# Analyzing the Bitcoin Ponzi Scheme Ecosystem

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#### There's No Free Lunch, Even Using Bitcoin: Tracking the Popularity and Profits of Virtual Currency Scams

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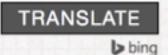
Abstract. We present the first empirical analysis of Bitcoin-based scams: operations established with fraudulent intent. By amalgamating reports gathered by voluntary vigilantes and tracked in online forums, we identify 192 scams and categorize them into four groups: Ponzi schemes, mining scams, scam wallets and fraudulent exchanges. In 21% of the cases, we also found the associated Bitcoin addresses, which enables us to track payments into and out of the scams. We find that at least \$11 million has been contributed to the scams from 13 000 distinct victims. Furthermore, we present evidence that the most successful scams depend on large contributions from a very small number of victims. Finally, we discuss ways in which the scams could be countered.

#### 1 Introduction

An effective, though unfortunate, way to determine that a new technological platform has "arrived" is by observing the presence of scammers leeching off those using the system. Shortly after the advent of the telegraph, sneaky punters began placing bets on recently-completed horse races at faraway bookmakers who had not yet observed the result [1]. Once telephones became pervasive, unsolicited calls by scammers became problematic. No sooner had email become popular, then a flood of messages promising riches from Nigerian princes began filling people's inboxes.



Longstanding, reliable, Bitcoin and altcoin Contract Mining



#### Latest Alert



#### Bitcoin-generator-x.bid

The same lame scam that you will see on many domains. If you believe there is any truth to these kinds of scam, you will soon part company with your Bitcoin. Don't say you weren't warned. 3/2/18

