

RepuCoin: Your reputation is your power

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(*) ABB Corporate Research Center, Switzerland

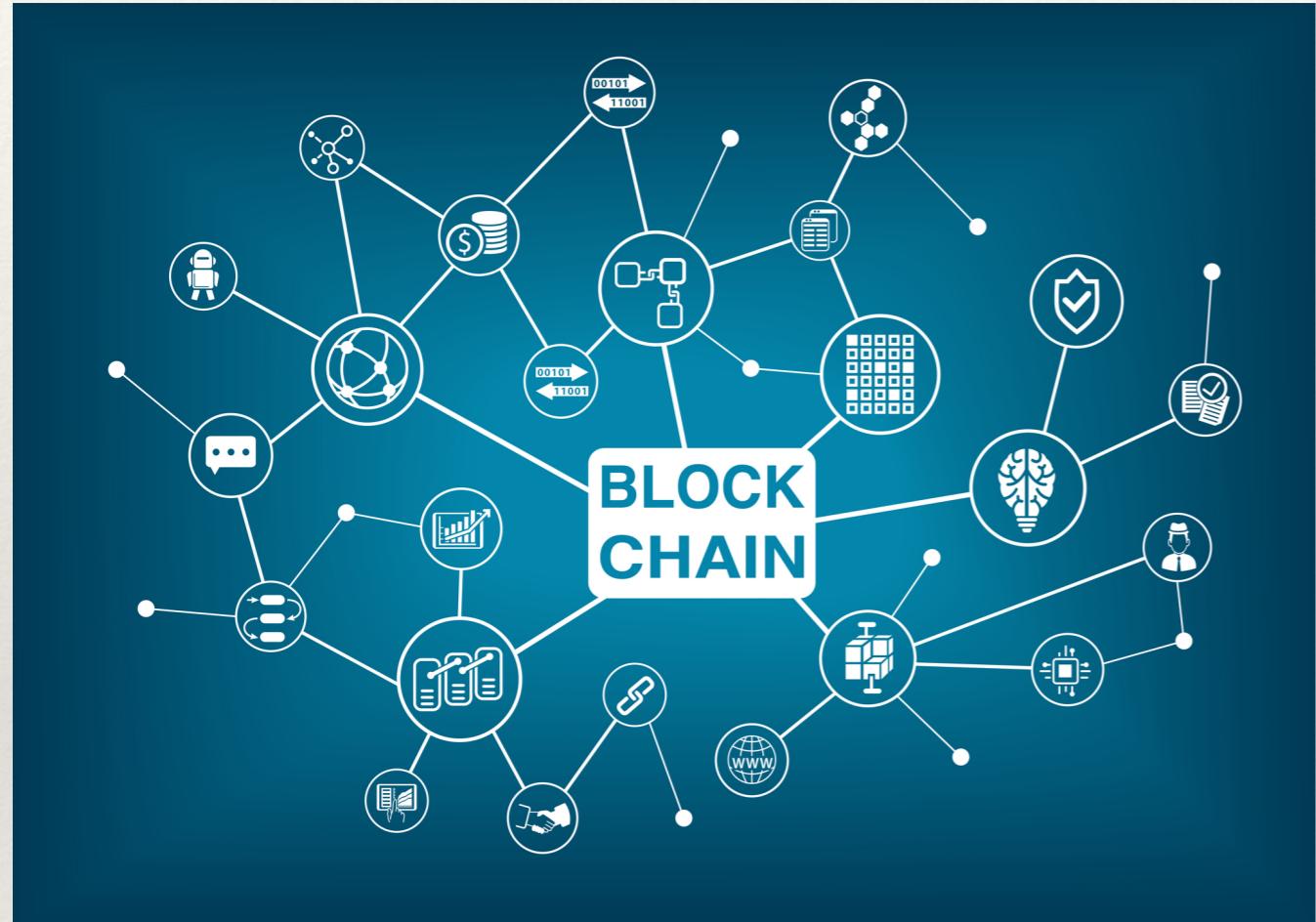
(†) SnT, University of Luxembourg, Luxembourg

What is Blockchain?

A distributed database records all activities as transactions



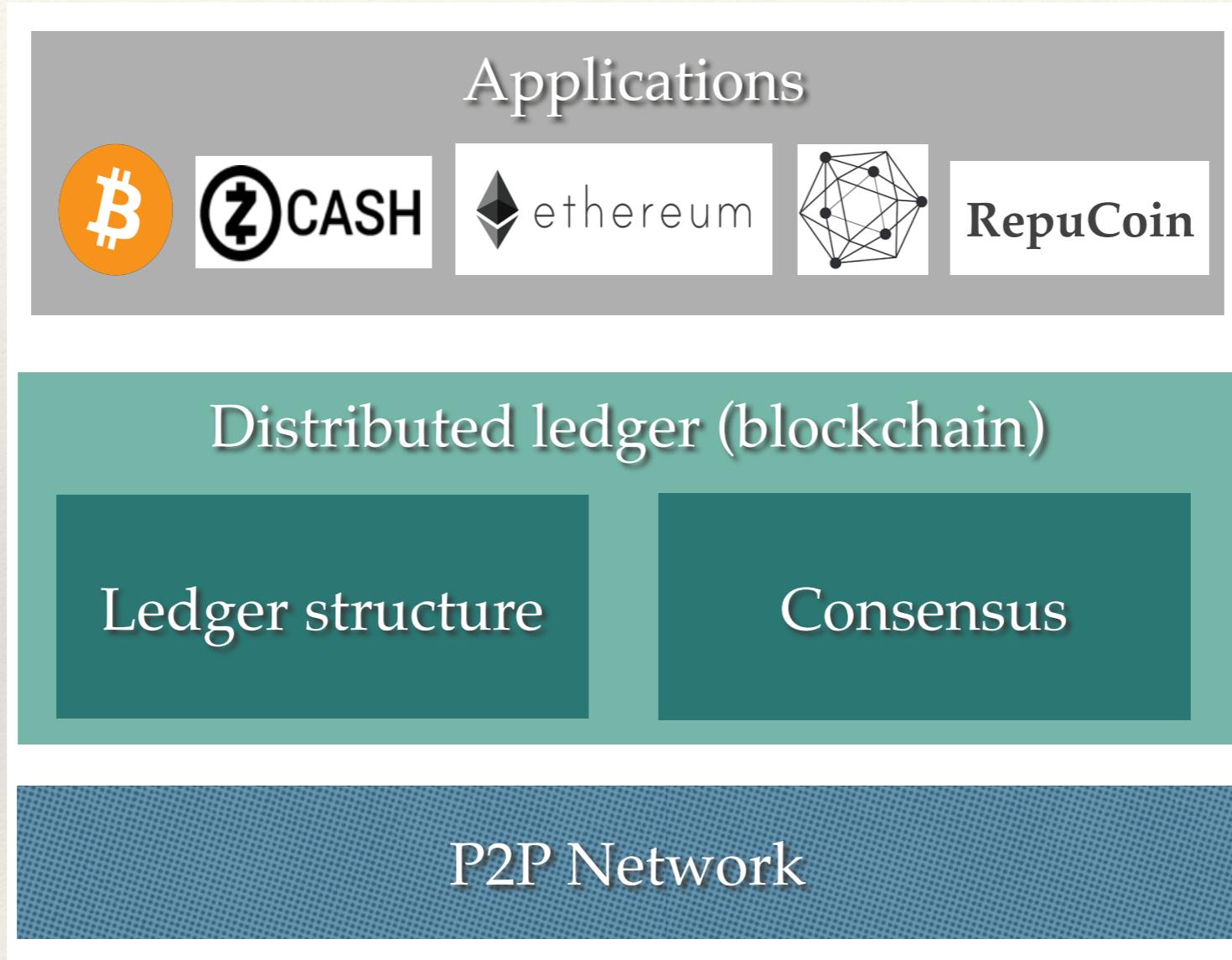
Why Blockchain?



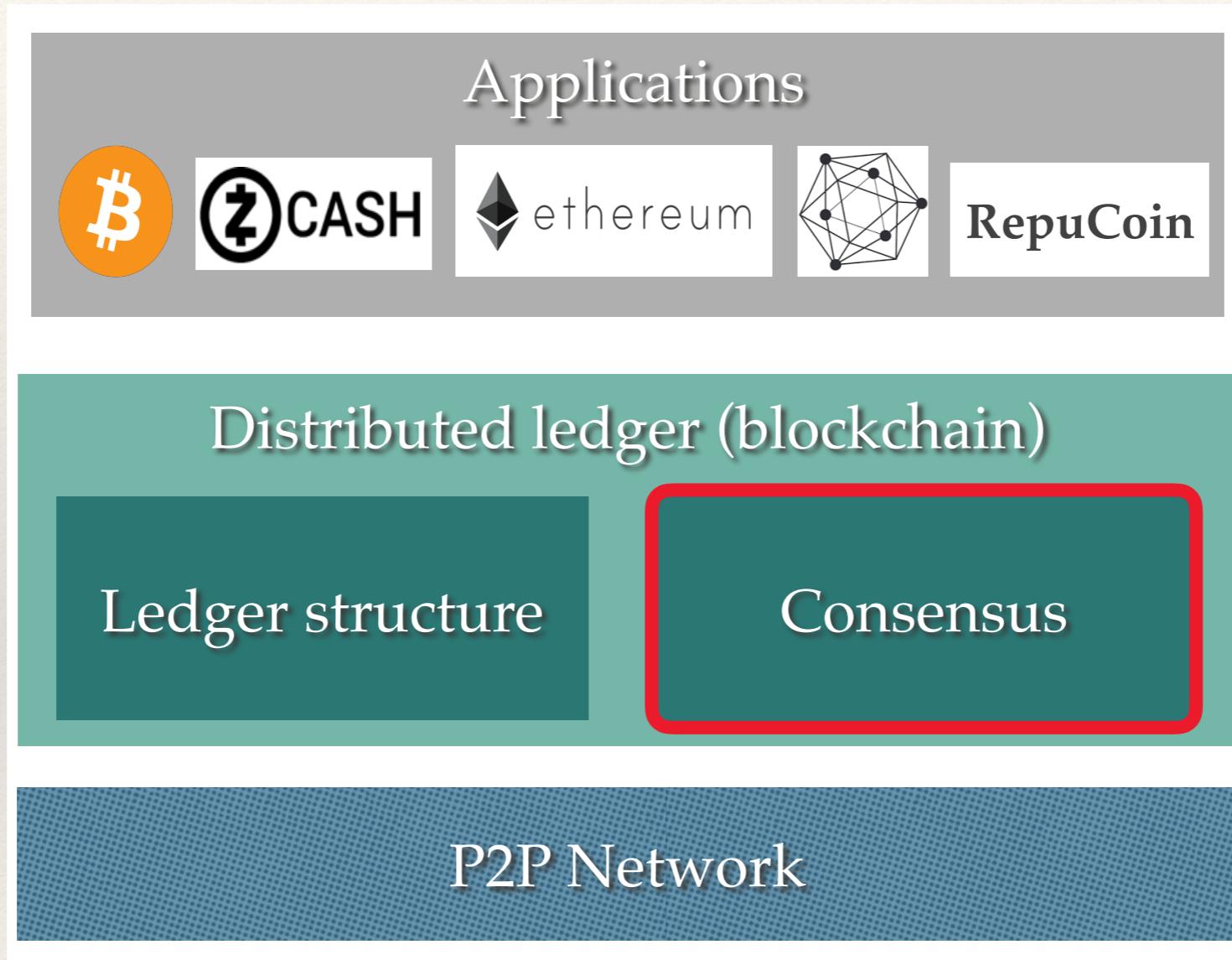
Goals:

