#### We do not forgive, Expect us.We are Anonymous. We are Legion to forgive, Expect us.We are Anonymous. We are Legion to forgive, Expect us.We are Anonymous. We are Legion to forgive, Expect us.We are Anonymous. We are Legion to forgive, Expect us.We are Anonymous. We are Legion to forgive Expect us.We are Anonymous. We are Legion to forgive Expect us.We are Legion t xpect us.We are Anonymous. We are Legion. We do not forget io not forget. We do not form We do not forgiv give. Expect us Ne are Anonym xpect us.We are A Anonymous, We e. Expect us.We are Anonymo ct us.We are Anony onymous. We We are Leg egton. We We do not forg get. We do not do not forgive. Expect us. We are Anonymous. We are Legio not orgive. Expect us. We are Anonymous. We are Legion. We do not orgive. Expect us. We are Anonymous. We are Legion, We do not forget Expect us. We are Anonymous. We are Legion. We do not forget. project us. We are Anonymous. We are Legion, we do not forget. We do Appect us. We are Anonymous. We are Legion. We do not forget. We do not we do not forget. We do not forget. We do not forget. We do not forgive. ion. We do not forget We do not forgive. Expect give. Expect us.We are We are Anonymous, We of Us. We are Anonymo We are Legion are Anonymous. We ar are Legion. Wo . vmous. We are Legi-We do not for n Legion. We d do not forget Tilvo. Expect us.We are Anonymous. We a --. we are Anonymous. W nonymous, We are Legion. 18. We are Legion, We do no tion. We do not forget. W do not forget. We do n We do not forgive. Ive. Expect us.V We are Appr

## Not so Anonymous -Deanonymization of Blockchain Users

Johannes Ahlmann CorkSec Meetup 2019-03-12

### Agenda

- Is Bitcoin anonymous?
- What is Deanonymization?
- Why should I care?
- What can I do about it?
- Where to get cryptos?
- Alternatives



### **About Me**

- Johannes Ahlmann
- sensatus.io
  - On-Prem Al Models
  - Gathering and Enriching Web Data
  - Sales & Client Intelligence
- webdata.org
  - Share Libraries and Best Practices
  - Bring Data Scientists and SME Companies together
  - ForDevelopers
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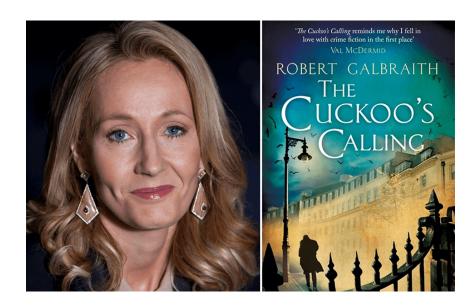


### Pseudonyms

- 1F1tAaz5x1HUXrCNLbtMDqcw6o5GNn4xqX
- secret@protonmail.com
- @johannes\_cork
- reddit\_user
- slashdot\_user
- ahljoh
- 083 1762676
- Dread Pirate Roberts





