## Visualization + Analysis

#### Blockchains Are

- Networks
- Time-series

#### Visualization

- Quickly spot properties
- Quickly spot inconsistencies
- Ask better questions

#### This Lecture

- Analyze some properties of cryptocurrencies
- Tools
- Data Sources
- Insights
- Sample code

## Distributions

#### Distributions

- Distributions of:
  - Transaction Fees
  - Wallet net worths
  - Bitcoin Script Usage
  - Whales

#### Bitcoin Transaction Fees

- BTC
  - Satoshi per byte
    - 100mn Satoshis = 1 BTC

#### Ethereum Transaction Fees

- ETH
  - Gas
  - 21000 Gas = Base fee
    - Just transferring funds
    - Put down Gas Price
    - Pay Gas Price \* Gas Used
    - Put down Gas limit

#### Bitcoin Transaction Fees

Fee	Txns
0	8380
1	9407071
2	2841101

## Why Zeros?

- Possibly:
  - Miners' own transactions
  - Incredible generosity
  - Off-chain payment

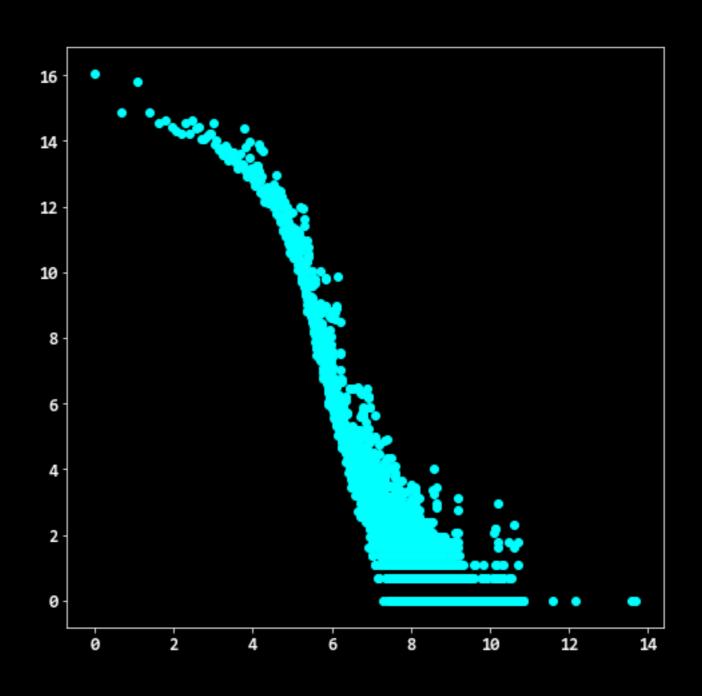
#### Most Common Fee

Fee	Txns
1	9407071
3	7448408
4	2863087
	••••

#### Distribution

- Raw bar chart bad for viz (large variance).
- Solution:
  - log/log plot

# Log-Log Plot



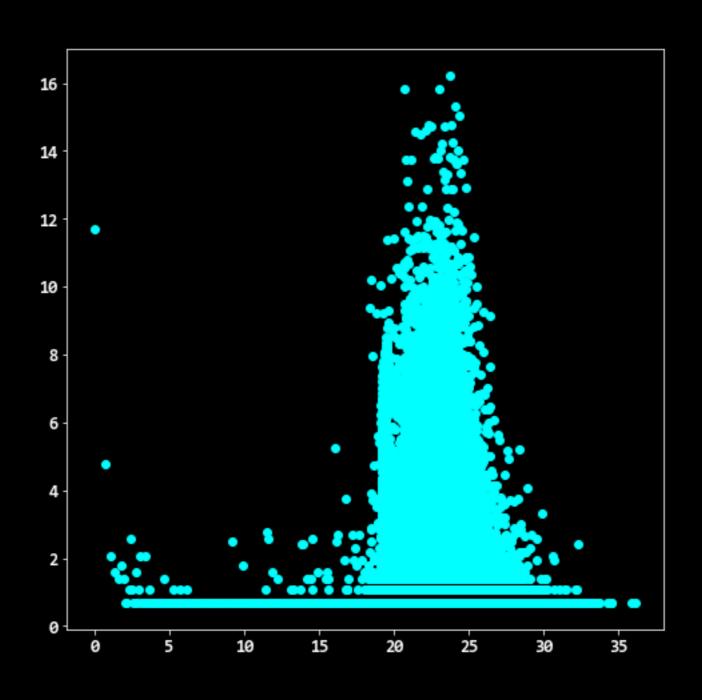
# Log-Log Plot

• Seems like a truncated power law

#### Power Laws

- 80/20 Rule
- Internet Networks
- Traffic Arrival Times
- Zipf
- Twitter followers