- Secure: non-changeable history
- Robust: no single point of failure
- Transparent: everyone can read
- TTP free: everyone can write

Architecture



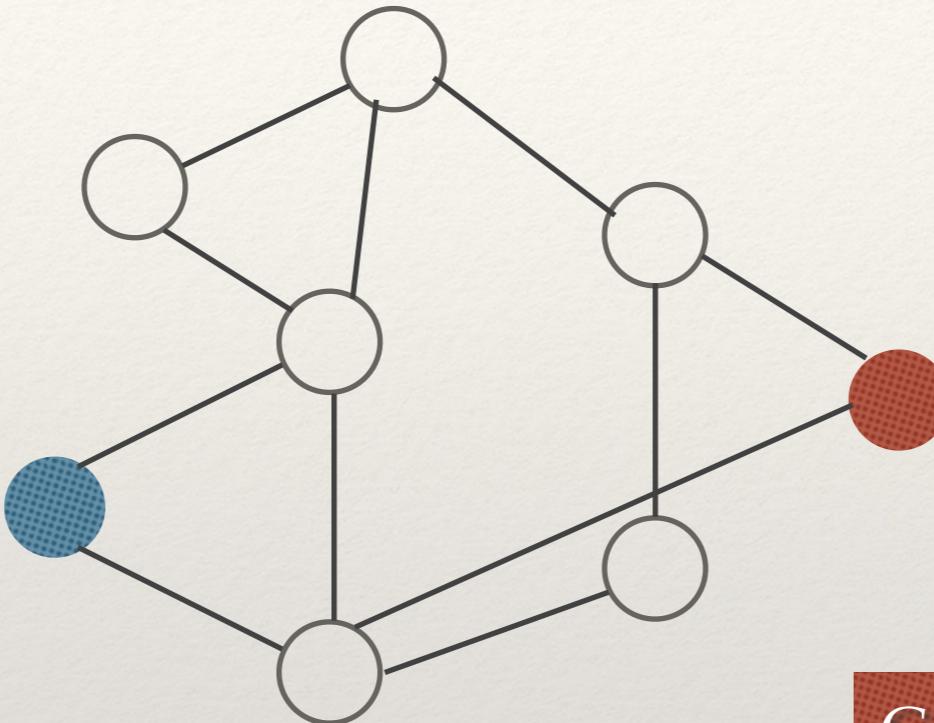
Architecture



Conflict transactions



Give my coin c_1 to Bob

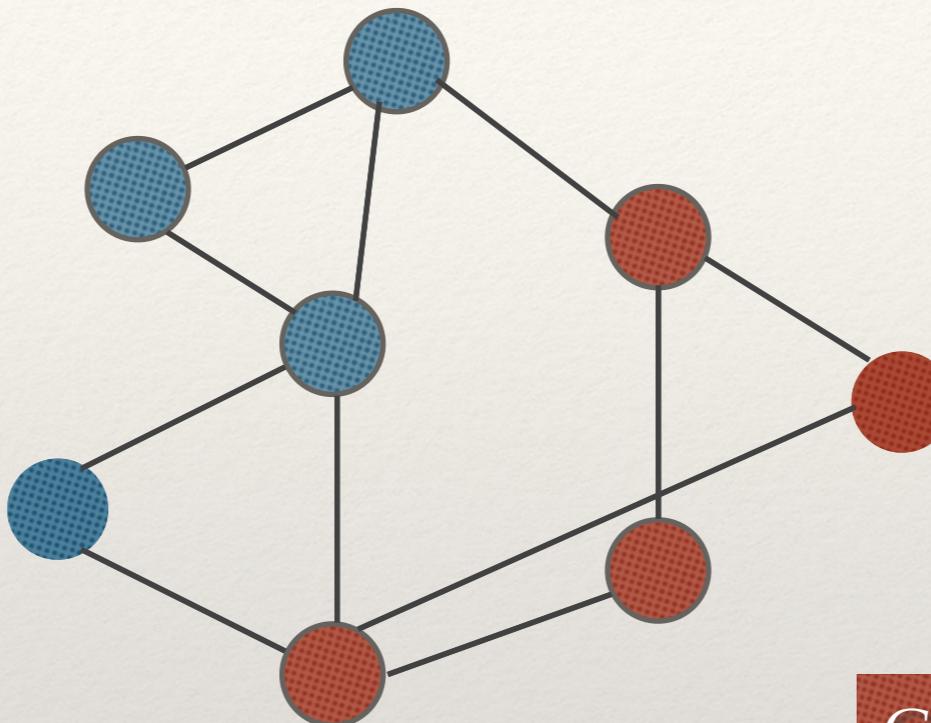


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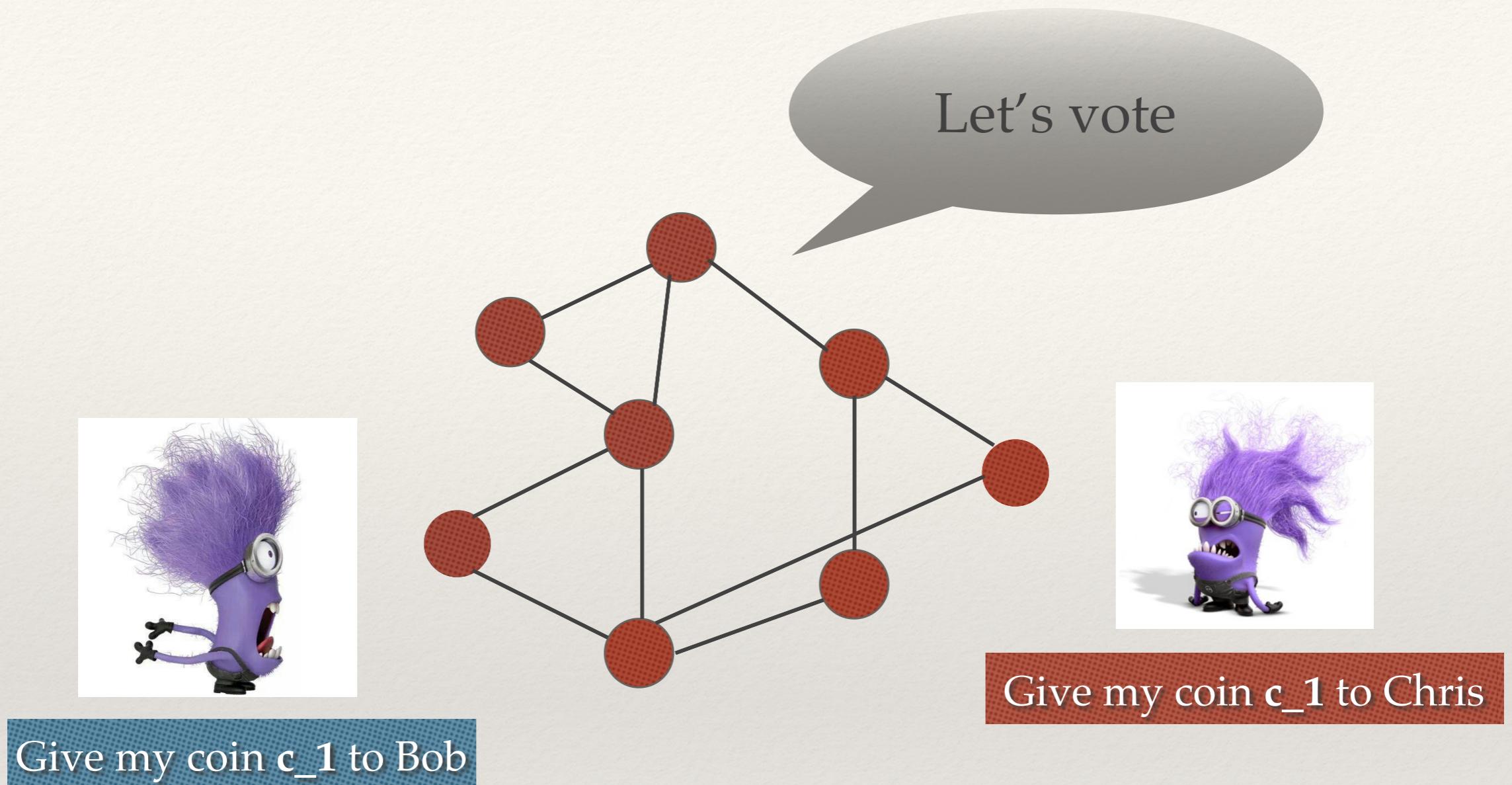


