## Resilience of Blockchain Overlay Networks

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#### Motivation

• Blockchains for critical infrastructure

Impacts a lot of people

• Their security and resilience depends on the P2P network

The P2P network has not been studied in depth

#### Why this knowledge gap?

- Assumption of reliable Internet communications
- Decentralization  $\neq$  Safe & Robust
- The network topology is unknown

#### This work

- Seven distinct blockchain overlays
- Structural resilience
  - Against random failures
  - Targeted attacks
  - Spatial centralization in Ases
  - Inter-dependencies (common nodes in different networks)

#### Selected networks

Well known, established cryptocurrencies.

Frequently listed in top50 by CoinMarketCap

**Bitcoin** 



**Ethereum** 



**BitcoinCash** 



Litecoin



**DASH** 



**ZCash** 



Dogecoin



#### Challenges

Topology is unknown

Inferring the topology is very hard

Topology hiding techniques are used

#### Topology knowledge threats:

Eclipse Attacks,

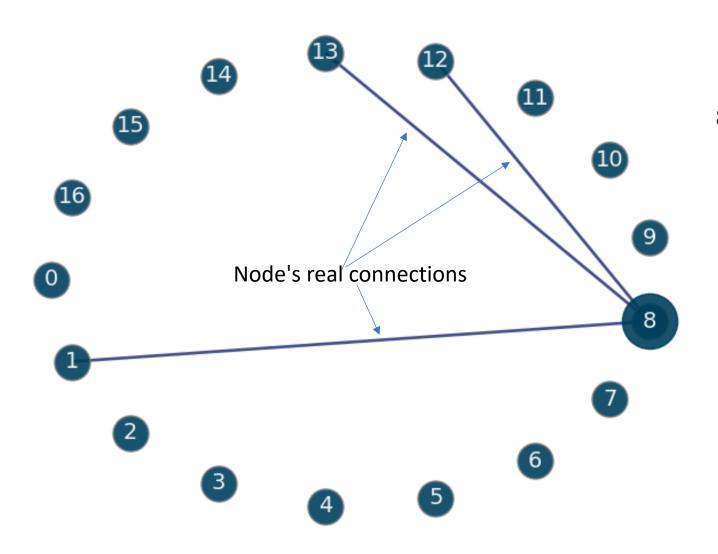
Facilitate network partitioning,

User anonymity

#### Main Idea

- Peer Address propagation helps discovery process
- Construct connectivity graphs that contain ALL POSSIBLE links

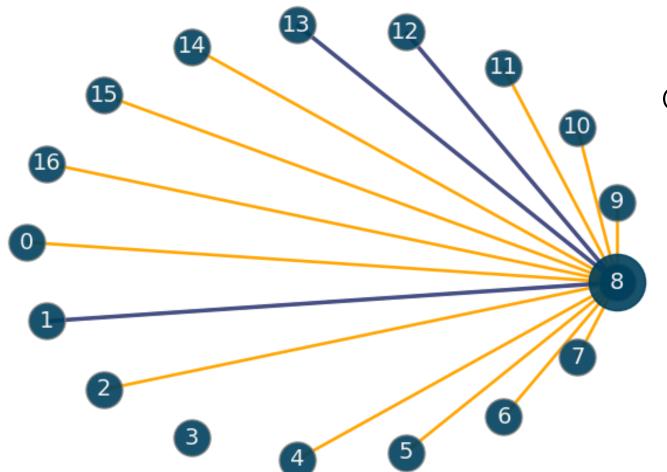
#### Key Idea: Exact topology is hard



#### 8<sup>th</sup> Node's network view:

Nodes 0 - 16 are know to Node 8 Node 8 has active connections to nodes: #1, #12, #13 Key Idea: Exact topology is hard

Study all possible paths!