## Ethereum Gas Prices



# log-normal?

#### Ethereum Gas Prices

Fee	Txns
0	121023
1	117
2	7

#### Most Common Fee

Fee	Txns
2000000000	11107198
100000000	7354494
1000000000	7339890

#### Zero Gas Prices?

- https://www.reddit.com/r/ethereum/comments/7lx1do/
  a\_christmas\_mystery\_sweepers\_and\_zero\_gas\_price/
- <a href="https://medium.com/chainsecurity/zero-gas-price-transactions-what-they-do-who-creates-them-and-why-they-might-impact-scalability-aeb6487b8bb0">https://medium.com/chainsecurity/zero-gas-price-transactions-what-they-do-who-creates-them-and-why-they-might-impact-scalability-aeb6487b8bb0</a>

#### Time-Series

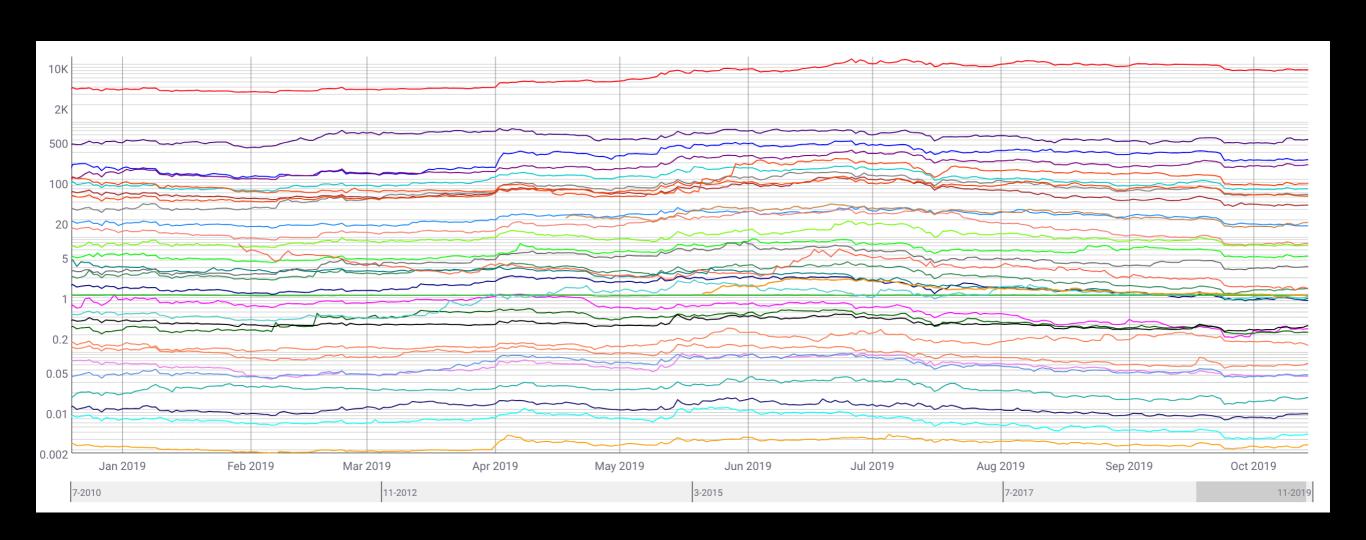
#### Correlate With Events

- Correlation to fiat?
- Correlation to other coins?