Bitpow.io

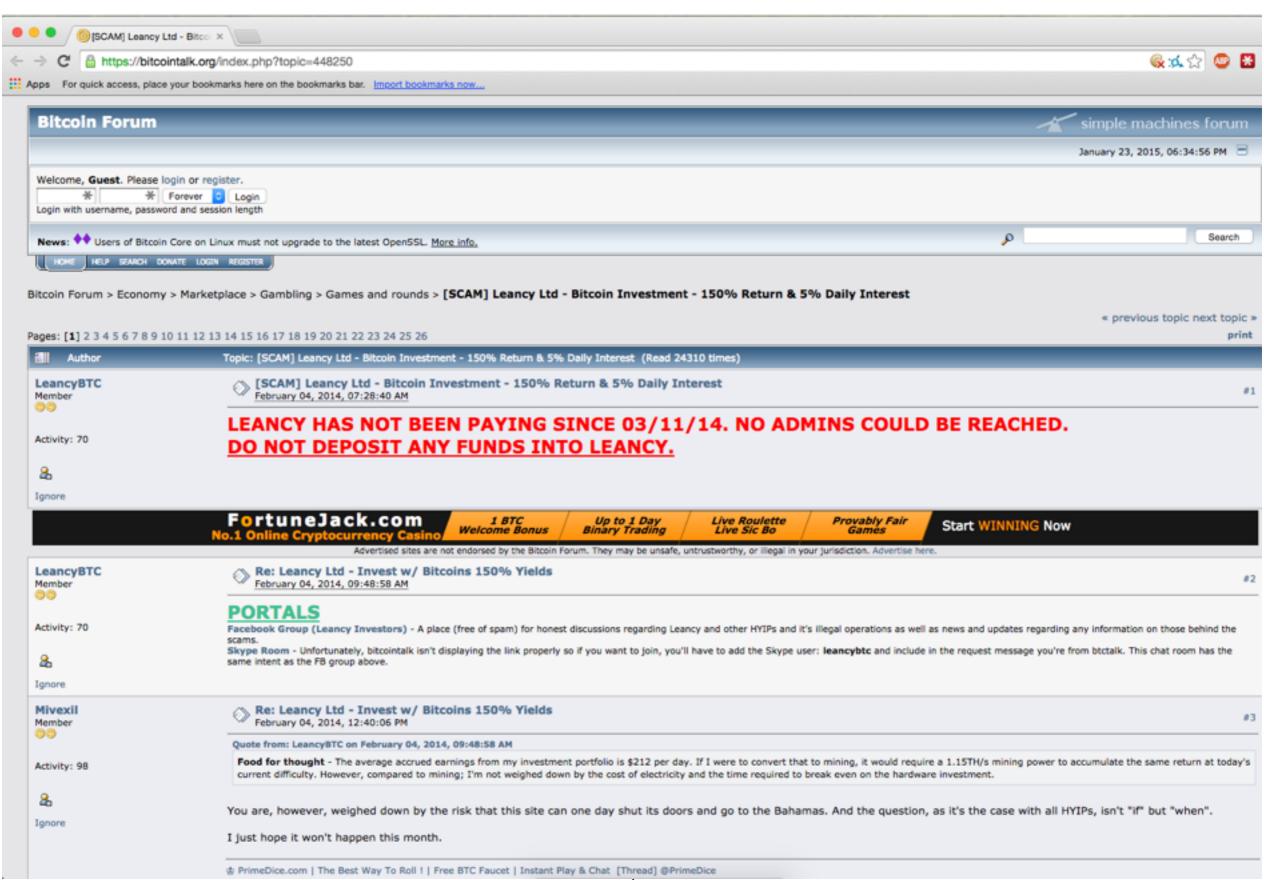
#### **The Badbitcoin Project**

Exposing bitcoin and cryptocurrency frauds since Feb 2014

If you have never read it, then a great place to begin your bitcoin adventure is by reading the veroriginal <a href="White Paper">White Paper</a>, from Satoshi Nakamoto. This explains the concept of bitcoin, and why so work so hard to progress this disruptive technology.

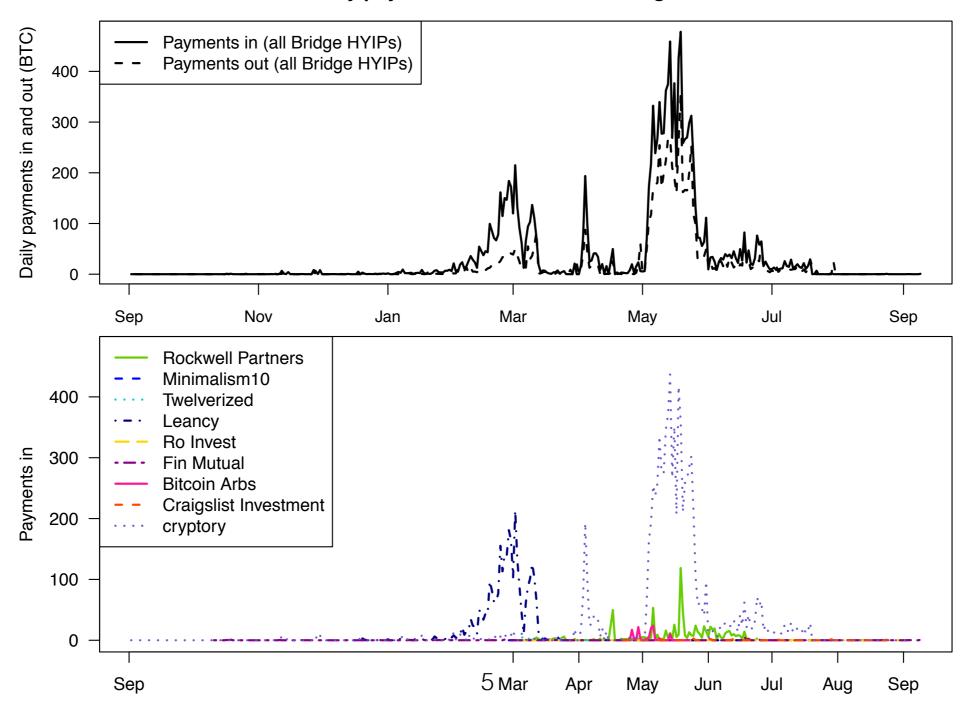
When you understand the potential of bitcoin, you will also understand why so many people wa it from you. The future value is much debated, but with consensus saying that it has a very long before becoming any kind of bubble.