Node's view of the network



Combine views from all nodes



2 – hour snapshots x 28 days x 7 Blockchains

2-hour snapshots aggregated to 24-hour snapshots

# Key Idea: Exact topology is hard Study all possible paths!

#### GOAL: Ask all nodes for the addresses they know

Avoids the need of accurate topology

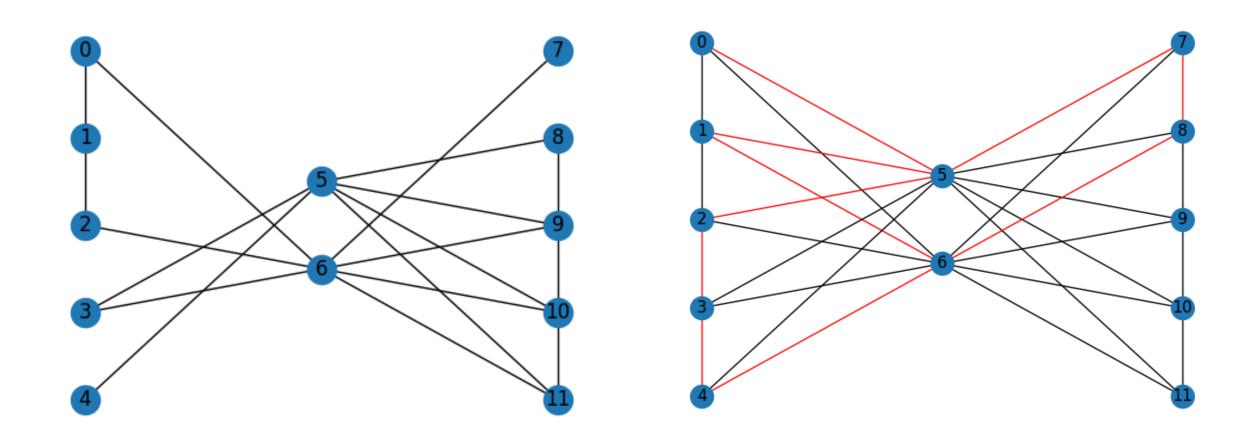
Results are more robust against measurement inaccuracies

Strengthens Resilience study

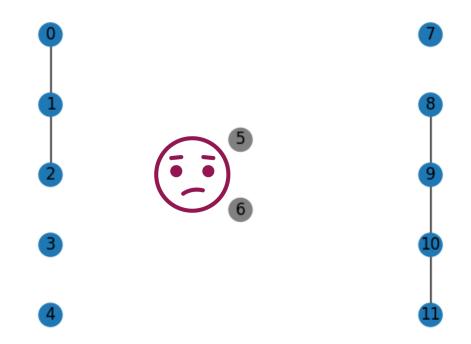
#### We trade accuracy for completeness:

the actually realized topology of an overlay is highly unlikely to be resilient if our inferred topology of possible connections is not

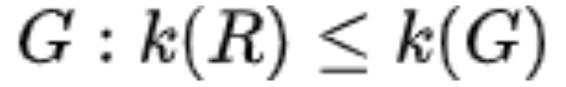
#### Real vs Potential connections

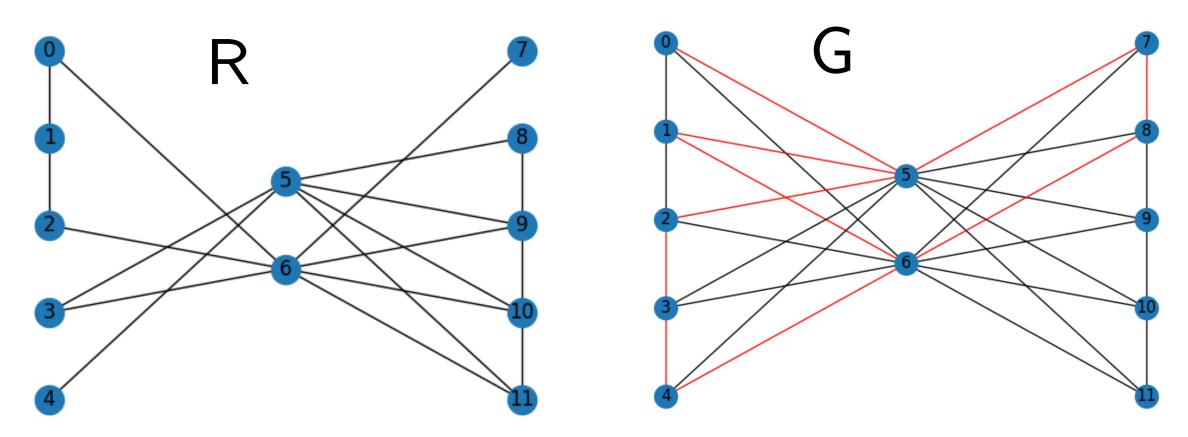


#### Real vs Potential connections



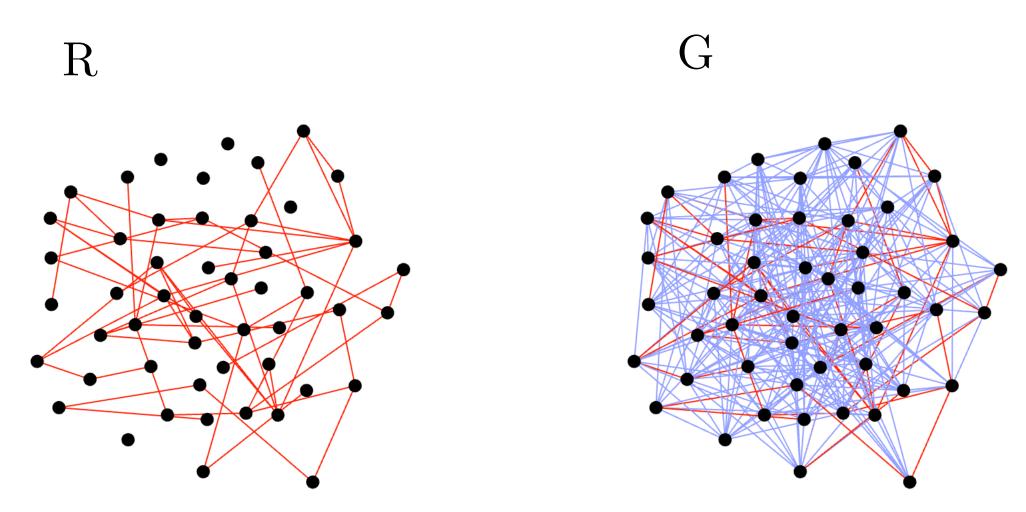
## If R is spanning subgraph of G then:





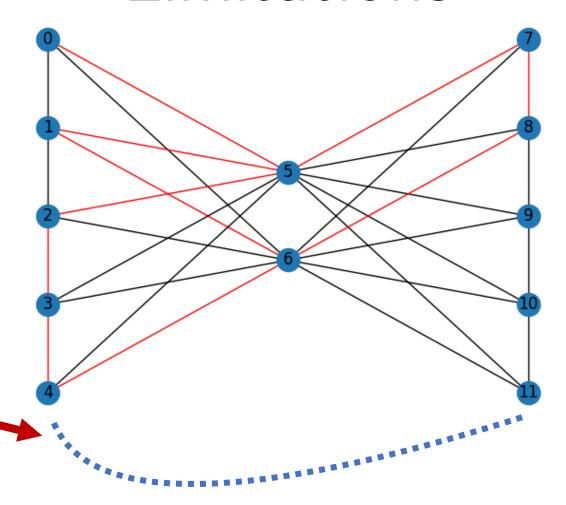
Lemma 1 by Harary [36]: Harary, F.: The maximum connectivity of a graph. Proceedings of the National Academy of Sciences of the United States of America 48(7) (1962)

- **R** => the real graph
- **G** => connectivity graph, reconstructed from our data collection



Sample random graphs for example purposes.

## Limitations



Our validations indicate that such misses are unlikely

#### Attack Strategies

Remove nodes randomly – simulating failures (baseline)

Remove nodes in order according to a metric (targeted attack)

Degree

Betweenness Centrality

Page Rank

Static setting: metrics are not recalculated after node removal

### Measuring failure/attack effects

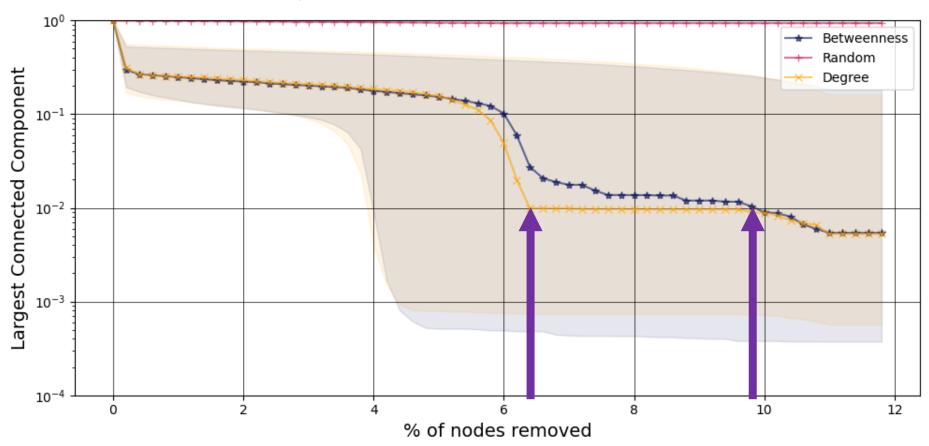
Size of Largest Weakly Connected Component (in the undirected graph)