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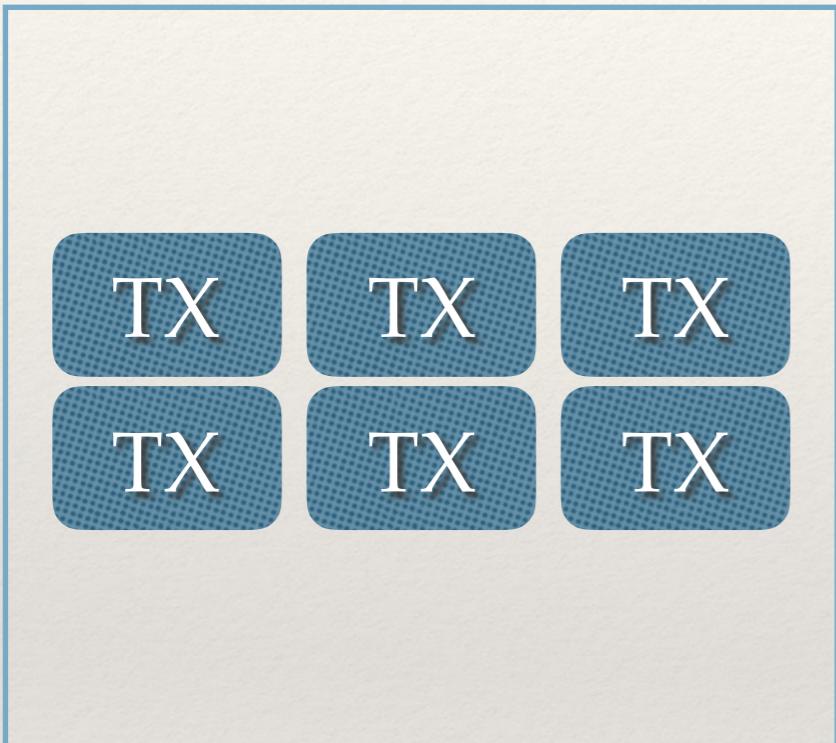


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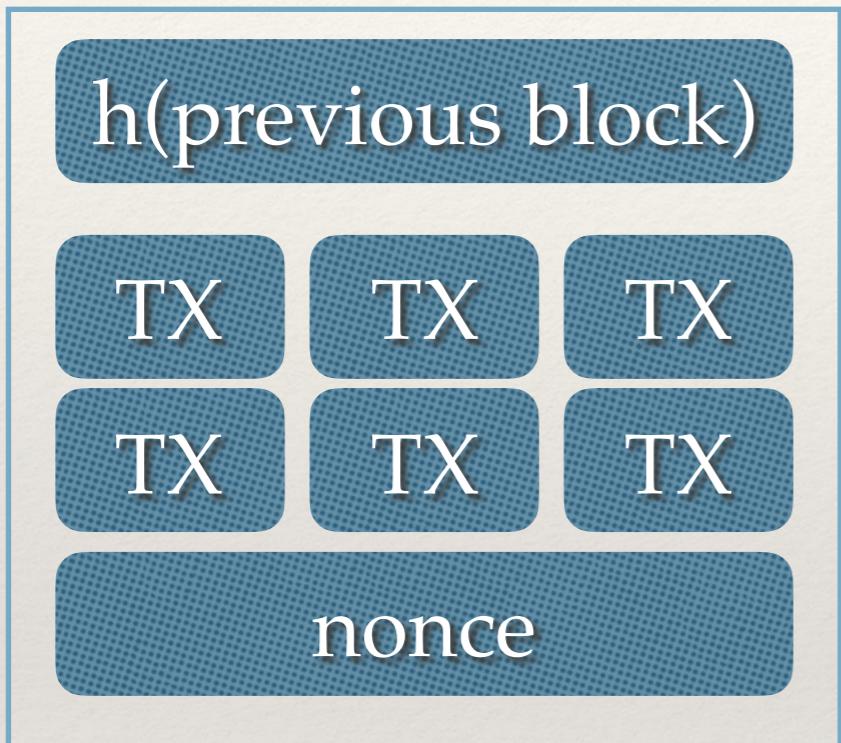
Bitcoin: Proof of work



A block

```
for nonce in range(0, 232):  
    if h(block) < target:  
        print ('success')  
        print (nonce)
```

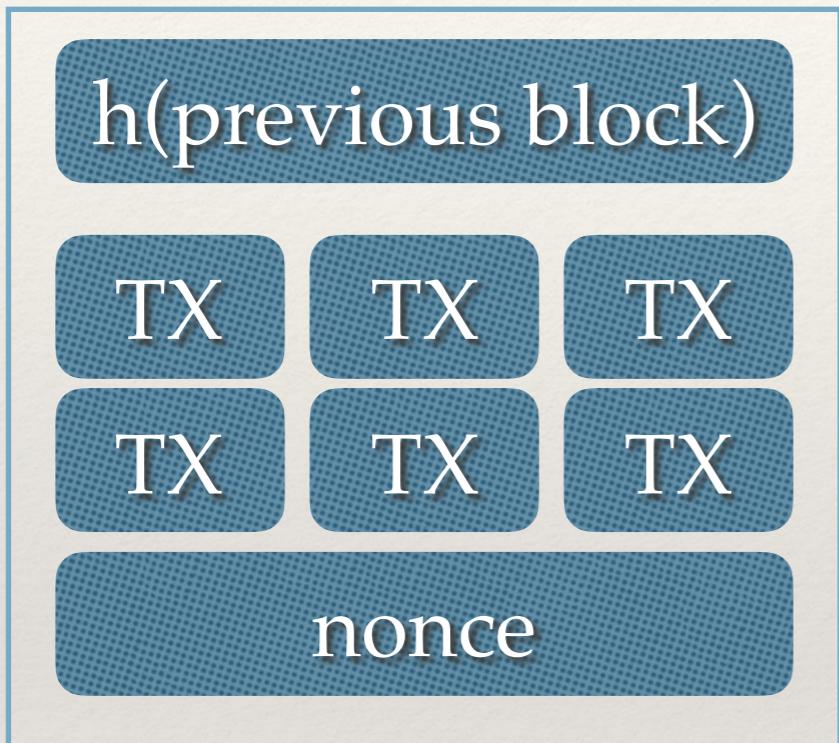
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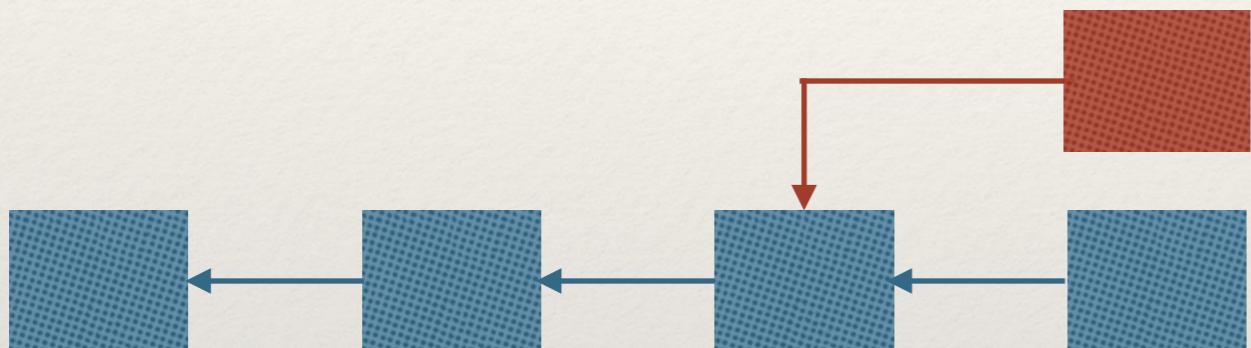


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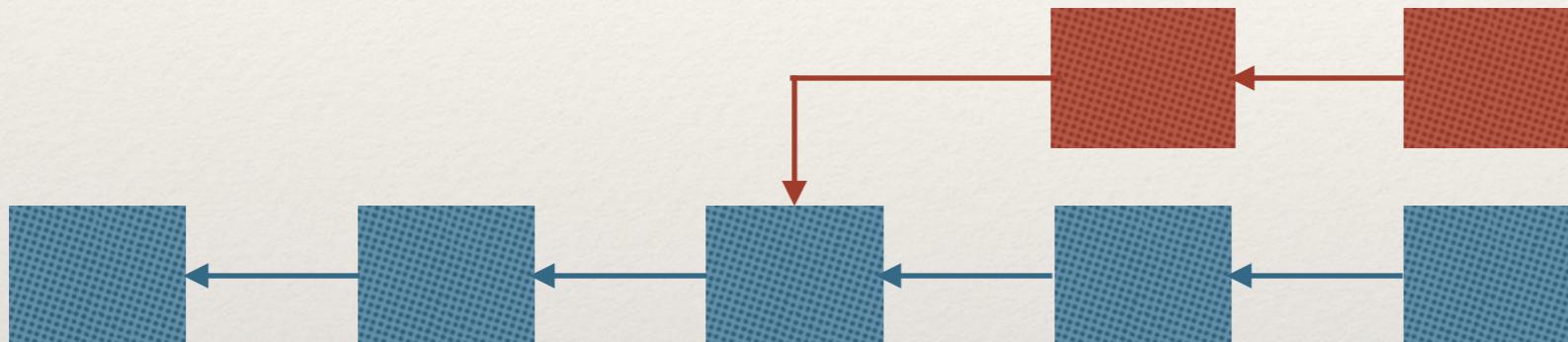
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Problem A: Slow TX validation
10 mins/block, 7 transactions per second (TPS)
Problem B: multiple valid solutions