Bitcoin is not a ponzi, and is not a scam. It's value is derived from it's raw cost of production, a value as a functioning token of trade, and store of value. The blockchain is supported by the tra



### Profits of Ponzis

#### Daily payments into and out of Bridge HYIPs



## 2015 Paper: Conclusions

- Developed manually intensive methodology for measuring profits of Bitcoin scams
- Found \$11 million revenue over 42 scams
- Indirect harm from scams undermine trust in the Bitcoin ecosystem

## Measuring the Supply and Demand for Bitcoin Scams

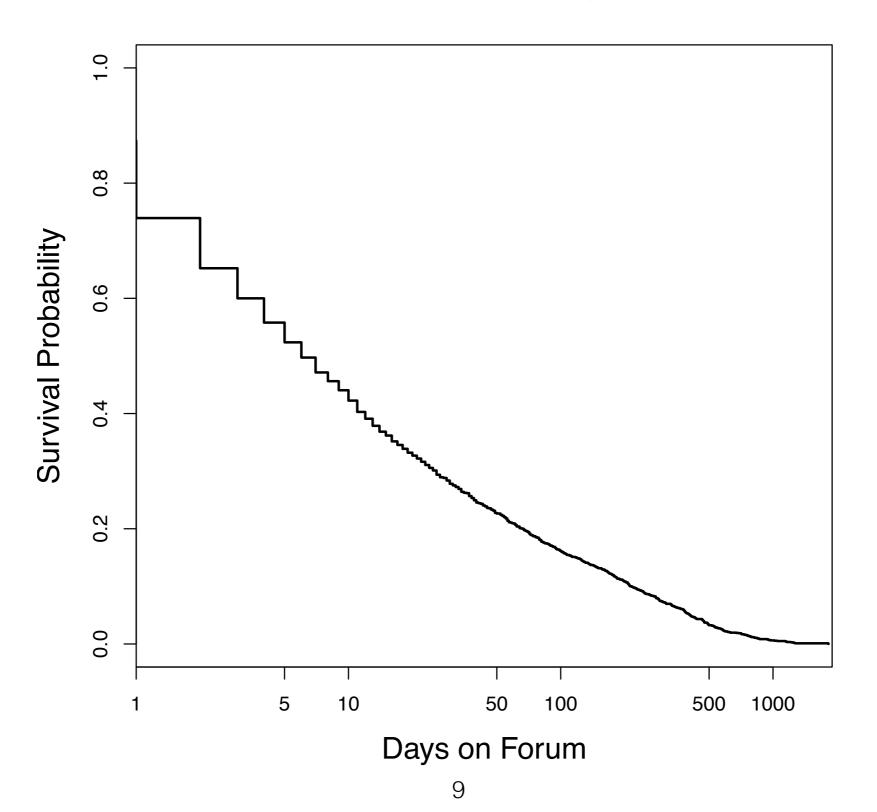




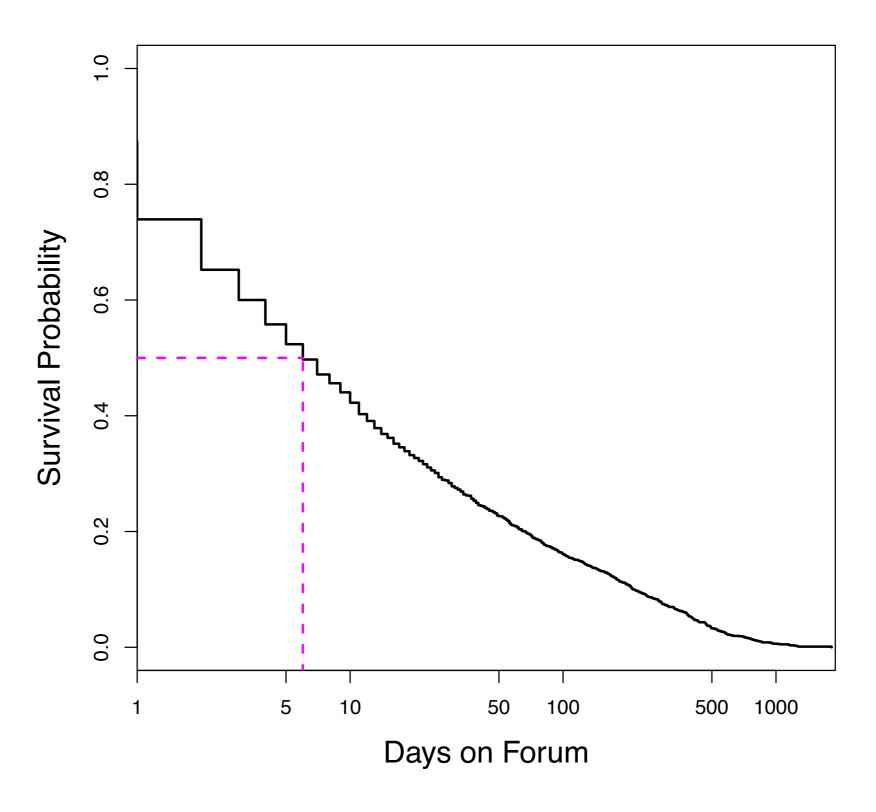
# Data Collection Methodology

- Crawled 11,424 threads on the three subforums of bitcointalk.org:
  - Scam accusations
  - Gambling: Games and Rounds
  - Gambling: Investment Games
- Refined this further to find 1,780 scams advertised through 1,804 ponzi-registered domains as well as 1,448 Bitcoin addresses collated from 2,617 threads.