Number of Connected Components

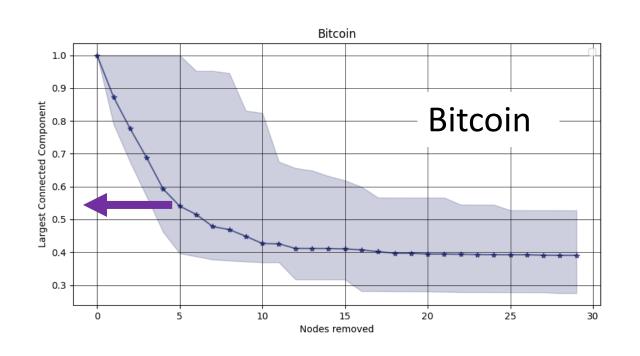
Network Diameter

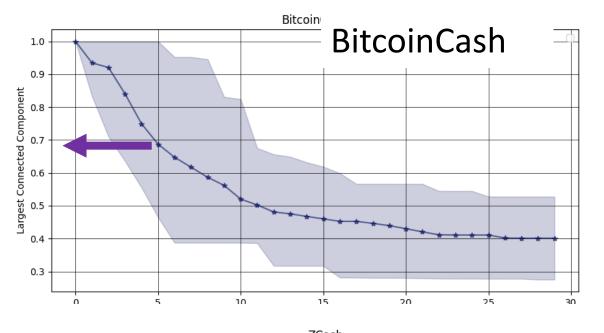
#### Results – Targeted Attacks

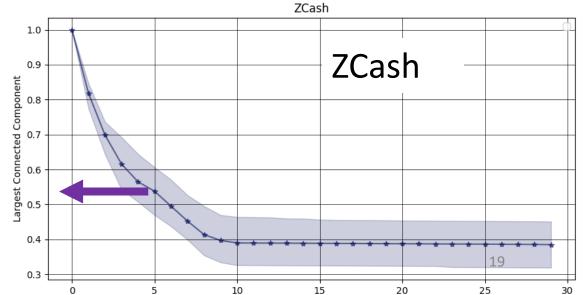
Bitcoin shown; similar results for BitcoinCash & Ethereum