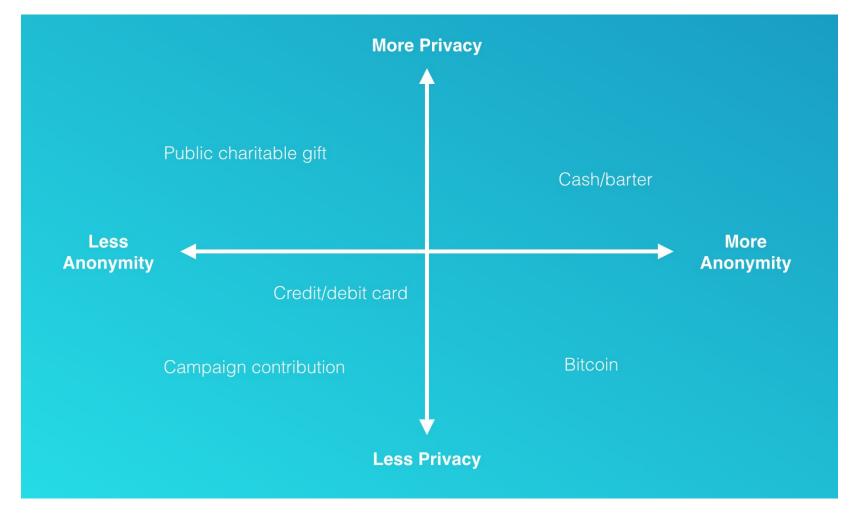




### Anonymity & Privacy

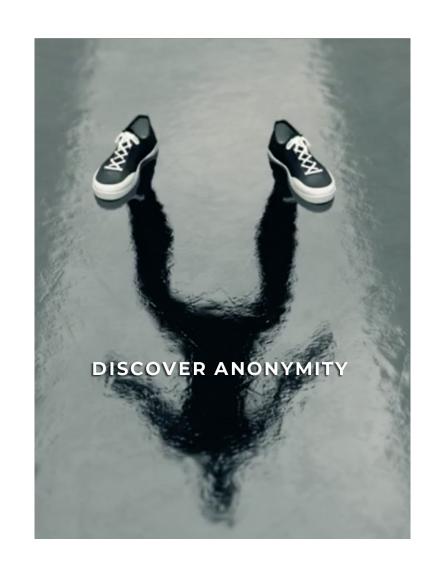
Anonymity
"without a name"
Noone knows who you are

Privacy
Noone knows what you
purchased and for what
amount



### Anonymity 1/2

- Pseudonymity People are aware of one or multiple pseudonyms of yours, but not your true identity
- Anonymity = Pseudonymity + Unlinkability
- Unlinkability
  - Different actions of the same user should not be linkable to each other
  - Linking of addresses to users
  - Linking of transactions to users
  - Linking of senders to recipients



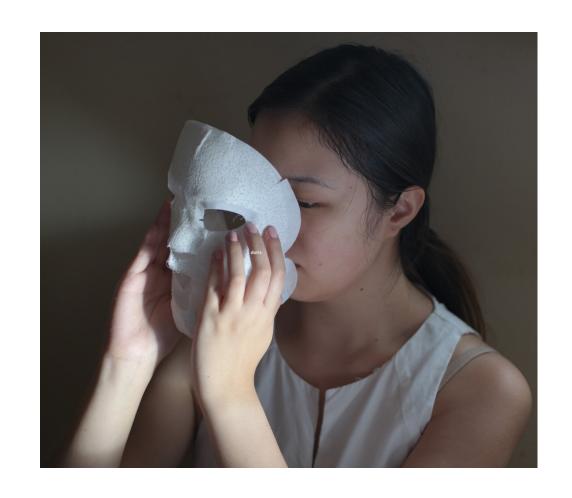
### Anonymity 2/2

- Privacy vs. Decentralization
  - Public Ledger is core component in consensus and sharing state of the world
- Bitcoin is pseudonymous, not anonymous
  - public addresses = pseudonyms
  - much less privacy than cash
- Many Bitcoins are acquired through Exchanges or Mining Pools
- Relatively few merchants/ market participants to trade with (retroactive geolocation)
- Deanonymizing TOR using Bitcoin;)
- Fungibility