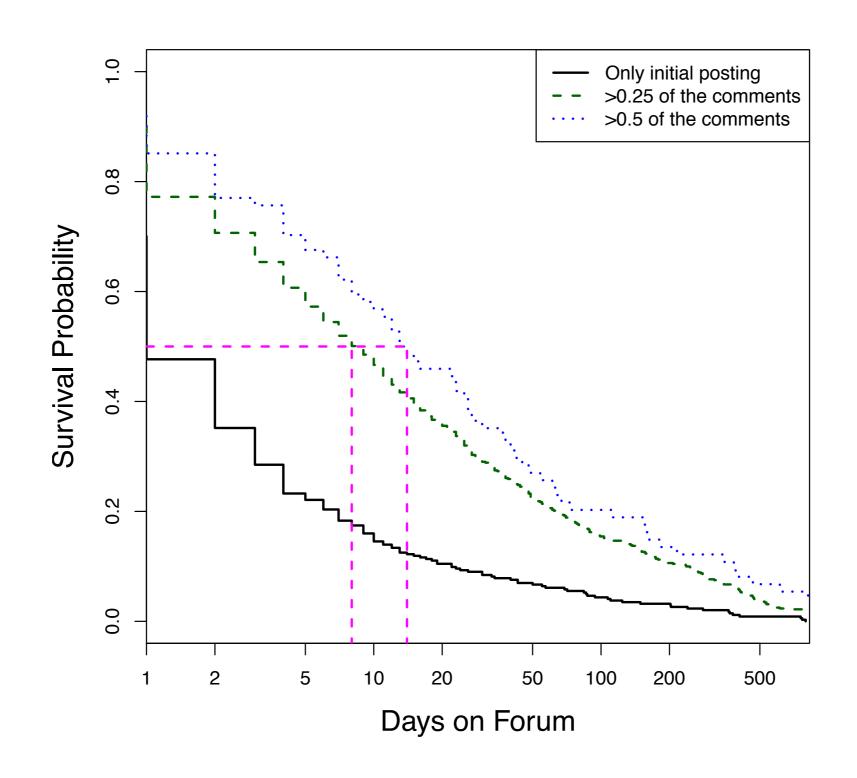
### Lifetime of Scams



## Lifetime of Scams



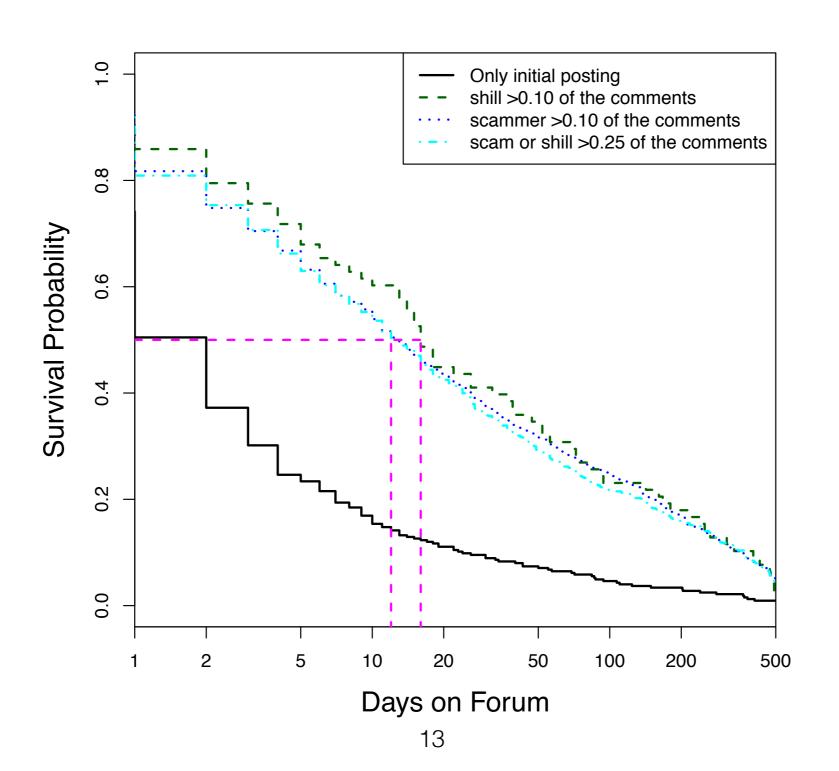
## Scammer Interaction



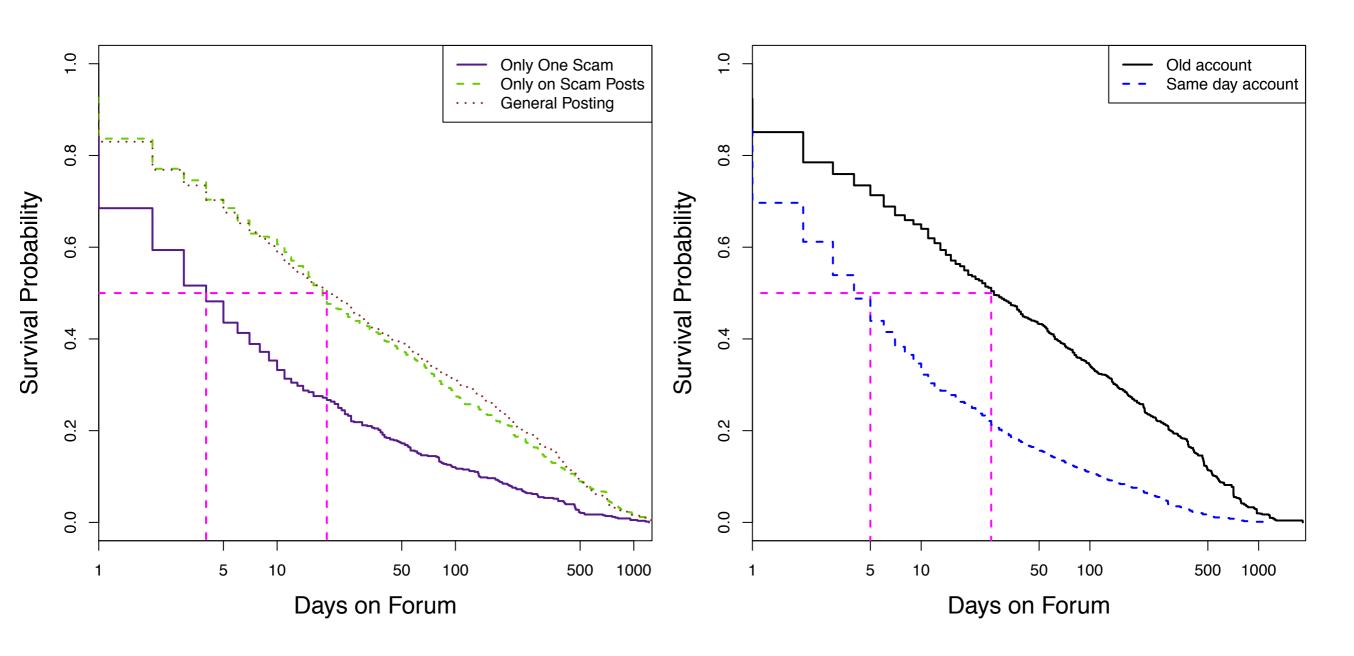
## Identifying shills

- Shills: users which we believe are the attacker under a different name
- Finding ground truth on shills: manually inspect threads, look for unusually positive posters & strong but false or unverifiable information
- Use forum history (only posts about one scam) to identify most of these users