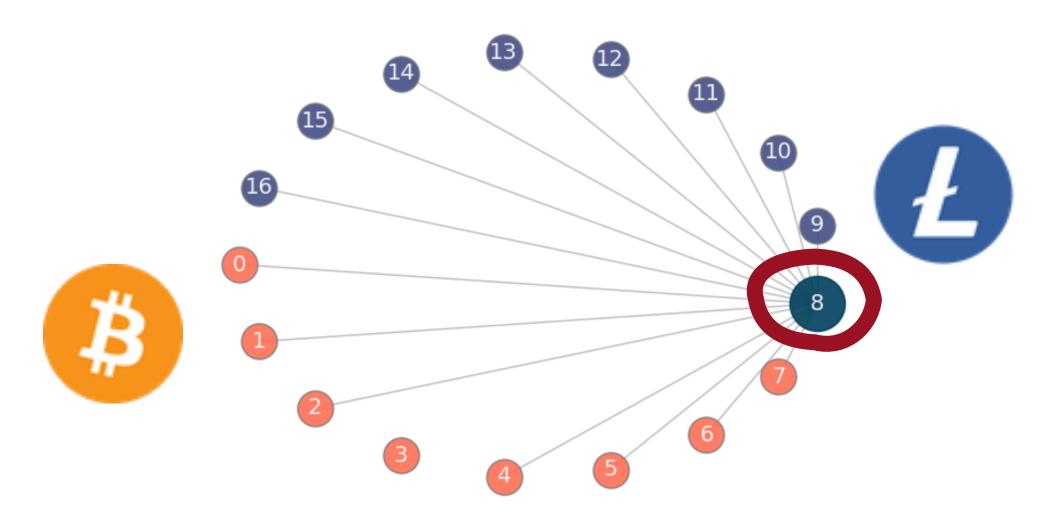
## Results – Targeted Attacks



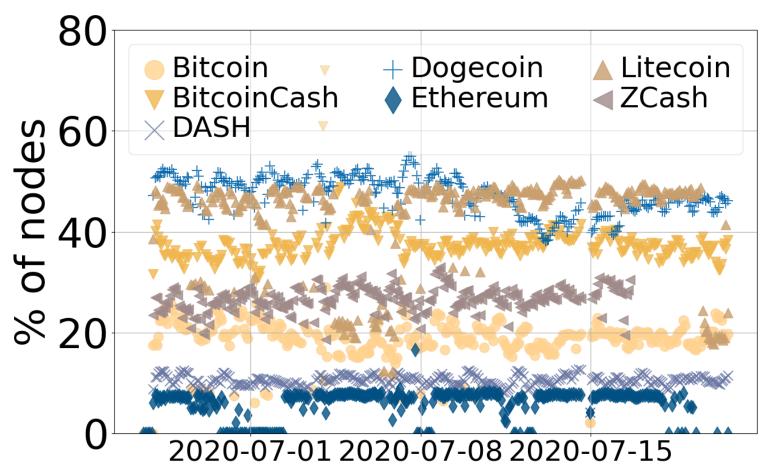




### Network-layer inter-dependencies

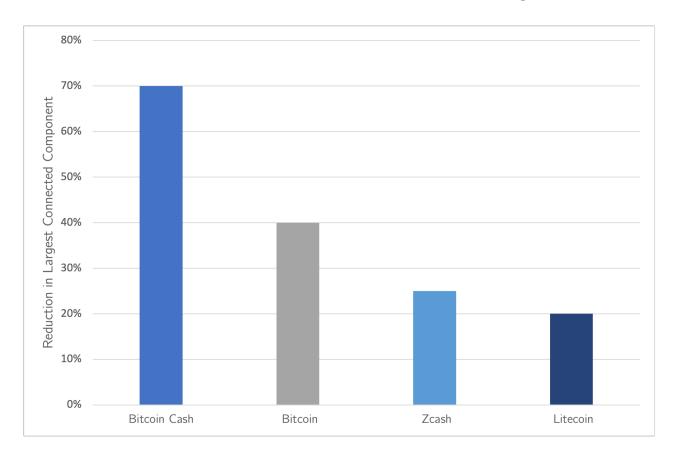


### Results Network-layer inter-dependencies

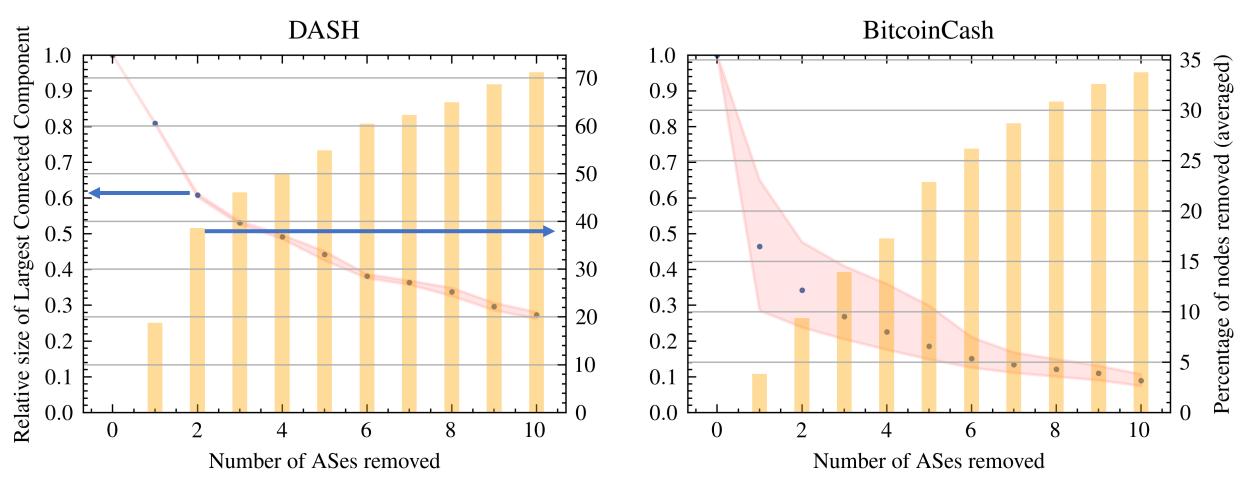


## Results Network-layer inter-dependencies

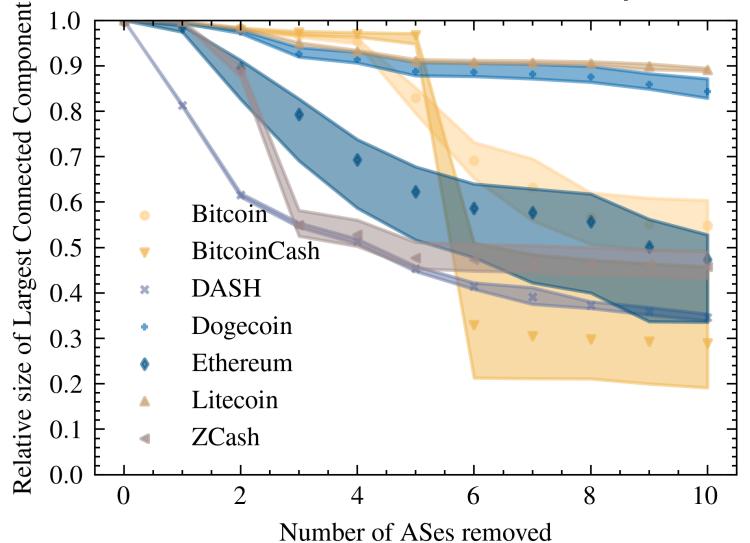
Bitcoin, Bitcoin Cash, Litecoin, and Zcash share a significant number of nodes.