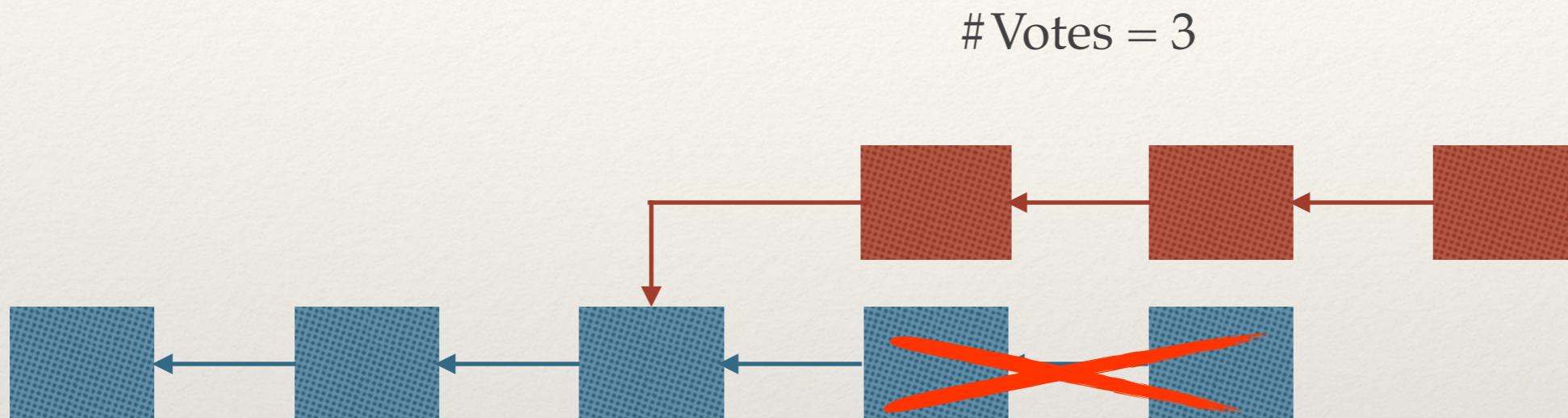
Blockchain: resolving forks



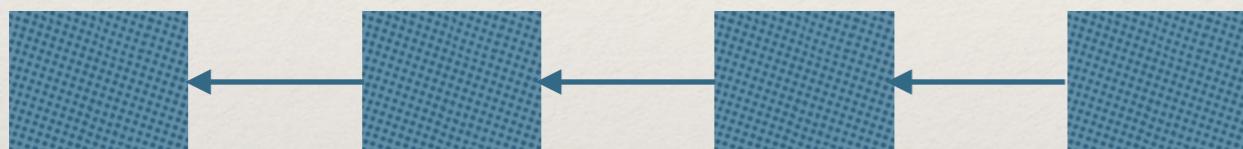
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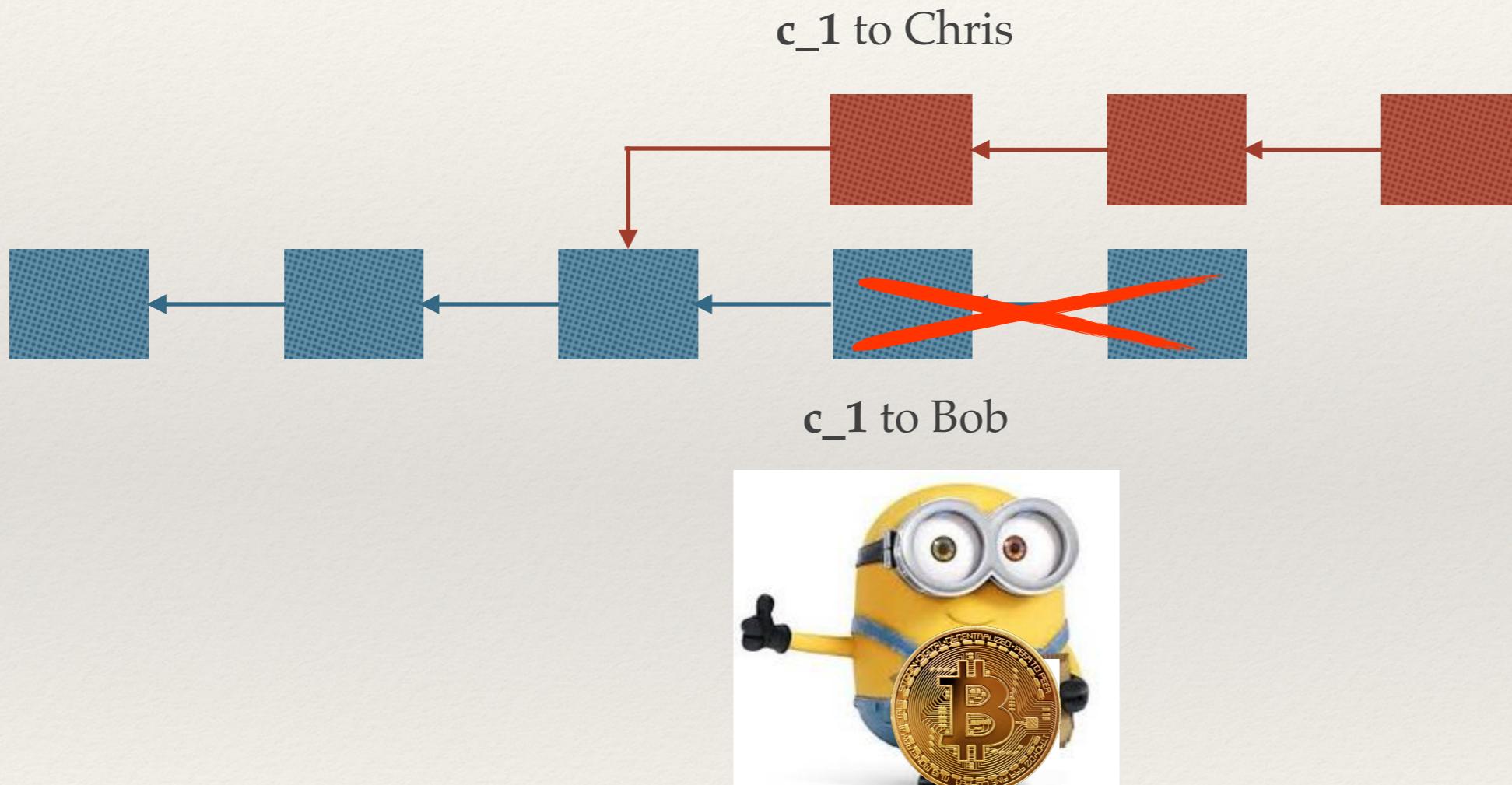
Double spending attack



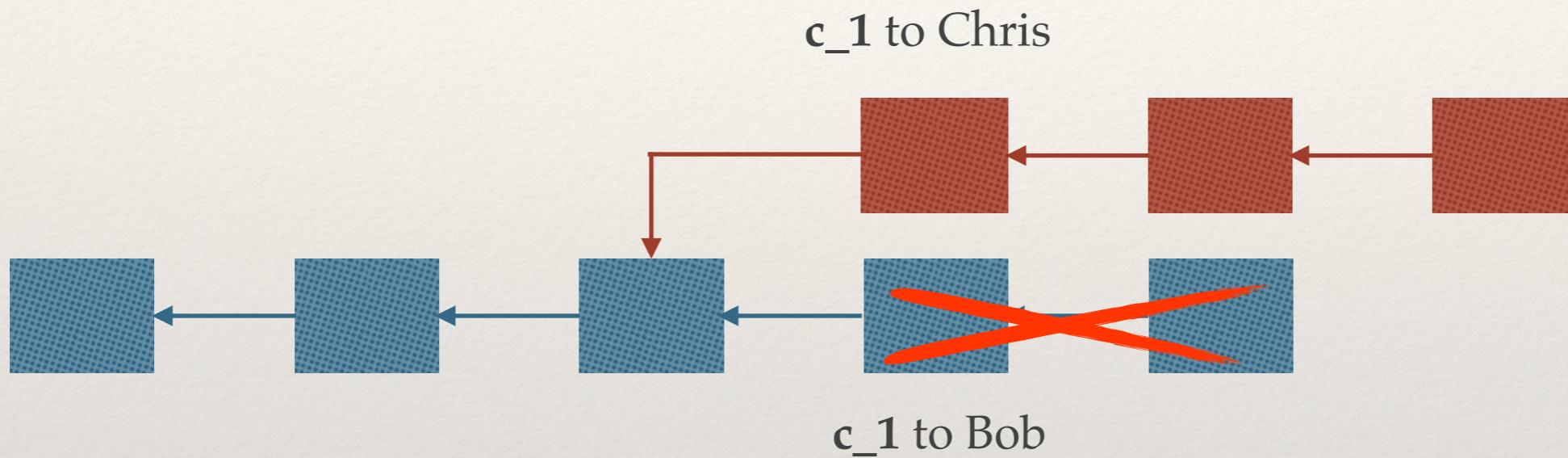
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Double spending attack



