

Self-stabilization and expansion of a simple dynamic random graph model for Bitcoin-like unstructured P2P networks

Francesco Pasquale♦

based on a joint work with

L. Becchetti♥, A. Clementi♦, E. Natale♠, and L. Trevisan♣



♥Sapienza Università di Roma, ♦Tor Vergata Università di Roma,
♣UC Berkeley, ♠Université Côte d'Azur

Algorithmic Aspects of Temporal Graphs II

Patras, Greece, July 9, 2019

Cryptocurrencies: The Bitcoin Revolution

Bitcoin P2P e-cash paper

Satoshi Nakamoto | Sat, 01 Nov 2008 16:16:33 -0700

I've been working on a new electronic cash system that's fully peer-to-peer, with no trusted third party.

The paper is available at:

<http://www.bitcoin.org/bitcoin.pdf>

The main properties:

- Double-spending is prevented with a peer-to-peer network.

- No mint or other trusted parties.

- Participants can be anonymous.

- New coins are made from Hashcash style proof-of-work.

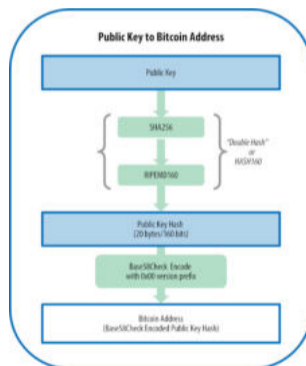
- The proof-of-work for new coin generation also powers the network to prevent double-spending.

Cryptocurrencies: The Bitcoin Revolution

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Bitcoin

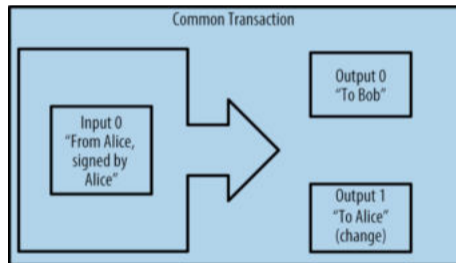
► Addresses



Cryptocurrencies: The Bitcoin Revolution

Bitcoin

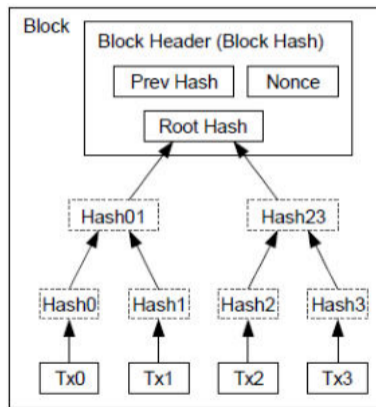
- ▶ Addresses
- ▶ **Transactions**



Cryptocurrencies: The Bitcoin Revolution

Bitcoin

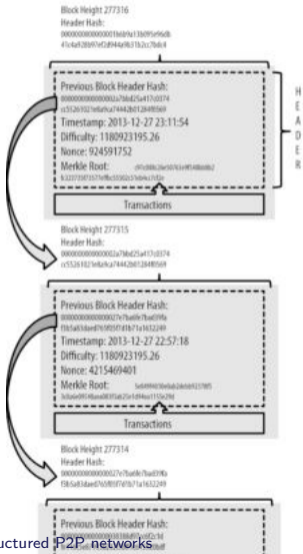
- ▶ Addresses
- ▶ Transactions
- ▶ **Blocks**



Cryptocurrencies: The Bitcoin Revolution

Bitcoin

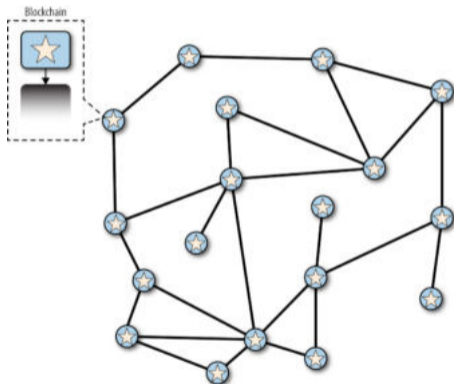
- ▶ Addresses
- ▶ Transactions
- ▶ Blocks
- ▶ **Blockchain**



