



“I was told to buy a software or lose my computer. I ignored it”

## A study of ransomware



*Camelia Simoiu, Stanford University*

*Joseph Bonneau, NYU*

*Christopher Gates, Symantec*

*Sharad Goel, Stanford University*



*“For the past couple of years consumers have been the most likely victims of ransomware, usually accounting for **two-thirds of all infections.**”*

[An ISTR Special Report: Ransomware and Businesses 2016, Symantec]

# Current estimates

Current estimates are based on non-representative data, and often inconsistent:

- [FBI IC3 report, 2017]  
**2,700 reports** (2016)
- [ISTR Special Report, Symantec, 2017]  
**405,000 consumer blocks** globally (06/2016 - 06/2017)
- [Huang et al., 2018]  
**20,000 potential victims** globally, across a 22-month period  
(2016 - 2017)

# Research questions

1. What are the prevalence and characteristics of ransomware attacks in the general US population?
2. What (situational and behavioral) factors affect susceptibility to ransomware ?



# Estimating the prevalence of ransomware



# Identifying ransomware infections

- Representative sample of 1,180 U.S. adults
  - Weighting adjustment for each respondent
  - Matched to the 2010 American Community Survey (ACS)



# Identifying ransomware infections

- Representative sample of 1,180 U.S. adults
  - Weighting adjustment for each respondent
  - Matched to the 2010 American Community Survey (ACS)
  
- Respondents progressed through (up to) 10 information and question pages
  - Definition of ransomware
  - Screenshots of common strains
  - 5 questions on specific tactics typically seen in attacks
  - Free text description of the attack





# Victimization rate

	<b>Victimization rate</b> (06/2016 - 06/2017)
Self-reported	5%
Re-classified (inclusive)	3%
Re-classified (conservative)	2%

2% estimate corresponds to approximately 1.9 million victims in the U.S.

# Dealing with the attack

- Almost half of attacks reported include police impersonation (46%)
- Encryption strains (36%) less common than locker strains (74%)
- The median and average ransom reported were \$250 and \$510, respectively (s.e. \$390)
- Few victims paid ransom (4%) or notified authorities (11%)

# Payment method

Cryptocurrencies do not seem to be the driving factor for ransomware.

	Proportion
Pre-paid cash voucher	40%
Wire transfer	15%
<b>Cryptocurrency</b>	<b>13%</b>
Premium-rate text message	8%
Not displayed	14%
Do not remember	10%

# Behavioral changes post-attack

	Proportion
More careful browsing	65%
Purchased AV product	44%
Updated AV product	31%
Started to backup data	26%
Enable automatic updates	24%
Backup data more regularly	22%
Changed OS configurations	20%
Changed OS	10%
Changed default browser	12%

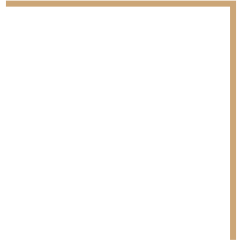
Half of victims reported changing 2 or more security habits following the attack.

# Behavioral changes post-attack

	Proportion
More careful browsing	65%
Purchased AV product	44%
Updated AV product	31%
Started to backup data	26%
Enable automatic updates	24%
Backup data more regularly	22%
Changed OS configurations	20%
Changed OS	10%
Changed default browser	12%

Half of victims reported changing 2 or more security habits following the attack.

# Susceptibility to ransomware



# Predicting ransomware infection (next 12 months)

Model	Lasso	GBT
Demographics + SES	65	63
Demographics + SES + technology + computer skills	64	65
Security habits	66	67
<b>Security habits + Experienced scam</b>	<b>75</b>	<b>74</b>
<b>All features (saturated model)</b>	<b>76</b>	<b>76</b>

Average AUC across (stratified) K=5 folds.

# Risk heuristic

- Statistically derived self-assessment heuristic to estimate risk of future ransomware infection (within the next 12 months)



# Risk heuristic

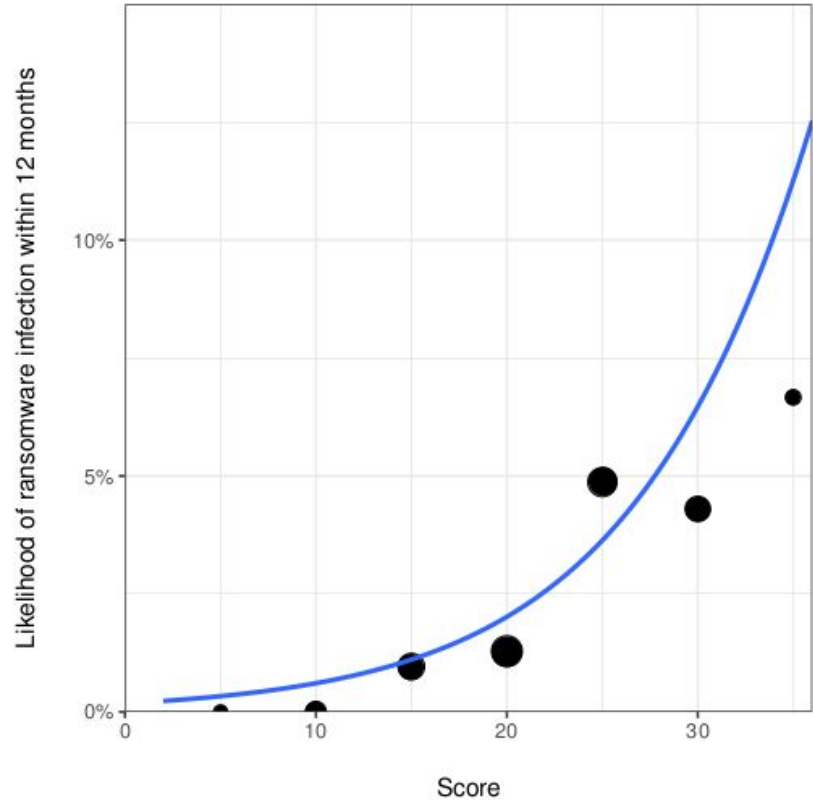
- Statistically derived self-assessment heuristic to estimate risk of future ransomware infection (within the next 12 months)
  - Consumers -- if made aware they are “at risk”, may be better motivated to improve their security posture and adopt better security habits
  - Perceived susceptibility has been found to be a necessary factor to achieve behavior change in a variety of contexts [Strecher et al., 1997]