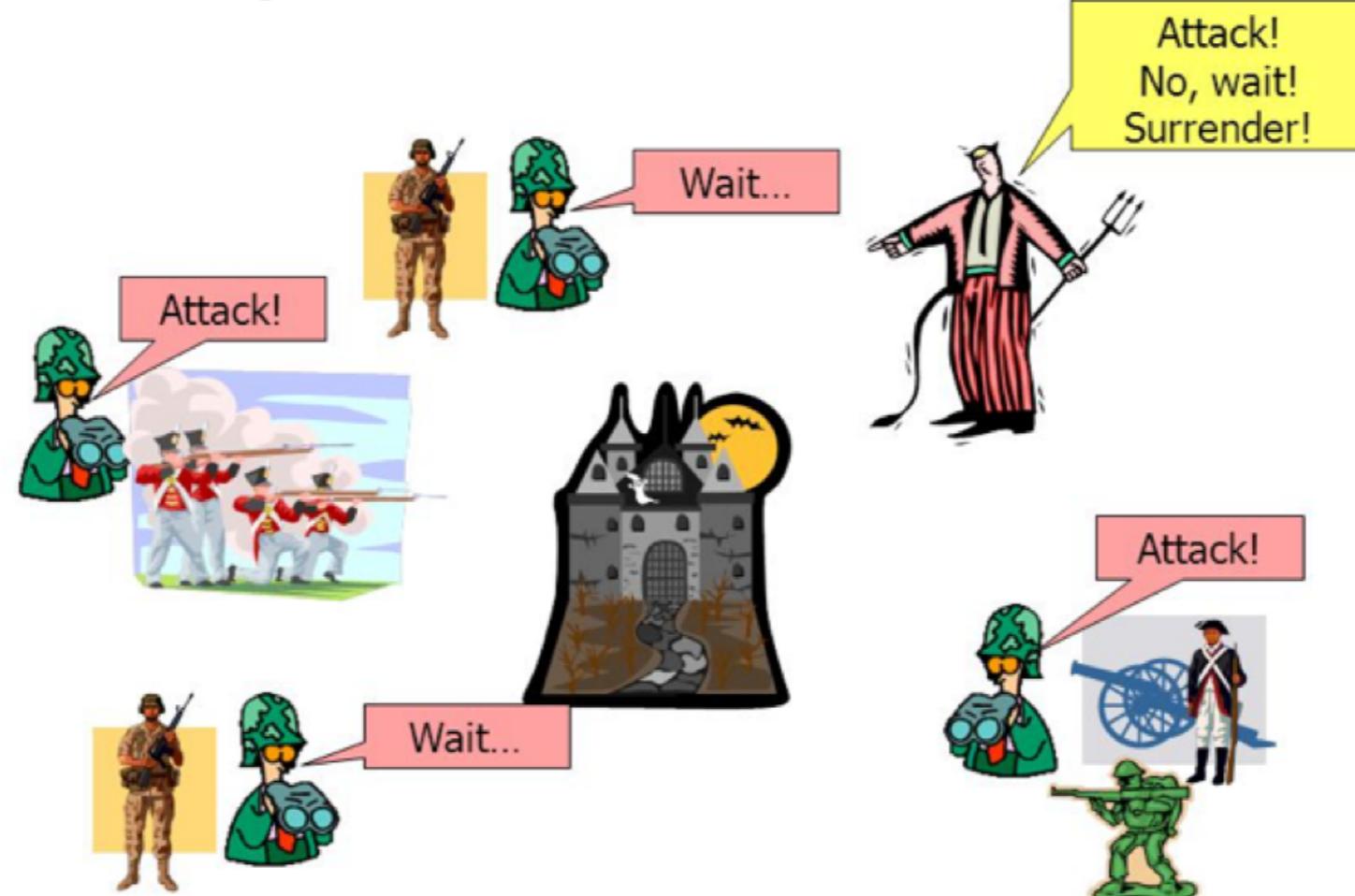
Double spending attack



If an attacker has >50% CPU power,
it can spend a coin more than once.

Dependability: 40 years of BFT research

The Byzantine Generals Problem



Source: <http://slideplayer.com/slide/5163640/>

From cs4410 fall 08 lecture

Lamport, L.; Shostak, R.; Pease, M. (1982). "The Byzantine Generals Problem". ACM Trans. on Programming Languages and Systems. 4 (3): 382–401

Mind the gap

	BFT protocols	Permissionless Blockchain
Openess	A pre-fixed committee for voting	Open to everyone
Non-malicious participants	Honest	Honest or rational
Assumption	Liveness $f \leq \left\lfloor \frac{n - 1}{3} \right\rfloor$	At least one active miner
	Safety $f \leq \left\lfloor \frac{2(n - 1)}{3} \right\rfloor$	$f < 50\%$ mining power (BTC)
# voters	Small (n in total)	Large
# participants	n in total; f malicious	??

Applying BFT to Blockchain

Permissioned (consortium) Blockchain

A good start, but not the end...

BFT and Permissionless Blockchain

Challenge for system deployment:
How to define n ? And hence predict f ?

- ❖ *n is dynamic and can become very large*
- ❖ *In practice, in an open BFT-based system, we cannot guarantee that an attacker will not control more than a priori defined f nodes*

BFT and Permissionless Blockchain

Several prior efforts on applying BFT to Blockchain

- PeerCensus
- ByzCoin
- Solida
- Hybrid consensus
- Thunderella
- ...

PoW+BFT

- ❖ Step 1. Run PoW to select a small number of members;
- ❖ Step 2. Run BFT to reach agreement

n could be fixed and small this way

So, we could predict f ...

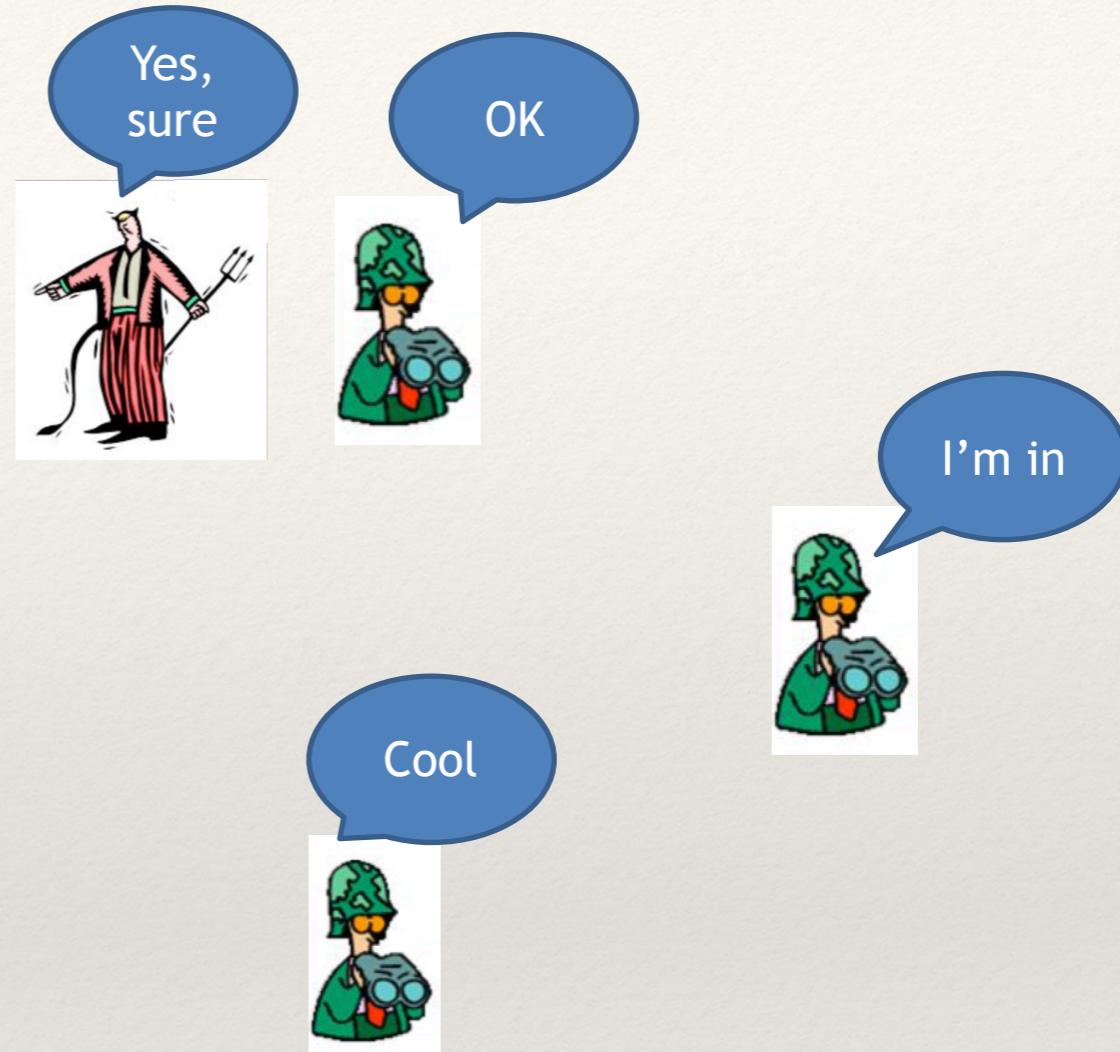
... Could we? ...

Assumption v.s. Reality

Byzantine generals plan!



No more than f traitors in our army!

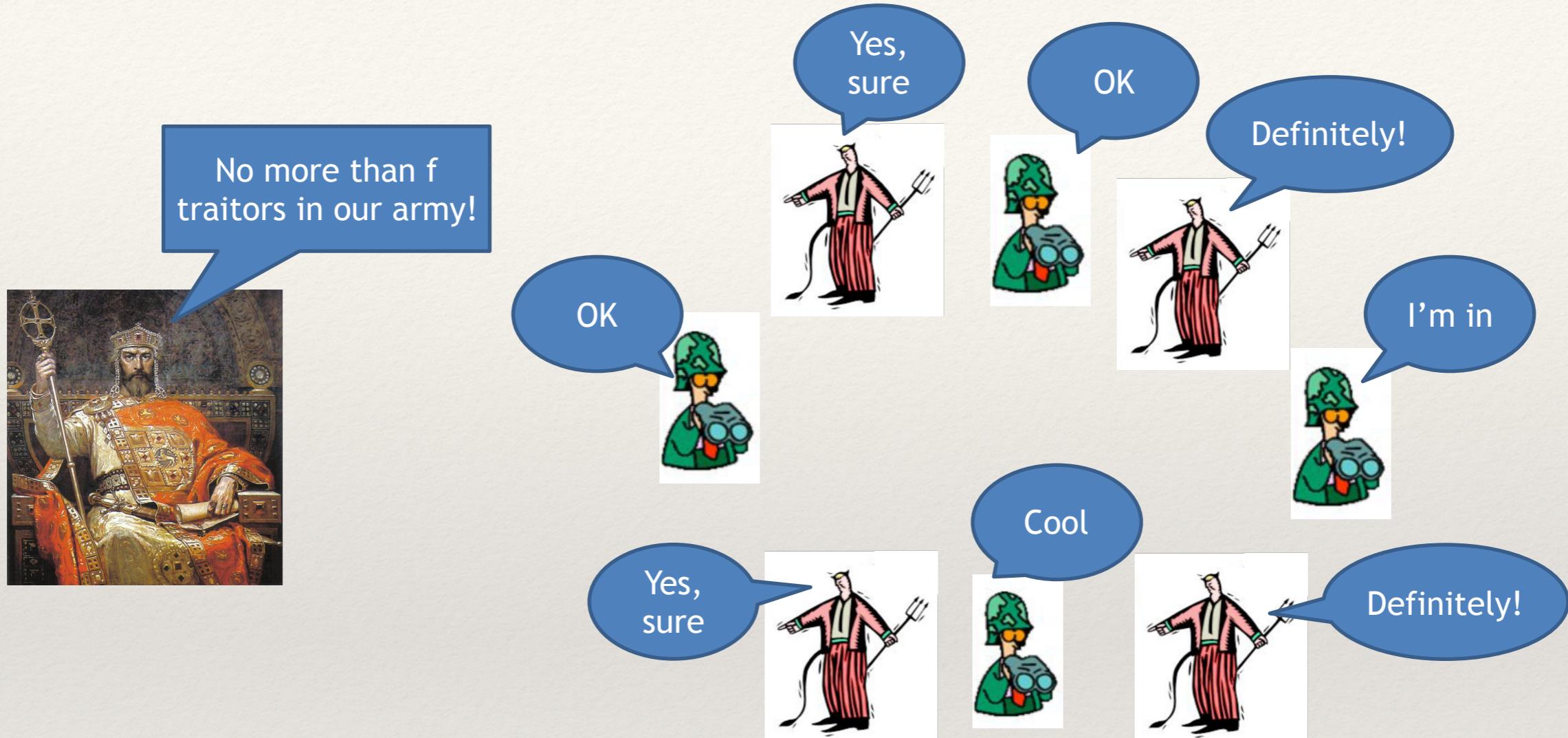


Reality is....