#### Other Coins



#### YTD



Col1	Col2

Col1	Col2
Rank=2	Rank=3
Rank=10	Rank=5
Rank=5	Rank=2
Rank=3	Rank=1

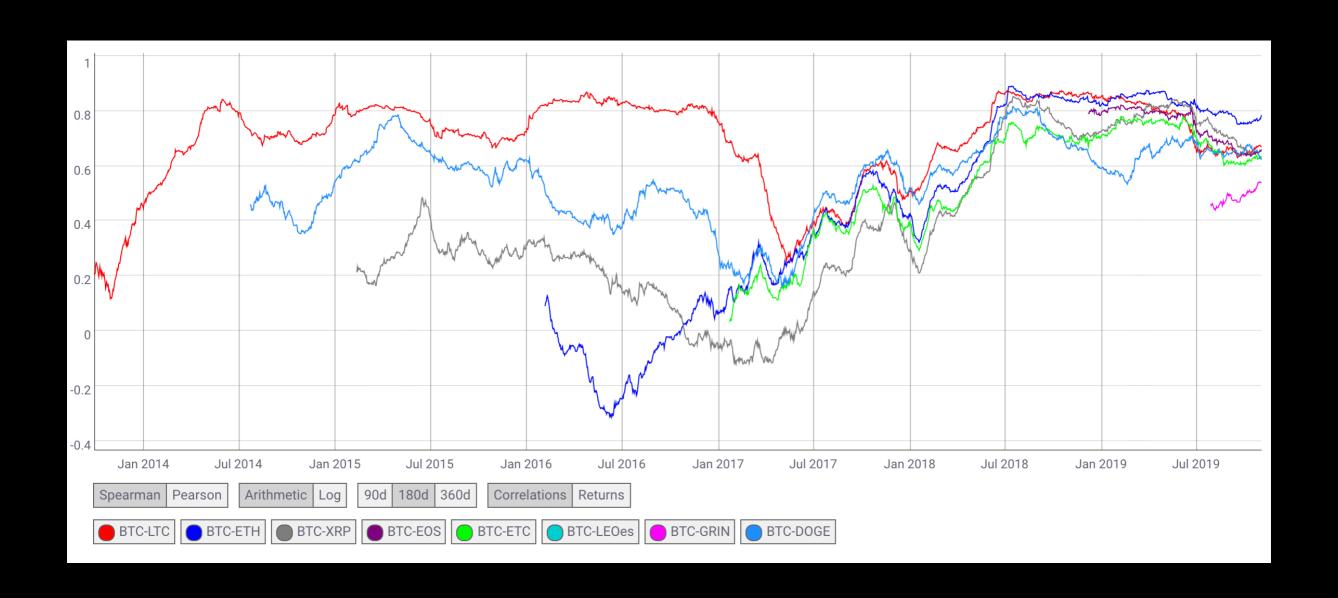
- Row-wise difference squared : d^2
- Sum up these row-wise differences

$$R_s = 1 - \left(\frac{6\Sigma d^2}{n^3 - n^2}\right)$$

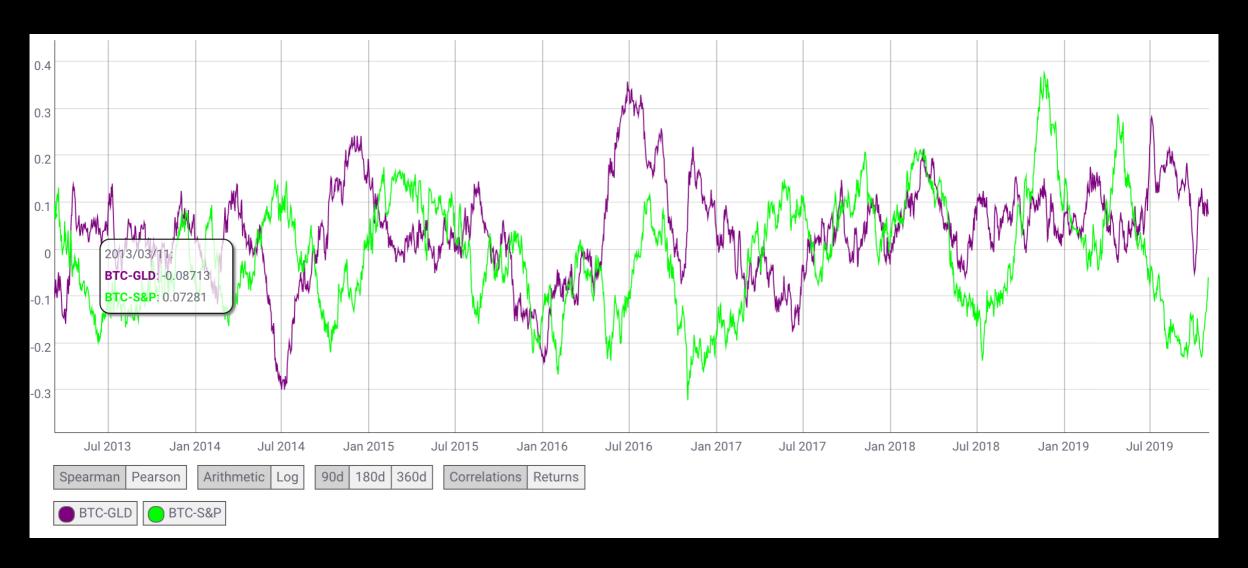
• +1/-1: Strong positive / Strong negative