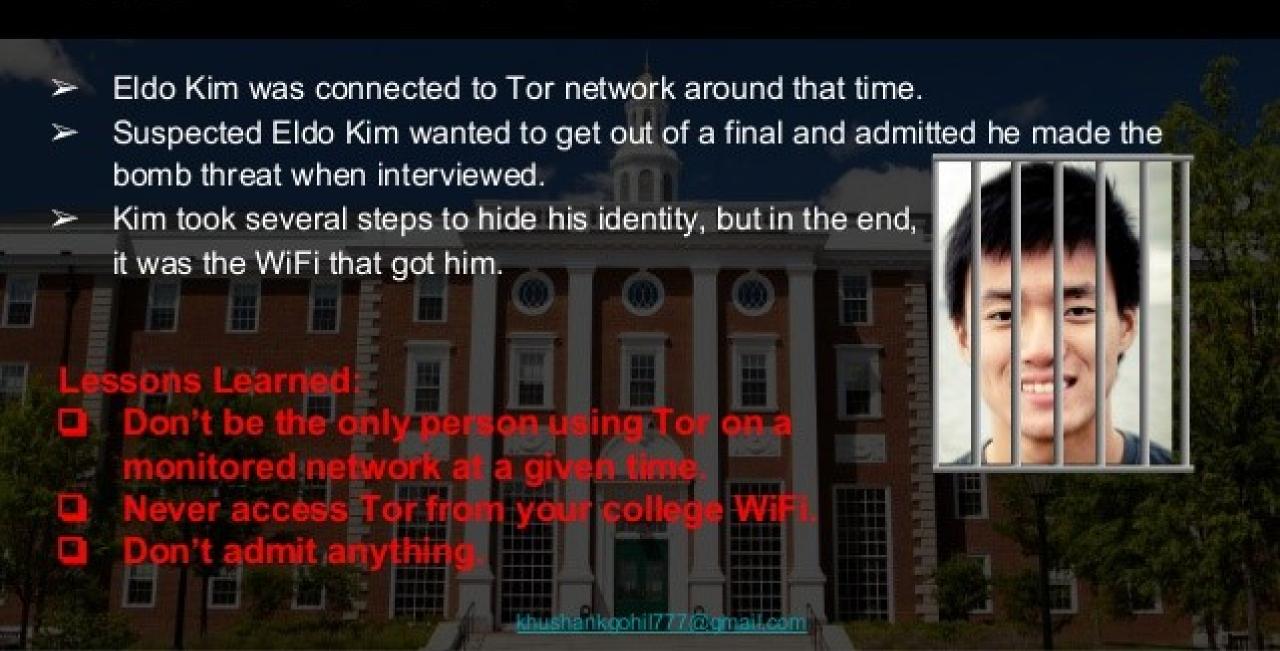
### What is Deanonymization

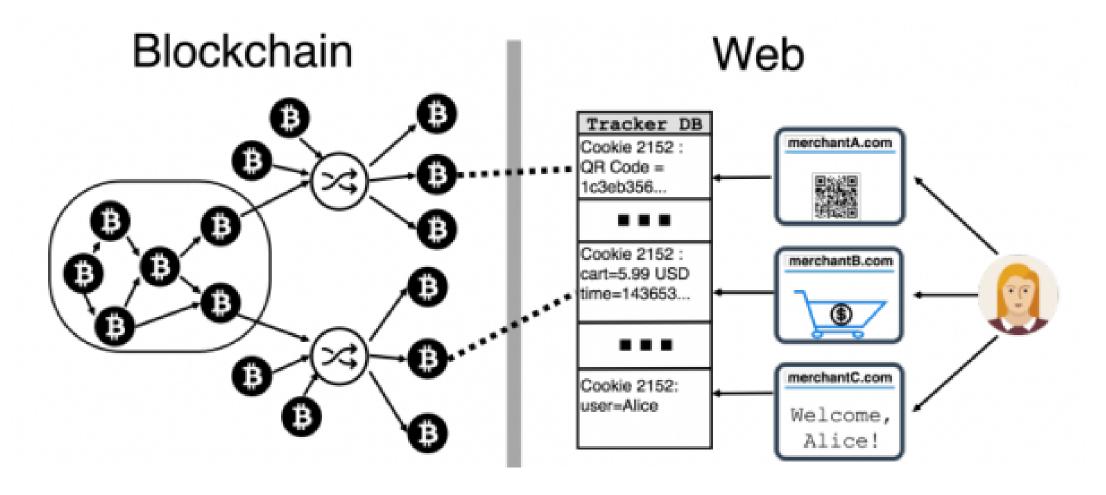
- Linking you to your addresses
- Linking you to your transactions
- Tagging, clustering of totality of addresses, transactions
- Approaches
  - Transaction Graph Analysis
  - Realtime Network Analysis of P2P network