If anyone can be selected to run consensus,
how can we be sure that the system contains no more than f malicious nodes?

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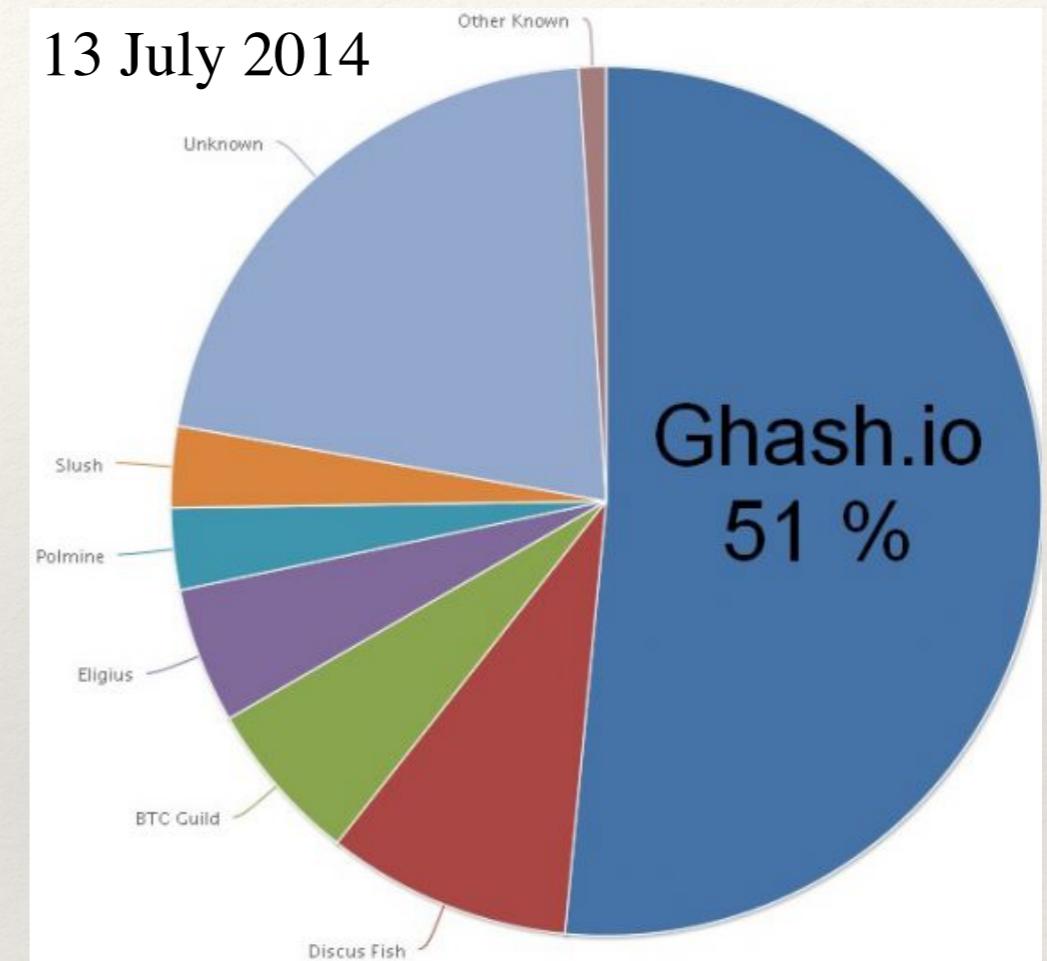
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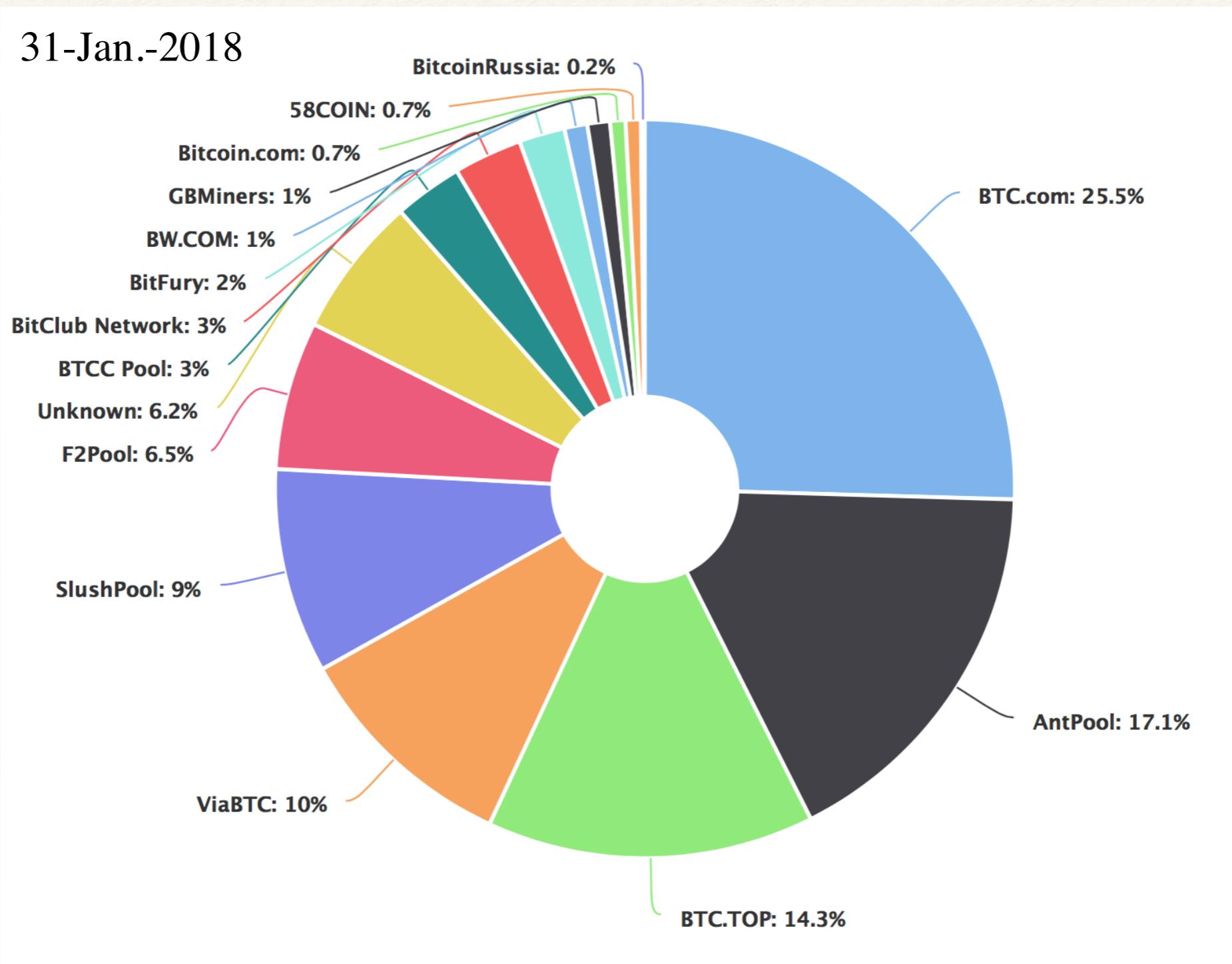
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Reality is tough