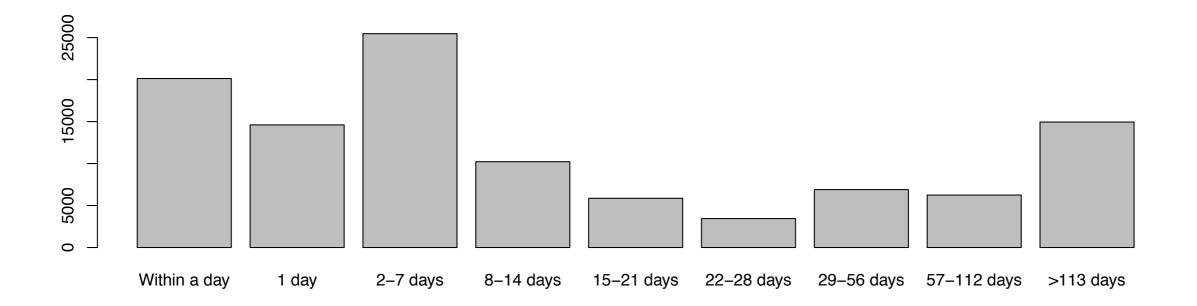
## Shill Interaction



## Scammer Forum History



### Ponzi Victims over Time



#### Forum History of Ponzi Victims

Category	# Victim Posts	# Other Posts	
Altcoins (all)	32 536	5429022	(-)
Alternative Clients	106	54159	(-)
Bitcoin Discussion	8872	998246	(+)
Development & Technical Discussion	683	162405	(-)
Group Buys	498	84734	
Hardware	2730	518728	(-)
Mining	427	1044148	(-)
Mining software (miners)	274	67561	(-)
Mining speculation	616	63 071	(+)
Pools	885	177985	(–)
Press	696	74437	(+)
Project Development	1526	137245	(+)
Technical Support	586	58952	(+)
Auctions	1865	108048	(+)
Collectibles	1 063	60745	(+)
Computer hardware	1462	118584	(+)
Currency exchange	3124	138264	(+)
Digital goods	7303	277903	(+)
Economics	3692	1204450	(-)
	13.7		

#### Forum History of Ponzi Victims

Gambling	12070	1297038	(+)
Gambling discussion	5677	340593	(+)
Games and rounds	23331	388689	(+)
Goods	1251	587681	(-)
Investor-based games	15402	115454	(+)
Lending	3 2 3 0	138108	(+)
Marketplace	517	5372844	(–)
Micro Earnings	3694	144797	(+)
Scam Accusations	4643	116151	(+)
Securities	1338	202813	
Service Announcements	2338	288993	(+)
Service Discussion	3692	330535	(+)
Services	8528	407342	(+)
Speculation	5058	883584	(-)
Trading Discussion	1 678	257 930	
Local (all)	14932	4454405	(-)
Archival	1026	147836	
Beginners & Help	3923	564720	
Meta	1 960	134319	(+)
Off-topic	8 309	563710	(+)
Politics & Society	2 181	290782	

## Cox Proportional Hazards Model

- Lots of measurable variables seem to affect lifetime
   but which variables are responsible?
- A proportional hazards model lets us disentangle the effects of various measures on lifetime.
  - Dependent variable: lifetime
  - Independent variables: explanatory factors

## Cox Proportional Hazards Model: Independent Variables

#### daily # victim comments

Number of victim comments over the lifetime of the scam.

#### daily # scammer comments

Number of scammer comments over the lifetime of the scam.

#### shill has posted?

 True if a "shill" has posted anywhere in the thread. (30% of the time)

#### same day account

 True if the scammers' bitcointalk account was registered the same day as the original post for the scam. (43% of the time)

# Cox Proportional Hazards Model: Results

	coef	exp(coef)	95% CI	p value
Daily # victim comments	0.028	1.029	(1.022, 1.036)	<<0.0001
Daily # scammer comments	0.022	1.022	(1.002,1.043)	0.034
Shill has posted?	-0.846	0.429	(0.385, 0.479)	<<0.0001
Same day account	0.374	1.1453	(1.320, 1.599)	<<0.0001

Log-rank test: Q=4389.2, p<<0.0001,  $R^2$  = 0.218

### Conclusions

- Developed semi-automated methodology for finding Bitcoin Ponzi schemes
- Found over 1,700 of these scams, half of which end within a week of being started.
- Frequency of victim and scammer posts is negatively correlated with scam survival
- Forum history positively correlated with scam survival