### Case: 1 - Harvard Bomb Threat





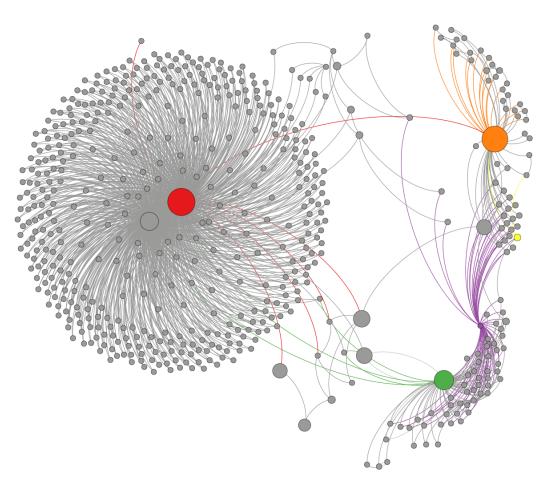
- 130 major merchants accepting Bitcoin
- 53/ 130 leak payment information with > 40 total parties
- Known fiat amount, timestamp
- Unique linkage possible for 60% of (these specific) cases

### Transaction Graph Analysis 1/2

# Change Address 5 8.5 8.5 Which address is change?

### Transaction Graph Analysis 2/2

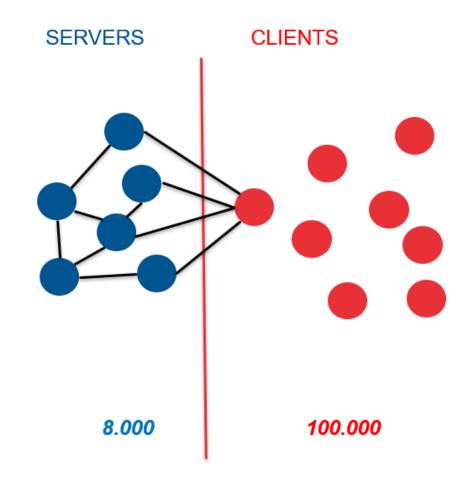
- Bitcoin transactions are public
- Active collection
  - Mining pools
  - Online wallets
  - Exchanges
  - Merchants
  - Gambling
- Tagging clusters
  - One tagged address in cluster tags all cluster
- Bitcoin address should only be used once



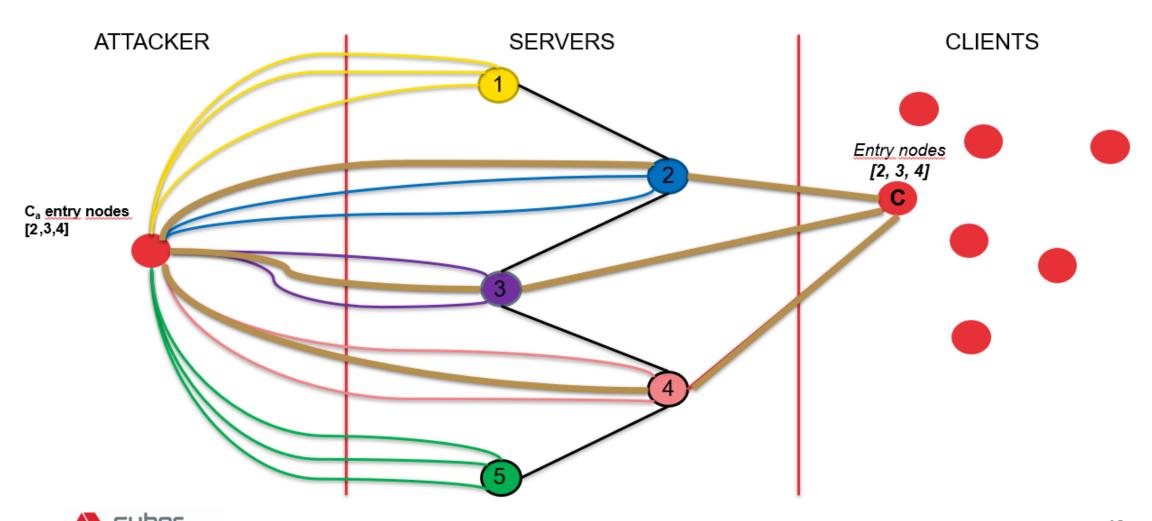
An Analysis of Anonymity in the Bitcoin System F. Reid and M. Harrigan, PASSAT 2011