# Results Spatial Centralization



# Results Spatial Centralization + Interdependencies



#### Key insights

Blockchain P2P overlays are:

Robust against failures

Weak against targeted attacks

Not random, contrary to their intended design

Different networks are interconnected Significant co-location in ASes



Simultaneous Disruption of many blockchains

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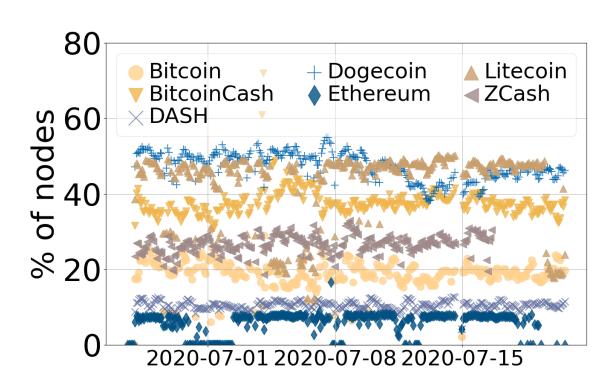
#### Results - RQ1 Network Characteristics

- Well connected networks with low diameter
- Larger Networks have a smaller Strongly Connected Component
- Highly Dynamic
- NOT Random Graphs
- Small world property not satisfied

#### Are they structured in a similar fashion?

No

## Results – RQ2 Network-layer inter-dependencies



#### Overlapping Nodes identified by:

- In-Degree
- Page-Rank
- Betweenness centrality

## Results – RQ3 Targeted Attacks - Strategy

Sort nodes according to <u>Betweenness Centrality</u> metric (descending)

Remove nodes one by one

Calculate size of Largest Connected Component

#### Targeting overlapping nodes

Removal of less than 10% of overlapping nodes

Network	Bitcoin	Bitcoin Cash	Litecoin	ZCash
Largest Connected Component Reduction	40%	70%	20%	25%

#### Summary

- Blockchain Overlay Networks follow are structurally different
- Significant number of overlapping nodes
- Resilience to random failures is high
- Resilience to targeted attacks is questionable
- Network connectivity is paramount for security => New protocols are needed.

Pre-print: arxiv.org/abs/2104.03044

Dataset: https://drive.google.com/drive/folders/111508SY8U9NLZARzhc01Q-8Vzdn3WaSy

#### Related Work

- Maya Dotan et al. 2020. SOK: cryptocurrency networking context, state-of-the-art, challenges.
- Matthias Grundmann, Till Neudecker, Hannes Hartenstein.
  - 2018. Exploiting Transaction Accumulation and Double Spends for Topology Inference in Bitcoin.
- Sergi Delgado Segura, et al. 2019. TxProbe: Disco vering Bitcoin's Network Topology Using Orphan Transactions.

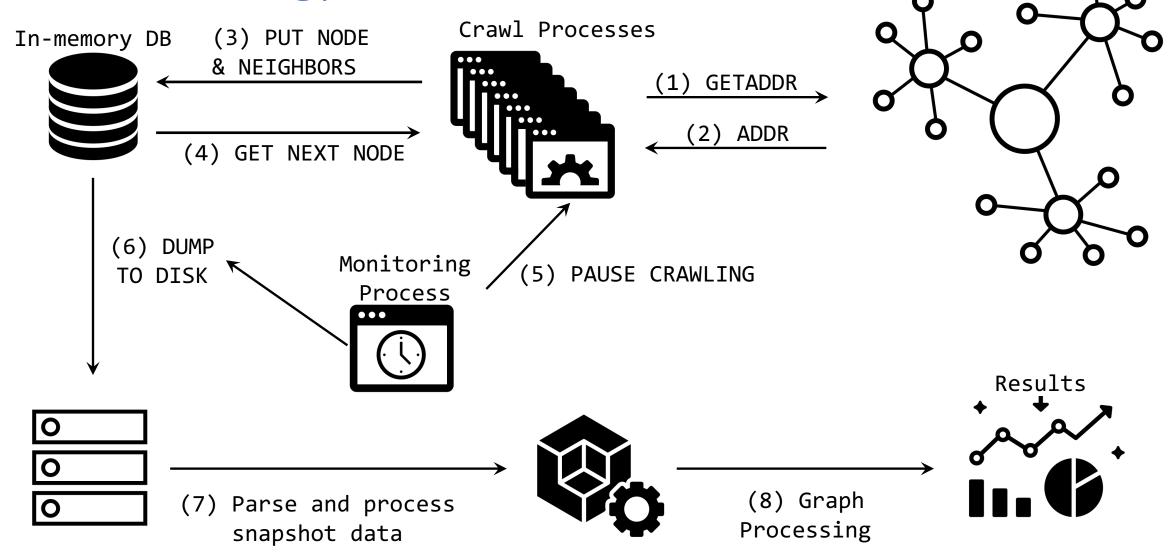
#### Related Work

- Andrew Miller et al. 2015. Coinscope: Discovering Bitcoin's Network Topology and Influential Nodes
- T. Neudecker, P. Andelfinger and H. Hartenstein. 2016. "Timing Analysis for Inferring the Topology of the Bitcoin Peer-to-Peer Network"
- Wang, Liang, and Ivan Pustogarov. "Towards better understanding of bitcoin unreachable peers."