Cryptocurrencies: The Bitcoin Revolution

Bitcoin

- ▶ Addresses
- ▶ Transactions
- ▶ Blocks
- ▶ Blockchain
- ▶ **P2P network**

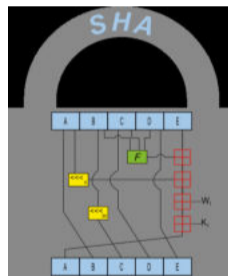


Cryptocurrencies: The Bitcoin Revolution

Bitcoin

- ▶ Addresses
- ▶ Transactions
- ▶ Blocks
- ▶ Blockchain
- ▶ P2P network
- ▶ **Mining and Consensus**

Proof of Work



$$f(\text{block-header}) < \text{target}$$

The Bitcoin P2P Network

GLOBAL BITCOIN NODES DISTRIBUTION

Reachable nodes as of Sun Jul 07 2019 22:40:19 GMT+0200 (CEST).

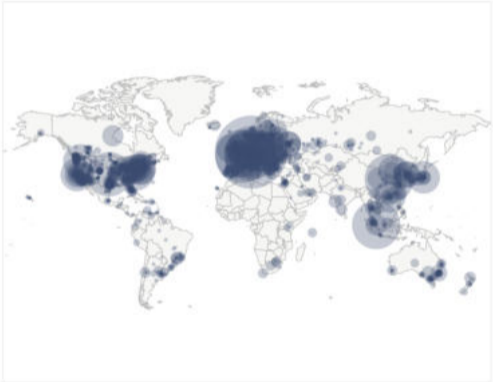
10118 NODES

[24-hour charts »](#)

Top 10 countries with their respective number of reachable nodes are as follow.

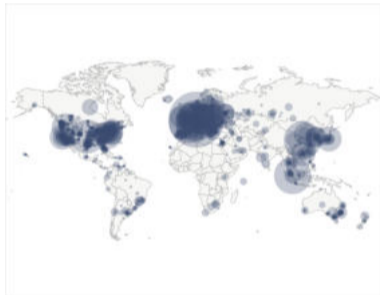
RANK	COUNTRY	NODES
1	United States	2456 (24.27%)
2	Germany	1931 (19.08%)
3	n/a	624 (6.17%)
4	France	612 (6.05%)
5	Netherlands	514 (5.08%)
6	China	426 (4.21%)
7	Canada	344 (3.40%)
8	United Kingdom	295 (2.92%)
9	Singapore	286 (2.83%)
10	Russian Federation	246 (2.43%)

[More \(103\) »](#)



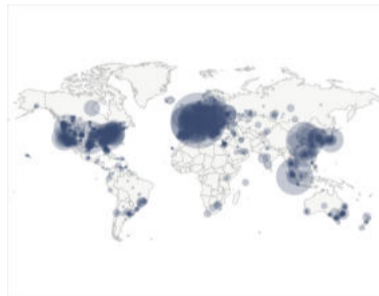
The Bitcoin P2P Network

- ▶ Initially: DNS queries
- ▶ List of active nodes periodically updated and advertised
- ▶ Minimum of 8 connections initiated
- ▶ Maximum 125 connections



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Question

Network structure?