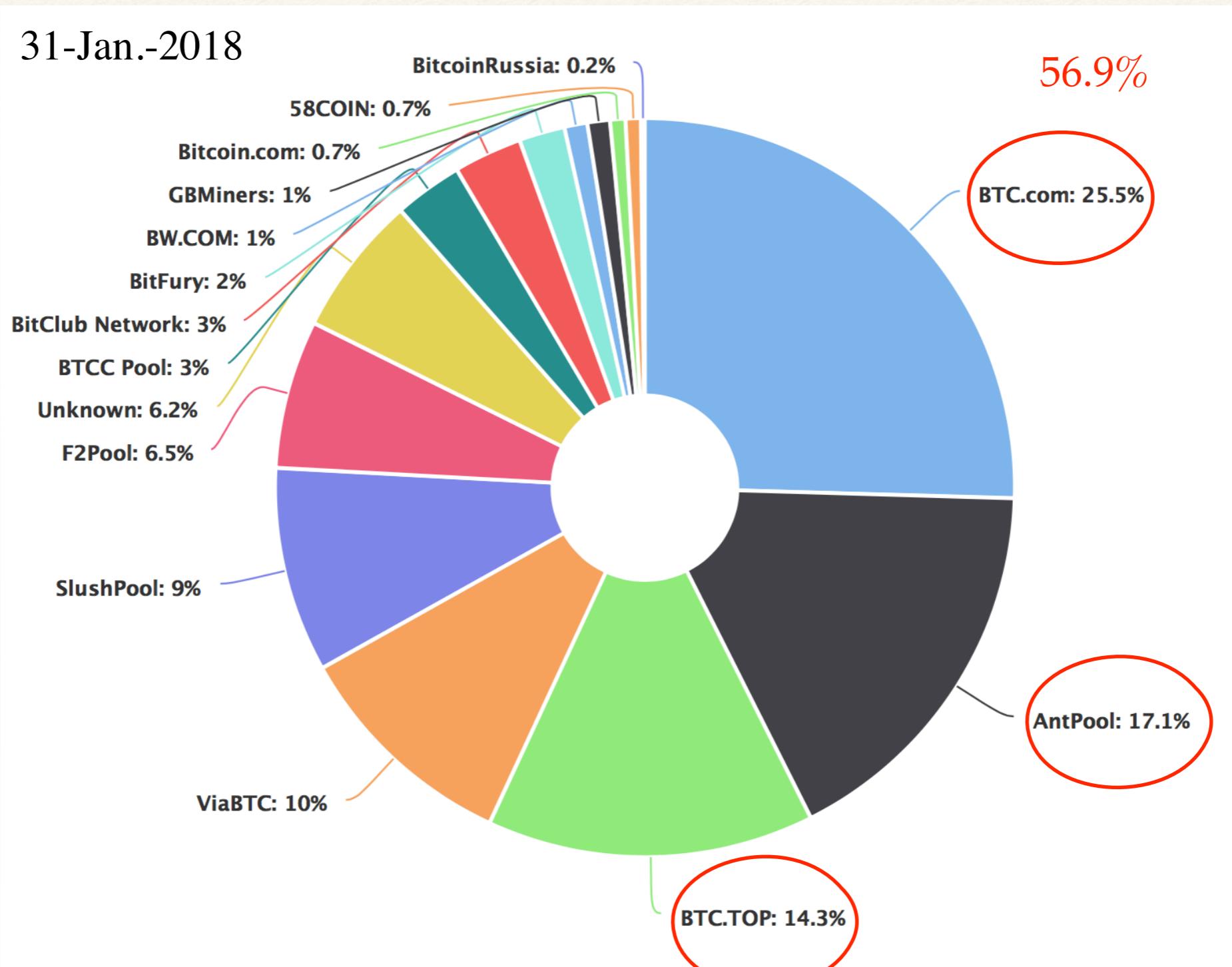


Jan. 2018



<https://www.blockchain.com/en/pools>

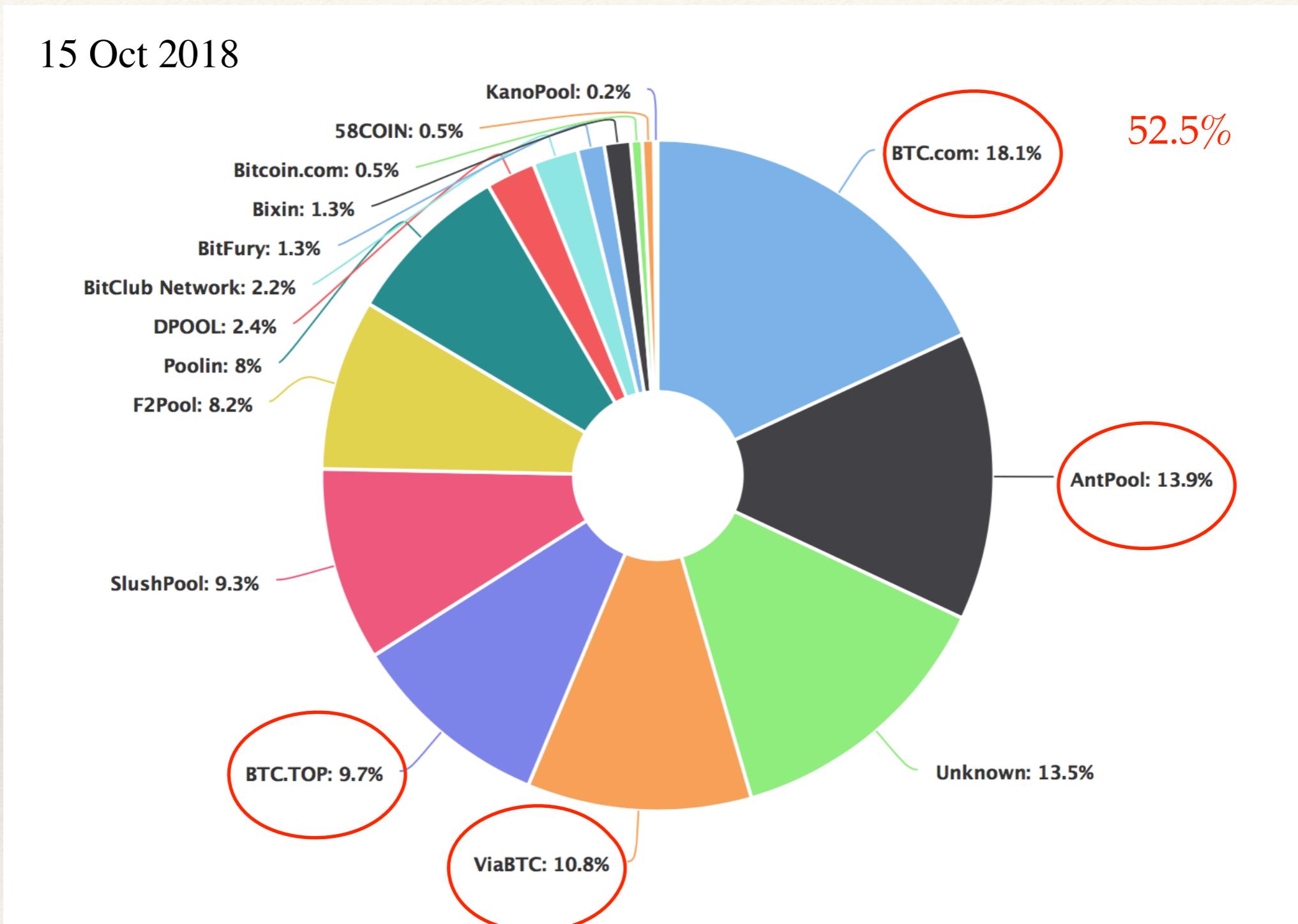
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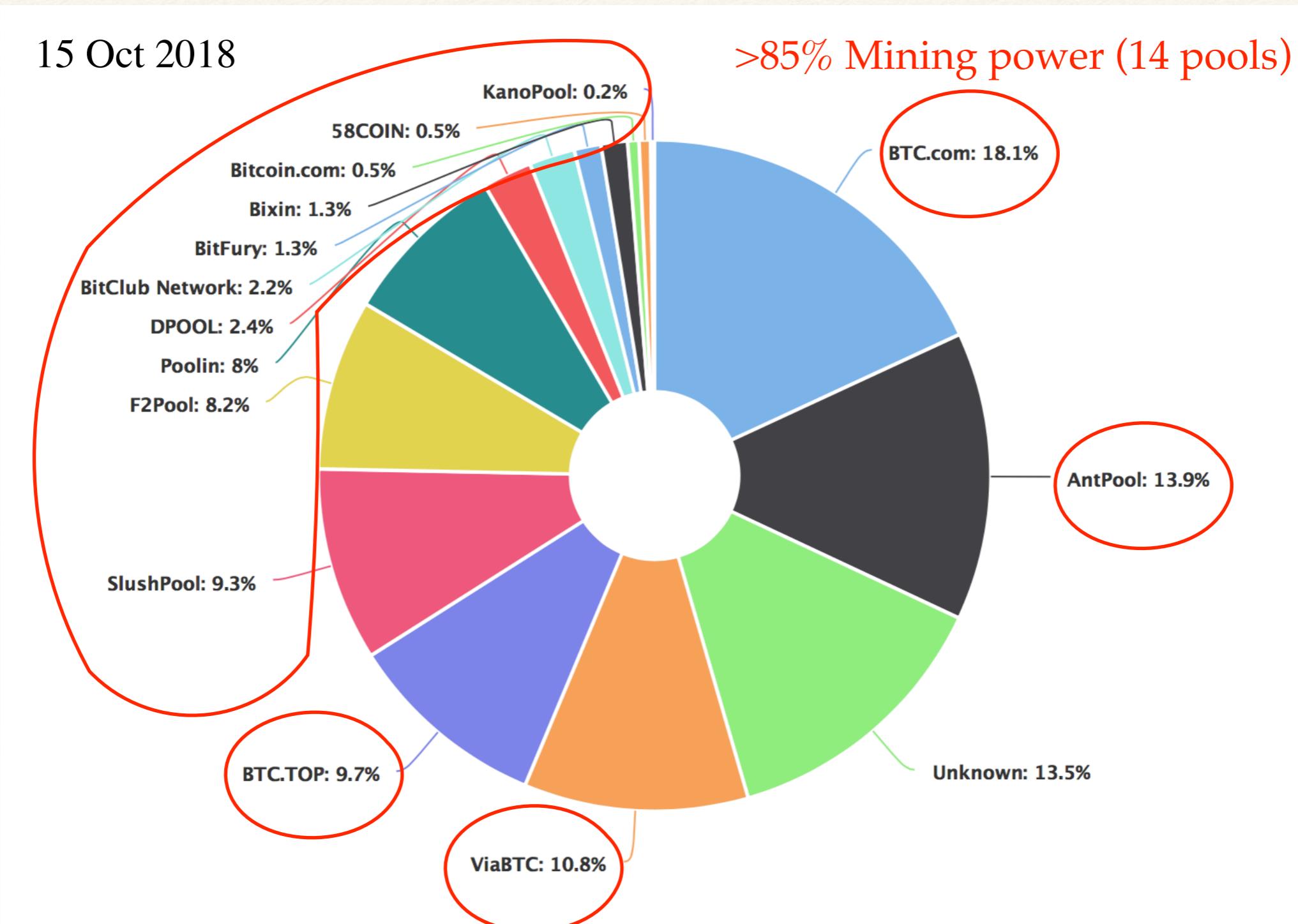
Oct. 2018

15 Oct 2018



<https://www.blockchain.com/en/pools>

Oct. 2018



<https://www.blockchain.com/en/pools>

Reality is tough

2013

Majority is not Enough: Bitcoin Mining is Vulnerable*

Ittay Eyal and Emin Gün Sirer

Department of Computer Science, Cornell University
ittay.eyal@cornell.edu, egs@systems.cs.cornell.edu

Abstract. The Bitcoin cryptocurrency stores its transactions in a public log called the blockchain. Its security relies primarily on the distributed protocol that maintains the blockchain, run by participants called miners. Conventional wisdom asserts that the mining protocol is incentive-compatible and secure against colluding minority groups, that is, it incentivizes miners to follow the protocol as prescribed.