#### Related Work

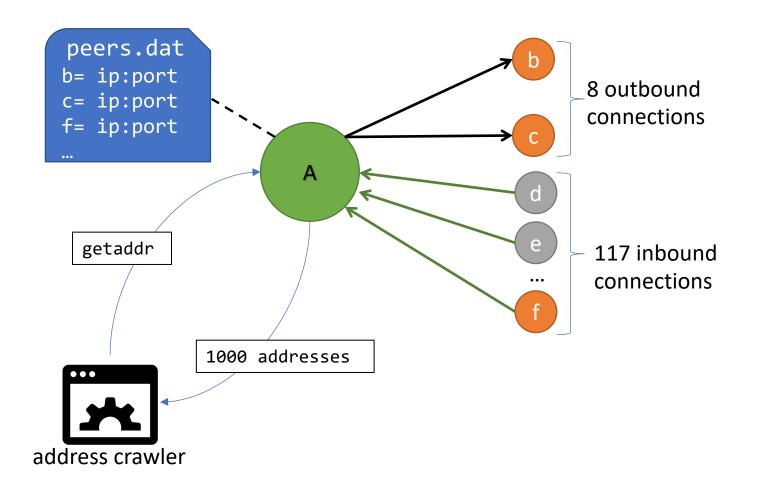
- Qawi K Telesford et al. 2011. The Ubiquity of Small-world Networks.
- TopoShot: uncovering Ethereum's network topology leveraging replacement transactions
  - 100% accuracy -> Very high cost (\$15000 to map 1000 Ethereum nodes)

#### Methodology



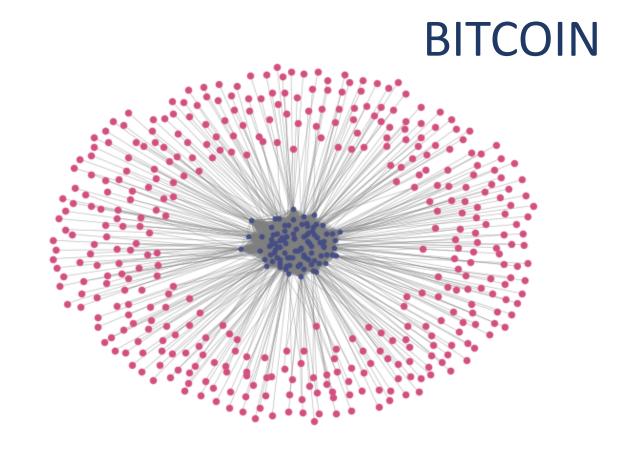
Network	Bitcoin	Bitcoin Cash	DASH	Doge	Ethereum	Litecoin	ZCash
Nodes	120k	33k	9k	2.1k	17.5k	11.7k	4.1k
Edges	37M	748k	29M	330k	556k	3.7M	231k
Conn. Comp.	1	1	1	1	0.99	1	1
SCC	0.06	0.03	0.75	0.2	0.13	0.14	0.06
Diameter	4	4	3	3	5	3	4
Density	0.004	0.001	0.5	0.11	0.004	0.047	0.024

Network	Bitcoin	Bitcoin Cash	DASH	Doge	Ethereum	Litecoin	ZCash
Avg. Degree	254	20	2370	126	31	278	48
Assortativity	-0.2	-0.64	-0.06	-0.13	-0.02	-0.01	-0.22
Reciprocity	0.32	0.21	0.49	0.34	0.02	0.27	0.25
Global CC	0. 049	0.011	0.166	0.286	0.002	0.07	0.3
Avg. Shortest Path	2.5	2.8	1.9	1.7	3.7	1.9	1.7