Bitcoin Topology Inference

- ▶ Miller et al.
Discovering bitcoin's public topology and influential nodes
2015
- ▶ Neudecker et al.
Timing analysis for inferring the topology of the bitcoin peer-to-peer network
2016
- ▶ Delgado-Segura et al.
TxProbe: Discovering Bitcoin's Network Topology Using Orphan Transactions
2018

A simple dynamic graph model

$G(n, d, c)$ dynamic random graph

$$\left\{ \begin{array}{ll} n & : \text{ number of nodes} \\ d & : \text{ minimum required degree} \\ c \geq 1 & : \text{ "tolerance" } (cd = \text{ maximum degree}) \end{array} \right.$$

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Self-stabilization and expansion

When (If) the process terminates all nodes have

$$d \leq \text{degree} \leq cd$$

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Question 1

How long it takes to settle?

Question 2

Structure of the resulting graph?

RAES

Request a link, Accept if Enough Space

Directed graph $G = (V, E)$

- ▶ $d_{\text{out}} = d$ (outgoing links)
- ▶ $d_{\text{in}} \leq cd$ (max number of incoming links)

At each round, each node $u \in [n]$, independently of the other nodes:

- If u has $d_{\text{out}} < d$ outgoing links then u picks $d - d_{\text{out}}$ nodes uniformly at random $v_1, \dots, v_{d-d_{\text{out}}}$ and “requests” edges $\{u, v_1\}, \dots, \{u, v_{d-d_{\text{out}}}\}$
- If u receives $> cd$ incoming requests, u “rejects” all requests of the last round

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Observation

Once a link is “accepted” it is “settles”

Self-stabilization

Question 1

How long it takes to settle?

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Stabilization

For every $d \geq 1$, $c > 1$, and $\beta > 1$, process terminates within $\beta \log(n) / \log(c)$ rounds, with probability at least $1 - d/n^{\beta-1}$.

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Proof sketch

- ▶ Parallel balls-into-bins problem
(nd “link requests” [balls] in ncd “available slots” [bins])
- ▶ At each round each request has constant probability to be accepted

Expansion

Question 2

Structure of the resulting graph?

Expander Graph

A graph $G = (V, E)$ is an ε -*expander* if, for every subset $U \subset V$ with $|U| \leq n/2$, number of edges in the cut $(U, V - U)$ at least $\varepsilon \cdot \text{vol}(U)$.

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Complex dependencies among edges of the resulting graph

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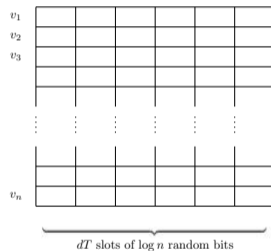
Theorem

A sufficiently-small constant $\varepsilon > 0$ exists such that for sufficiently large constants d and c resulting random graph G is ε -expander w.h.p.

Expansion

Proof idea: **Encoding argument**

- ▶ $nTd \log n$ total random bits
 - ▶ n nodes
 - ▶ T rounds
 - ▶ d out-neighbors
 - ▶ $\log n$ bits per sample



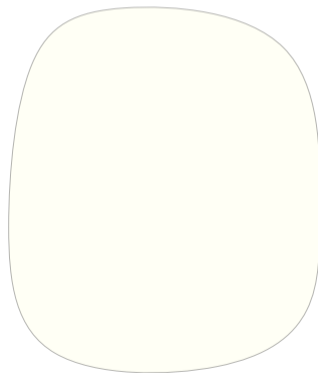
Expansion

Proof idea: **Encoding argument**

- ▶ $nTd \log n$ total random bits

Total number of bit strings

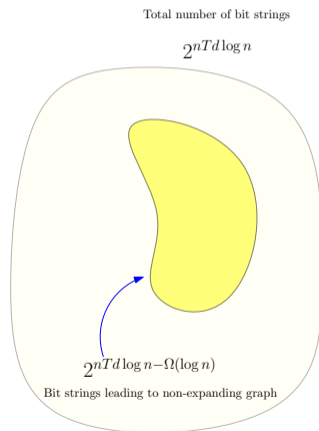
$$2^{nTd \log n}$$



Expansion

Proof idea: **Encoding argument**

- ▶ $nTd \log n$ total random bits
- ▶ Any bit string $R \in \{0, 1\}^{nTd \log n}$ leading to a non-expanding graph can be “encoded” losslessly with $nTd \log n - \Omega(\log n)$ bits.