• 0 : No correlation

#### Correlation Charts - Coins



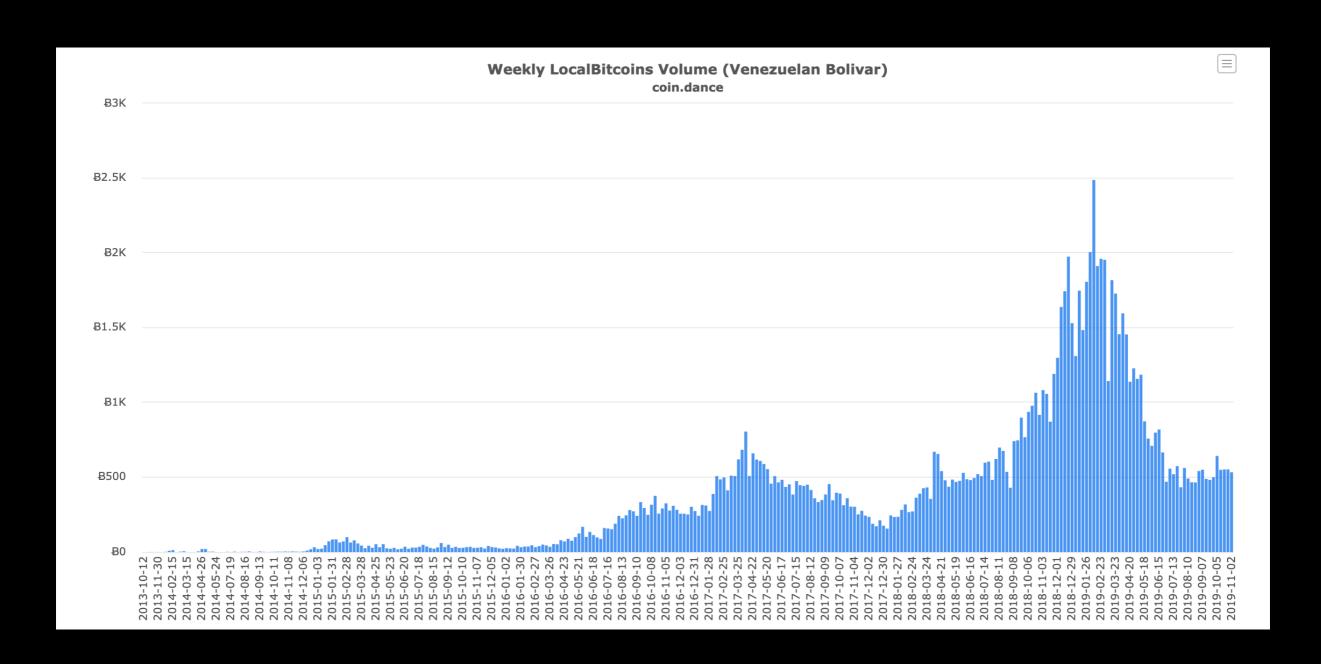
# Correlation Charts - BTC v. Fiat



#### So?

- Looks like there is almost no correlation to fiat
- Coins almost all move in lock-step
- Implications?