# Risk heuristic

Question	Points	Question	Points
How frequently do you <b>download files from online torrent sites</b> such as the Pirate Bay or TorrentZ2?		Have you ever downloaded -- or been asked to download-- an application that you suspect was malicious?	
<ul style="list-style-type: none"><li>• I frequently download files from torrent sites</li></ul>	15	<ul style="list-style-type: none"><li>• Yes, I have.</li></ul>	10
<ul style="list-style-type: none"><li>• I occasionally download files from torrent sites</li></ul>	10	<ul style="list-style-type: none"><li>• No, I haven't.</li></ul>	0
<ul style="list-style-type: none"><li>• I rarely download files from torrent sites</li></ul>	5		
<ul style="list-style-type: none"><li>• I never download files from torrent sites</li></ul>	0		
Do you <b>backup your personal files</b> to an external hard drive or cloud-based storage device?		Do you use <b>two-factor authentication</b> for at least one of your online personal accounts (i.e., not for a work-related account)?	
<ul style="list-style-type: none"><li>• I do not have any of my files backed up.</li></ul>	6	<ul style="list-style-type: none"><li>• Yes, I use two-factor authentication.</li></ul>	0
<ul style="list-style-type: none"><li>• I backup my files once a year</li></ul>	4	<ul style="list-style-type: none"><li>• No, I don't use two-factor authentication.</li></ul>	1
<ul style="list-style-type: none"><li>• I backup my files every couple of weeks</li></ul>	2		
<ul style="list-style-type: none"><li>• I backup my files every day.</li></ul>	0		
Is your <b>hard drive encrypted</b> ?		Is your computer <b>password-protected for login</b> ?	
<ul style="list-style-type: none"><li>• Yes, my hard drive is encrypted</li></ul>	0	<ul style="list-style-type: none"><li>• Yes, my computer has a password.</li></ul>	0
<ul style="list-style-type: none"><li>• No, my hard drive is not encrypted</li></ul>	1	<ul style="list-style-type: none"><li>• No, my computer doesn't have a password.</li></ul>	8

# Calibration

Average AUC across  
K=10 folds is 78%, on par  
with the saturated model.



# Conclusions

- Estimate the rate of ransomware infection across a nationally-representative sample of the US population: 2% - 3%
- Propose a tool for consumers to self-assess their risk of infection that is fast, transparent, and requires limited information



csimiou@stanford.edu

@camiioux



“I was told to buy a software or lose my computer. I ignored it”:

A study of ransomware

<http://web.stanford.edu/~csimoiu/>

# YOUR COMPUTER HAS BEEN LOCKED!

This operating system is locked due to the violation of the federal laws of the United States of America! (Article 1, Section 8, Clause 8; Article 202; Article 210 of the Criminal Code of U.S.A. provides for a deprivation of liberty for four to twelve years.)

Following violations were detected:

Your IP address was used to visit websites containing pornography, child pornography, zoophilia and child abuse. Your computer also contains video files with pornographic content, elements of violence and child pornography! Spam-messages with terrorist motives were also sent from your computer.

This computer lock is aimed to stop your illegal activity.

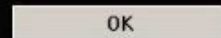
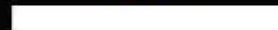
To unlock the computer you are obliged to pay a fine of \$200.

You have 72 hours to pay the fine, otherwise you will be arrested.

You must pay the fine through MoneyPak:

To pay the fine, you should enter the digits resulting code, which is located on the back of your Moneypak, in the payment form and press OK (if you have several codes, enter them one after the other and press OK).

If an error occurs, send the codes to address [fine@fbi.gov](mailto:fine@fbi.gov).



MoneyPak

Where I can buy MoneyPak?



# Sample responses

Description of attack	System Lock	Encryption	Police impersonation	Inclusive	Conservative
<i>"FBI - YOU HAVE BEEN WATCHING PORN OR GAMBLING OR BOTH, YOU MUST PAY \$200 TO MONEYGRAM"</i>	•	•	•	Ransomware	Ransomware
<i>"I was working on my computer and a screen popped up stating that my files had been encrypted and to reverse this I had to buy a program. I do not remember the name it showed but it had a black background. I just shut the computer and took it in for repair."</i>		•		Ransomware	Ransomware
<i>"It popped up and stated that I had to pay to gain access back to my computer and I was unable to do anything."</i>	•			Ransomware	False Positive
<i>"A voice said to call a certain number and when we did someone insisted that we pay \$300 and they would take care of the problem. We didn't pay. It was a mess for a while and my husband worked on it for a whole day."</i>	•			False Positive	False Positive

# Risk perceptions

- Victims believe they are *more* at risk of a future attack and *less* likely to pay a ransom.

	<b>Victims</b>	<b>Non-victims</b>
Likelihood of experiencing future attack	47 (sd=34)	30 (sd=25)
Likelihood of paying \$300 ransom	2.9 (sd=11)	8.4 (sd=20)

Differences statistically significant using a t test, 95% CI