Encoding argument

Proof Idea

- ▶ **If G is not an expander, then there is non-expanding set of nodes S ...**

Encoding argument

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- ▶ If G is not an expander, then there is non-expanding set of nodes S ...
- ▶ **...then the typical node in S will have a lot of neighbors in S ...**

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- ▶ **...provided that we already “encoded” who’s the set S ...**

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- ▶ **...this takes $\log \binom{n}{|S|}$ bits...**

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- ▶ ...then we can “encode” those link requests with $\log |S|$ bits instead of $\log n$...
- ▶ ...provided that we already “encoded” who’s the set S ...
- ▶ ...this takes $\log \binom{n}{|S|}$ bits...
- ▶ **...but we can save other bits suitably encoding accepted and rejected requests**

Encoding argument

Proof Idea

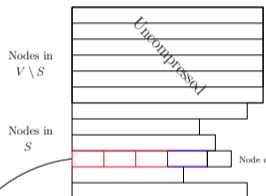
Table 1: Set S

Size	Index of the set
$2 \log S + \log \binom{n}{ S }$	

Table 3: Critical Nodes

Sizes	Indices of sets
$\sum_{t=1}^T \left[2 \log c_t + \log \binom{n}{c_t} \right]$	

Table 2



Field 1

Field 2

Field 3

Field 4

Subset A_v of accepted requests	Subset A_v^{out} of accepted requests in $V \setminus S$	Destinations of accepted requests outside S (uncompressed) + inside S (compressed)	Destinations of rejected requests	Unused randomness
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$$\text{Cost}(A_v) = 2 \log \ell_v + \log \binom{\ell_v}{d}$$

$$\text{Cost}(A_v^{\text{out}}) = 2 \log(\varepsilon_v d) + \log \binom{d}{\varepsilon_v d}$$

$$\text{Cost}(\text{Dest}(A_v)) = \varepsilon_v d \log \Delta + (1 - \varepsilon_v) d \log((1 - \delta) \Delta)$$

Semi-saturated / Critical	S.-sat. dest.	Crit. dest.	Crit. dest.	S.-sat. dest.	S.-sat. dest.	Crit. dest.
$\ell_v - d$	$\log(n/c)$	$\log c_{t_1}$	$\log c_{t_2}$	$\log(n/c)$	$\log(n/c)$	$\log c_{t_4}$

Bounded-degree expander inside a dense one

In this talk

Each node can sample **any** other node.

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Results smoothly apply to a slight generalization

Underlying Δ -regular graph with $\Delta = \Theta(n)$. Nodes can sample only their neighbors.

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Bounded-degree expander from a dense one

Parallel algorithm to find a bounded-degree expander inside a dense one.

Conclusions and future work

Conclusions

- ▶ Bitcoin P2P network as an interesting available dynamic network
- ▶ The protocol hides the network structure
- ▶ Encoding argument to prove properties of random graphs

Conclusions and future work

$G(n, d, c)$ dynamic random graph

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Conclusions and future work

$G(n, d, c, p)$ dynamic random graph

$$\left\{ \begin{array}{ll} n & : \text{ number of nodes} \\ d & : \text{ minimum required degree} \\ c \geq 1 & : \text{ "tolerance" } (cd = \text{ maximum degree}) \\ p & : \text{ edge failure probability} \end{array} \right.$$

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- *If u has degree $> cd$ then u picks one of its neighbors v uniformly at random and removes the edge $\{u, v\}$ from E*
- **Each edge $e \in E$ disappears with probability p**

Conclusions and future work

Ergodic Markov Chain

- ▶ Mixing time?
- ▶ Stationary random graph properties?

Conclusions and future work

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Proof techniques

Encodign argument doesn't seem to help.

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Further

Nodes joining and leaving the network.

Thank you!