text{ Years closed} + c_3 \text{$

Regression 1	Response variable: Abandoned				
	coef.	Odds Ratio	95% conf. int.	Significance	
(Intercept)	0.58	1.79	(0.90,3.63)	-	
$\log(Deposits)$	-0.17	0.84	(0.80, 0.89)	$p \ll 0.0001$	
Troubled	0.87	2.38	(1.90, 2.98)	$p \ll 0.0001$	
Years closed	0.29	1.33	(1.29,1.39)	$p \ll 0.0001$	
Model fit:	$\chi^2 = 3$	$322.8, p \ll 0.0$	001		



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The resurrection of abandoned bank domains

- 535 bank domains have been allowed to expire at some time after the bank closed
- 326 of these have subsequently been resurrected, that is, reregistered and a new creation date has been recorded in the WHOIS
- We next examine why some domains are resurrected while others aren't



The Lifecycle of Closed Bank Websites Characteristics Affecting Domain Reuse Identifying At-Risk Bank Websites

What factors affect the chances an abandoned bank domain will be re-registered?

Bank size

- Hypothesis: Larger banks more likely to be re-registered
- Indicator: log(Deposits)

Iroubled circumstances at closure

• Indicator: Boolean variable set to True if the bank collapsed or was merged with FDIC assistance

Time since closure

- Hypothesis: The longer time since a bank has closed, the *less likely* the domain is to be re-registered
- Indicator: Years since the bank has closed



Logistic regression 2: Factors affecting re-registration

 $\log \frac{p_{registered}}{1 - p_{registered}} = c_0 + c_1 \log (\text{Deposits}) + c_2 \text{ Troubled} + c_3 \text{ Years closed} +$

Regression 2	Response variable: Registered				
	coef.	Odds Ratio	95% conf. int.	Significance	
(Intercept)	-0.84	0.43	(0.13,1.38)	-	
$\log(Deposits)$	0.33	1.39	(1.27, 1.53)	$p \ll 0.0001$	
Troubled	0.73	2.08	(1.18, 3.86)	p = 0.0151	
Years closed	0.24	0.79	(0.73,0.85)	$p \ll 0.0001$	
Model fit:	$\chi^2 = 1$	$120.7, p \ll 0.0$	0001		



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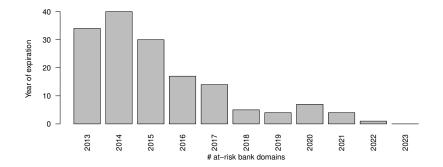
Identifying at-risk bank websites

- We consider a bank-controlled website to be *at-risk* if, according to the WHOIS record, the domain has not been updated since before the bank closed but has yet to expire
- In this circumstance, the bank has not yet had to make a decision whether or not to renew the domain (if they even know there's a decision to be made!)
- 157 of 1 127 bank-controlled websites are at-risk of falling out of bank control



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At-risk banks by year of domain expiration





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What is the harm imposed by ghost domains in general?

• Ghost domains are a problem not only for banks

- At one end, businesses regularly close and domainers are often quick to buy their associated domain names to exploit residual traffic or resell
- Cybercrime domains (e.g., botnet C&C) are registered to do harm, so their permanent removal seems desirable
- Banks fall somewhere between, since trust in banking is so crucial to the sector's fiscal health
- We now review a range of mechanisms to reassert control over domains where restrictions over re-registration can be justified



Mechanisms to protect ghost domains

- + Avoids any possible harm
 - Overkill; impractical (and often unwise) to enforce permanence
- Prepaid escrow: certain classes of domains (e.g., banks) must prepay registration fees for many years in the future
 - + Avoids all harm
 - Only practical in highly-regulated industries
- Trusted repository: neutral body holds domains in trust and decides when and if to reopen a domain to registration
 - Selecting criteria to release is difficult
 - Funding could be problematic
- Warning lock: automatic tracking of high-value domains with notification before expiry and volunteers choose whether to defensively register
 - Selecting criteria to release is difficult
 - Impact likely extremely patchy



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Conclusions

- When banks close, their domains are often forgotten: 53% of domains for US banks closed in the past decade are no longer controlled by banks
- This can create confusion for consumers and opportunities for cybercriminals
- Regression analysis has shown that smaller or troubled banks are more likely to abandon domains, while larger and more recently closed banks are more likely to be re-registered
- We recommend that bank regulators help coordinate the defensive registration of at-risk domains
- For more: http://lyle.smu.edu/~tylerm/



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