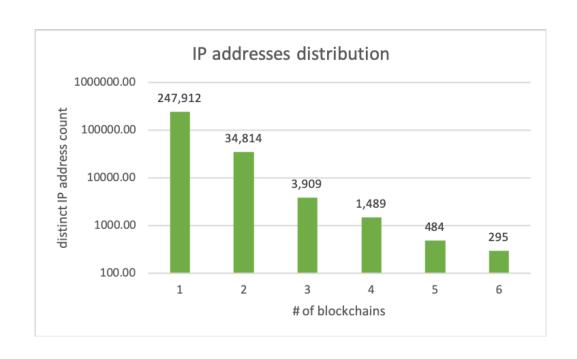


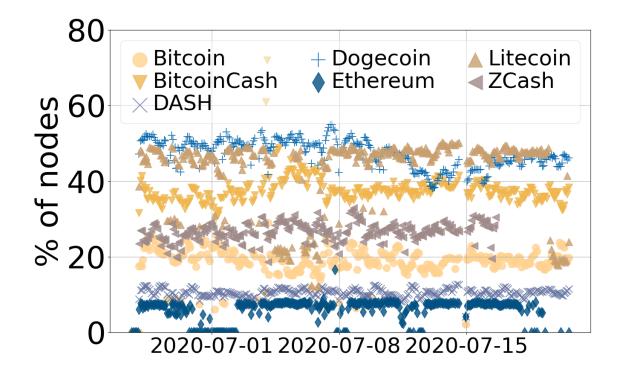
# Bitcoin address management

# Sample view of synthesized Connectivity Graph



# Results Network-layer inter-dependencies



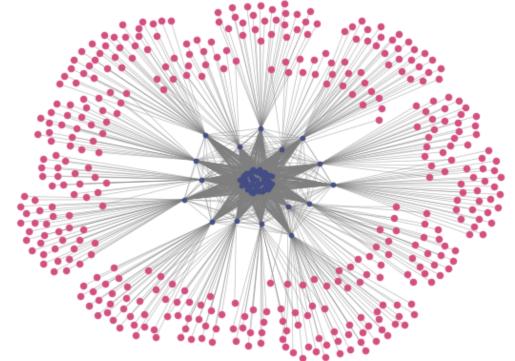


### Spatial placement of nodes

- 20% of highly connected Bitcoin nodes collocated in the same AS
- Highly connected overlapping nodes collocated in a single AS
- Distribution per blockchain
  - Ethereum highly connected nodes are spread in 500 ASes
  - Bitcoin in 200
  - BitcoinCash / DASH / Dogecion in 160
  - ZCash / Litecoin in 65

## Sample view of synthesized connectivity graph

#### **BITCOIN**

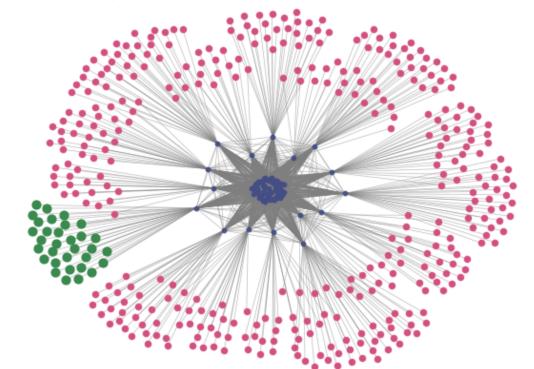


Strongly Connected Core

10x unreachable nodes to the perimeter

## Removal of a single node in the core

#### **BITCOIN**



Strongly Connected Core

10x unreachable nodes to the perimeter

Unreachable peers:

establish 3.5 connections (avg)

are involved in propagation of

43% of transactions

[Wang and Pustogarov '17]

## Risks in network partitioning

- Facilitate 51% attacks
- Selfish mining
- Double spending
- Increased fork rate
- Node / Transaction censoring
- Attack based on external incentives

#### Summary

- Network connectivity is paramount
- Significant number of overlapping nodes
- Resilience of an artificial network with increased connectivity is easily disrupted
- Even if nodes increase connections not a great benefit is expected
- New protocols are needed!

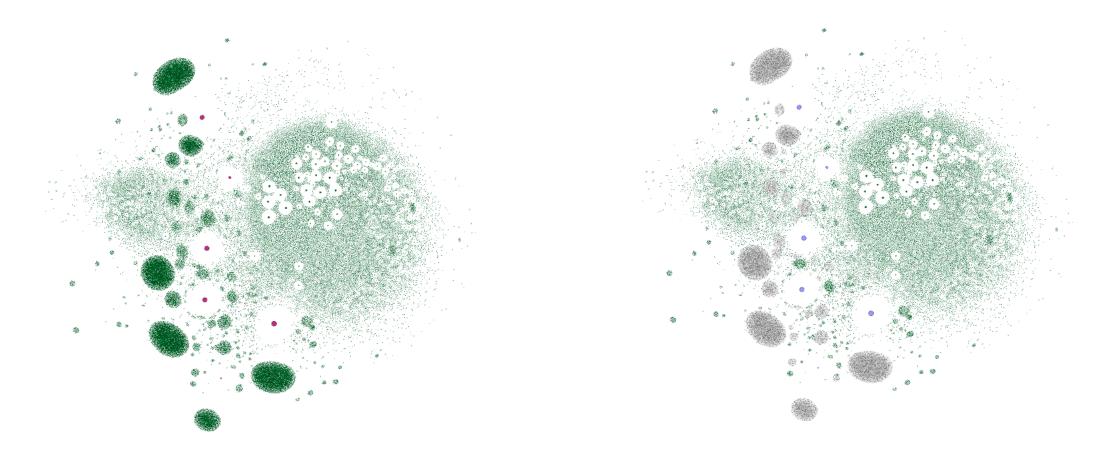
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[1] S. Delgado-Segura, C. Pérez-Solà, J. Herrera-Joancomartí, G. Navarro-Arribas, and J. Borrell, 'Cryptocurrency Networks: A New P2P Paradigm', Mobile Information Systems, vol. 2018, p. 2159082, Mar. 2018.



drawn using the Yifan Hu Multilevel layout algorithm, Gephi