#### BTC Volume Events



## Network

## Visualizing Networks

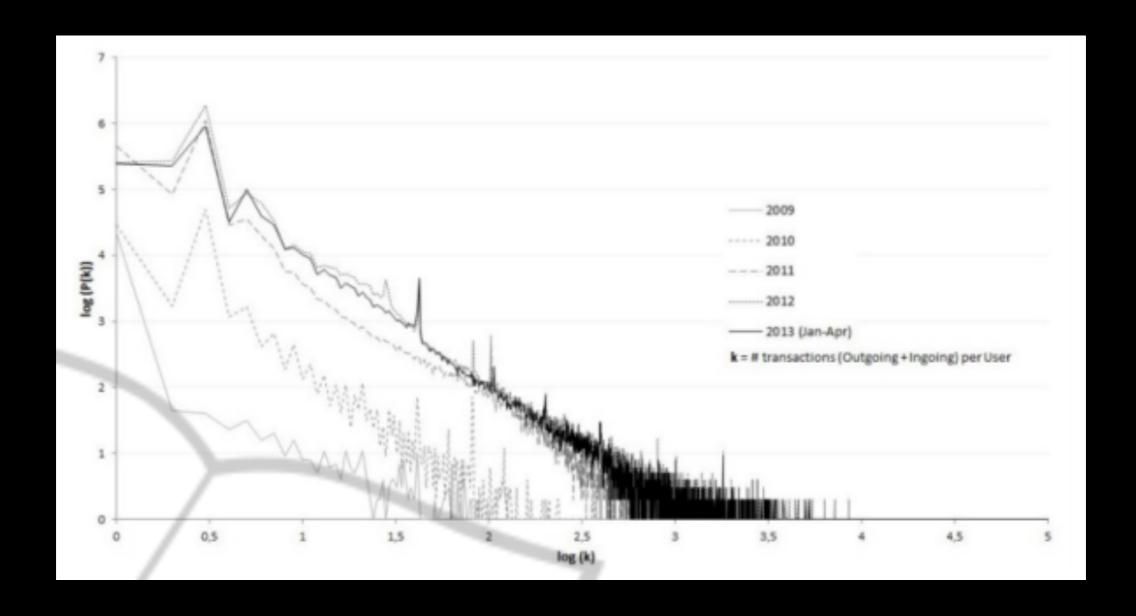
- Slightly complex with bitcoin
- The Bitcoin graph:
  - Nodes: wallet addresses
  - Edges: Spends

## Visualizing Networks

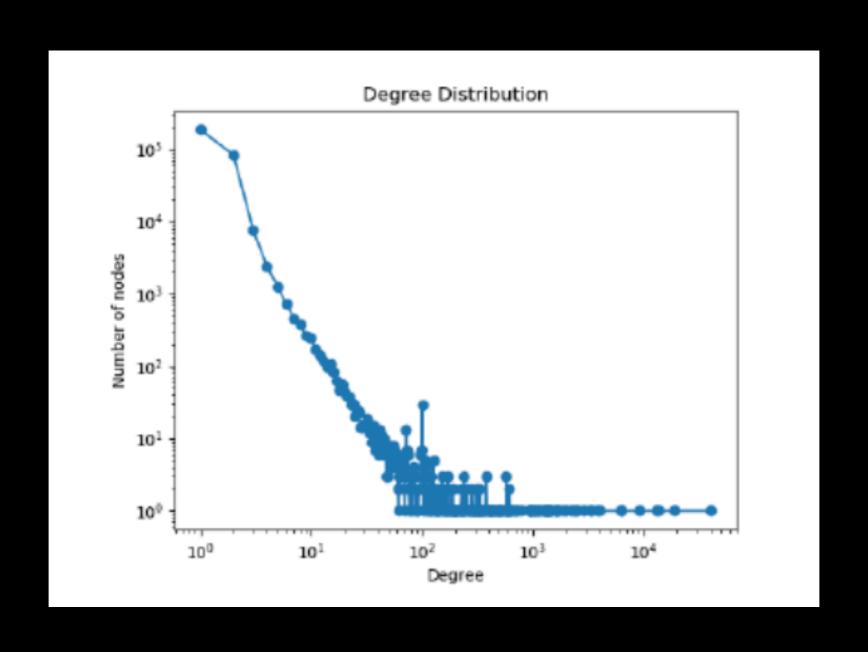
- Best practices contribute 1 or 2 nodes each transaction
- In practice this seems to be 50%