### Realtime Network Analysis

- "Attack" on the P2P Network
- Peers distinguished over set of its (8) entry nodes
- Linking inputs
- Tagging clusters

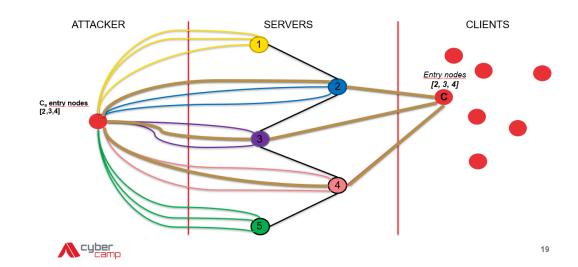


## Learning Entry Nodes



### Realtime Network Analysis

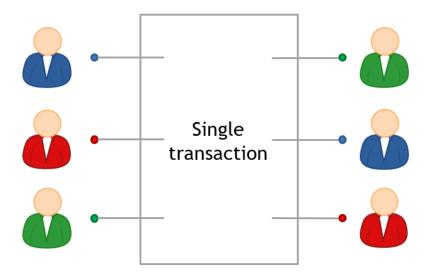
- Linking of different transactions to same user
- Each peer is trying to connect to 8 entry nodes
  - Network discovery
- Servers
  - Receive incoming connections
    - Max. 117 incoming connections
- Clients
  - 8 outgoing connections
- Peers are distinguished over set of it's entry nodes!



### Remediation

- Deterministic Address Pool Wallets
- Random Address Pool Wallets
- Tor
- Mixers
  - Who can we trust?
- Coinjoin
  - How to find Peers?
- Anonymous cryptocurrencies

### Coinjoin



### Anonymous Currencies

**Monero** - Ring signatures

**Dash** - Fork of bitcoin, coin-mixing service

**Zcash** - zk-SNARK, zero knowledge proofs

**Verge** - Tor and I2P network for privacy

**Komodo** - Fork of Zcash, zk-SNARK

**Pivx** - Fork of Dash, Zerocoin protocol

(Legitimate goods vs. legitimate worries; how can this be used for good or bad?)













# Thank You!

### Resources

- https://coincenter.org/entry/how-anonymous-is-bitcoin
- https://bitcoinmagazine.com/articles/is-bitcoin-anonymous-a-complete-beginner-s-guide-1447875283/
- https://www.coursera.org/lecture/cryptocurrency/how-to-de-anonymize-bitcoin-qnS76
- https://www.slideshare.net/bhaslhofer/bitcoin-deanonymization-and-money-laundering-detection-strategies
- https://pwlconf.org/2018/giulia-fanti/
- https://www.technologyreview.com/s/608716/bitcoin-transactions-arent-as-anonymous-as-everyone-hoped/
- https://decentralize.today/a-new-attack-vector-to-deanonymize-bitcoin-users-9c6dc433d4b6
- https://www.deepdotweb.com/2017/04/20/how-companies-are-deanonymizing-bitcoin/
- https://bitcoinsandblockchains.blogspot.com/2016/05/bitcoin-deanonymization.html
- https://btcmanager.com/u-s-department-of-homeland-security-create-bitcoin-deanonymization-tool/
- https://www.deepdotweb.com/2018/01/02/using-bitcoin-transaction-analysis-deanonymizing-users-tor-hidden-services/
- https://www.researchgate.net/publication/305423583\_Listening\_to\_Whispers\_of\_Ripple\_Linking\_Wallets\_and\_Deanony mizing\_Transactions\_in\_the\_Ripple\_Network/download
- https://www.youtube.com/embed/glyQy\_e5LmM?