# Degree Distributions

Seems to be power law:

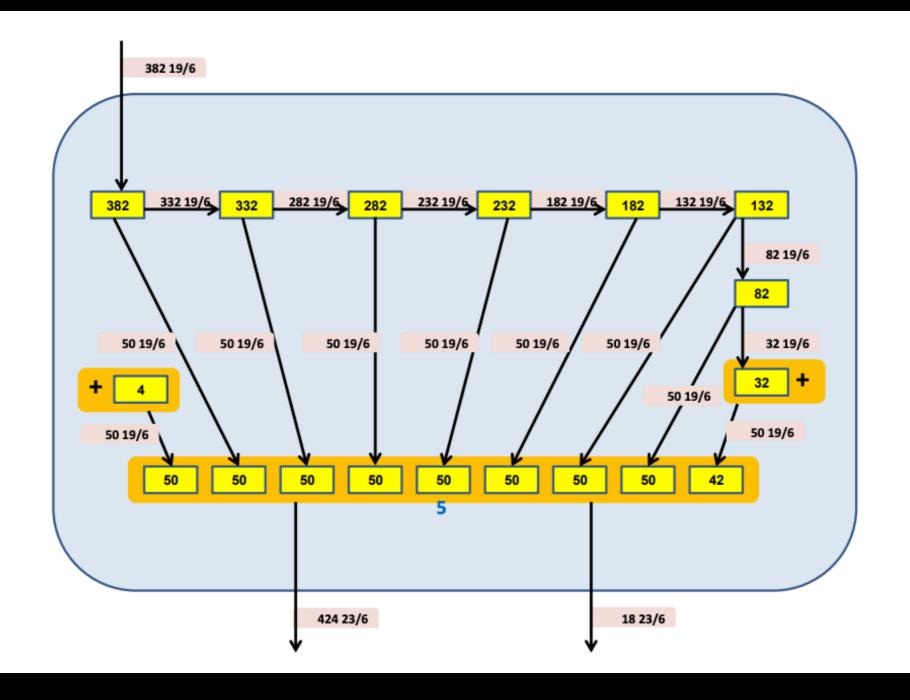


## Ethereum



#### Transaction Patterns

- Fork-merge:
  - Large amount in wallet
  - Split into many smaller wallets
  - Finally after a long trip merged into single wallet
- Binary tree-like structure:
  - Transaction + Change
  - Splitting your amount into 2
- Long Chains



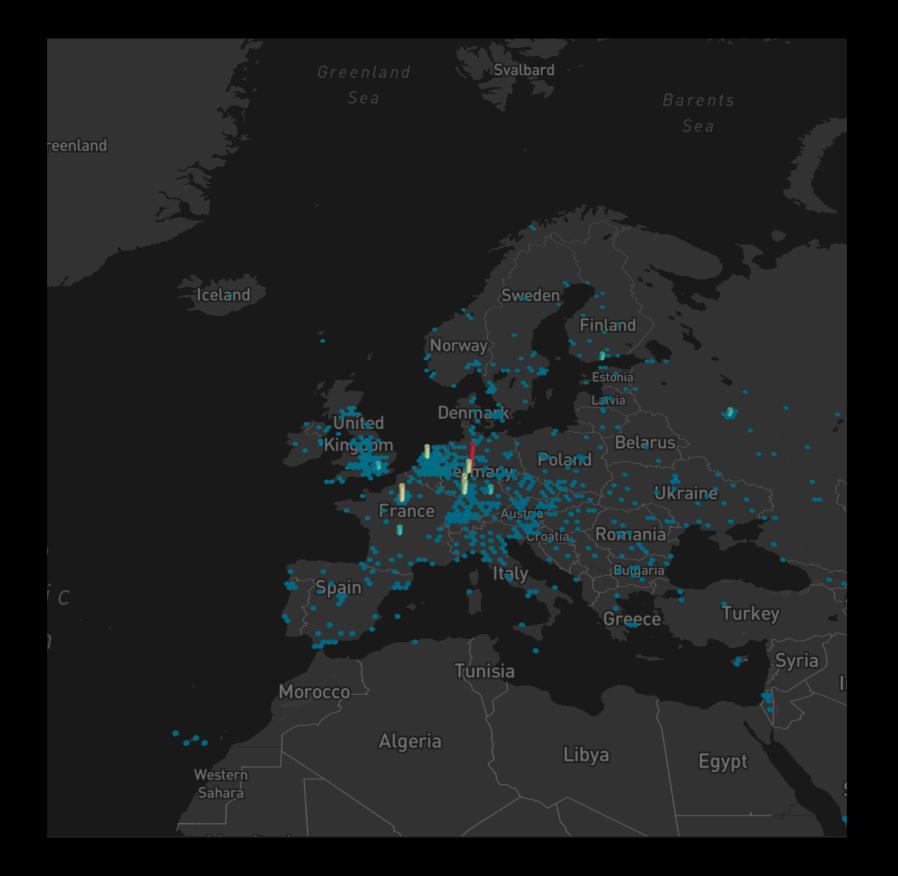
## Insights From Degree

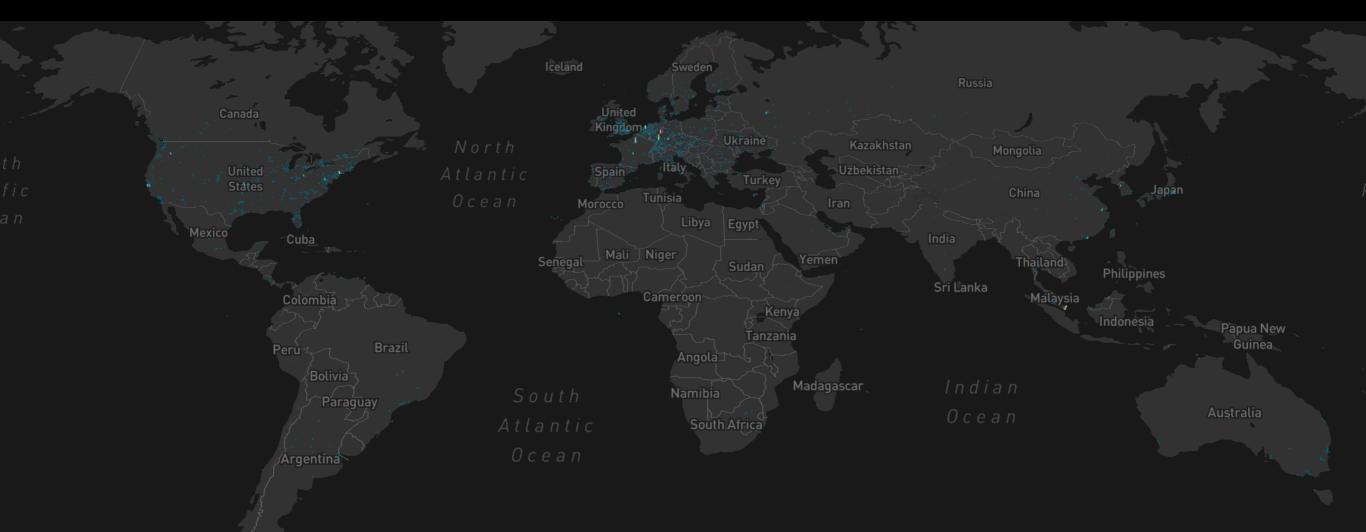
- What about degree 1:
  - Likely money transferred to same individual
- Large outdegree:
  - Possibly automated transaction

# GeoSpatial

#### Hard Because

- Many won't expose an IP address
- Many won't respond to API calls that identify their address
- Not very trustworthy





#### Visit At

https://blockchaincourse.onai.com/node\_viz/

# Questions?