We show that the Bitcoin mining protocol is not incentive-compatible. We present an attack with which colluding miners obtain a revenue larger than their fair share. This attack can have significant consequences for Bitcoin: Rational miners will prefer to join the selfish miners, and the colluding group will increase in size until it becomes a majority. At this point, the Bitcoin system ceases to be a decentralized currency.

Reality is tough

2016

Why buy when you can rent? Bribery attacks on Bitcoin-style consensus

Joseph Bonneau

Stanford University & Electronic Frontier Foundation

Abstract. The Bitcoin cryptocurrency introduced a novel distributed consensus mechanism relying on economic incentives. While a coalition controlling a majority of computational power may undermine the system, for example by double-spending funds, it is often assumed it would be incentivized not to attack to protect its long-term stake in the health

>50% CPU power for a short time.
(flash attack)

All existing PoW-based systems are
vulnerable to this attack.

public, distributed ledger called the blockchain which logs all transactions to ensure that funds may only be spent once. Bitcoin uses a computational puzzle

The big big challenge

In a permissionless blockchain, how to enforce, at least with a very high probability, that

$$\begin{aligned} & \# \text{malicious_nodes} \leq f? \\ & \sum P \text{malicious_nodes} \leq P_f? \end{aligned}$$

RepuCoin Overview

Main problems of PoW:

Decision (voting) power is **CPU power**

- **Instantaneous** power
- can be gained **quickly**;
- vulnerable to flash attacks.

Our solutions:

Decision (voting) power is **reputation**

- **Integrated** power (past performance)
- can only grow **slowly with bounded speed**;
- **Not** vulnerable to flash attacks.

RepuCoin Overview

Main problems of PoW:	Our solutions:
Decision (voting) power is CPU power <ul style="list-style-type: none">- Instantaneous power- can be gained quickly;- vulnerable to flash attacks.	Decision (voting) power is reputation <ul style="list-style-type: none">- Integrated power (past performance)- can only grow slowly with bounded speed;- Not vulnerable to flash attacks.
Rationality and maliciousness <ul style="list-style-type: none">- not clearly distinguished	Rationality and maliciousness <ul style="list-style-type: none">- separate protection measures

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Rationality and maliciousness

- not clearly distinguished

PoW consensus is **probabilistic**

- forkable BC

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Rationality and maliciousness

- separate protection measures

PoR consensus is **deterministic**

- novel weighted voting consensus algorithm
- non-forkable BC

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PoW consensus is probabilistic <ul style="list-style-type: none">- forkable BC	PoR consensus is deterministic <ul style="list-style-type: none">- novel weighted voting consensus algorithm- non-forkable BC
Low (stochastic) resilience <ul style="list-style-type: none">- vulnerable to selfish mining (>25%) and other attacks leveraging instantaneous power	High (stochastic) resilience <ul style="list-style-type: none">-Not vulnerable to instantan. power attacks-Non-rationality of infiltration attacks

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Low Throughput: <ul style="list-style-type: none">- 7 TPS- 1,000 TPS (ByzCoin)	High Throughput: <ul style="list-style-type: none">- (fast) PoR for committing transactions- 10,000 TPS (256 Byte per TX)

The logic of RepuCoin in a nutshell

- ❖ reputation-based weighted voting consensus is safe and live as long as relative decision power (given by reputation score) of attackers is below a defined threshold, fraction of the total
- ❖ max rate of decision power growth of any system participant is deterministic, bounded and known, imposed by the proof-of-reputation function
- ❖ there is no rational economic model for infiltration attacks --- compared to the cost of attacking different systems
- ❖ attacks attacks on liveness or safety still being possible, the network achieves very high stochastic robustness against them --- i.e., attack effort to reach network control compares very favorably to previous works
- ❖ RepuCoin prevents all currently known attacks.

How does RepuCoin Work?

1. Miners gain reputation slowly with a bounded rate by contributing to the blockchain

Algorithm 2 Reputation algorithm

Input: $L, \{k_i\}_{i=1}^t, \{m_j\}_{j=1}^{N_l}, m, c, a$, and λ .

Output: Reputation $R \in [0, 1]$ of the corresponding miner.

```
1:  $\text{mean}_k = \frac{\sum_{i=1}^t k_i}{L}$ 
2:  $\text{mean}_m = \frac{1}{N_l} \cdot \sum_{j=1}^{N_l} \frac{m_j}{m}$ 
3:  $s_k = \sqrt{\frac{1}{t} \cdot \sum_{i=1}^t (k_i - \frac{\sum_{i=1}^t k_i}{t})^2}$ 
4:  $s_m = \sqrt{\frac{1}{N_l} \cdot \sum_{j=1}^{N_l} (m_j - \frac{\sum_{j=1}^{N_l} m_j}{N_l})^2}$  - total amount of valid work
5:  $y_1 = \frac{\text{mean}_k}{1+s_k}$  - regularity of that work
6: if  $N_l \geq 1$  then
     $y_2 = \frac{\text{mean}_m}{1+s_m}$ 
7: else
8:      $y_2 = 1$ 
9: end if
10:  $x = y_1 \cdot y_2 \cdot L$ 
11:  $f(x) = \frac{1}{2}(1 + \frac{x-a}{\lambda+|x-a|})$ 
12:  $R = \min(1, H \cdot (\text{Ext} + f(x)))$ 
```

How does RepuCoin Work?

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2. Top reputed miners dynamically form a consensus committee



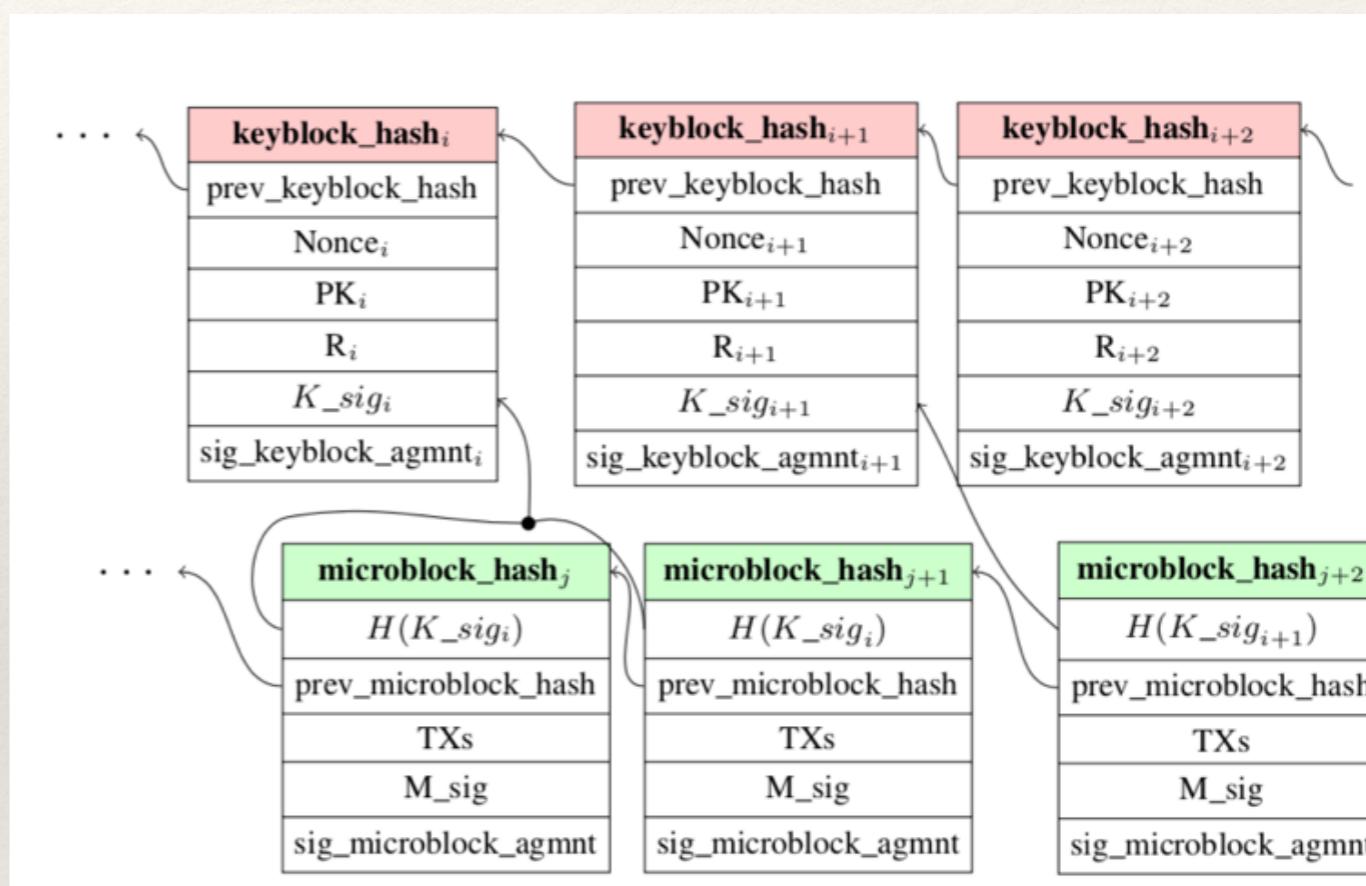
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4. A randomly elected leader proposes microblocks to the committee for their approval;



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4. A randomly elected leader proposes microblocks to the committee for their approval;
5. Mis-behaved miners will be punished, and they lose reputation



How does RepuCoin Work?

- ❖ We have “Keyblocks” and “Microblocks”
 - Miners solve Bitcoin-like puzzles to create keyblocks
(Keyblocks do not contain any transaction)

$$H(prev_keyblock_hash || Nonce || PK) < target$$

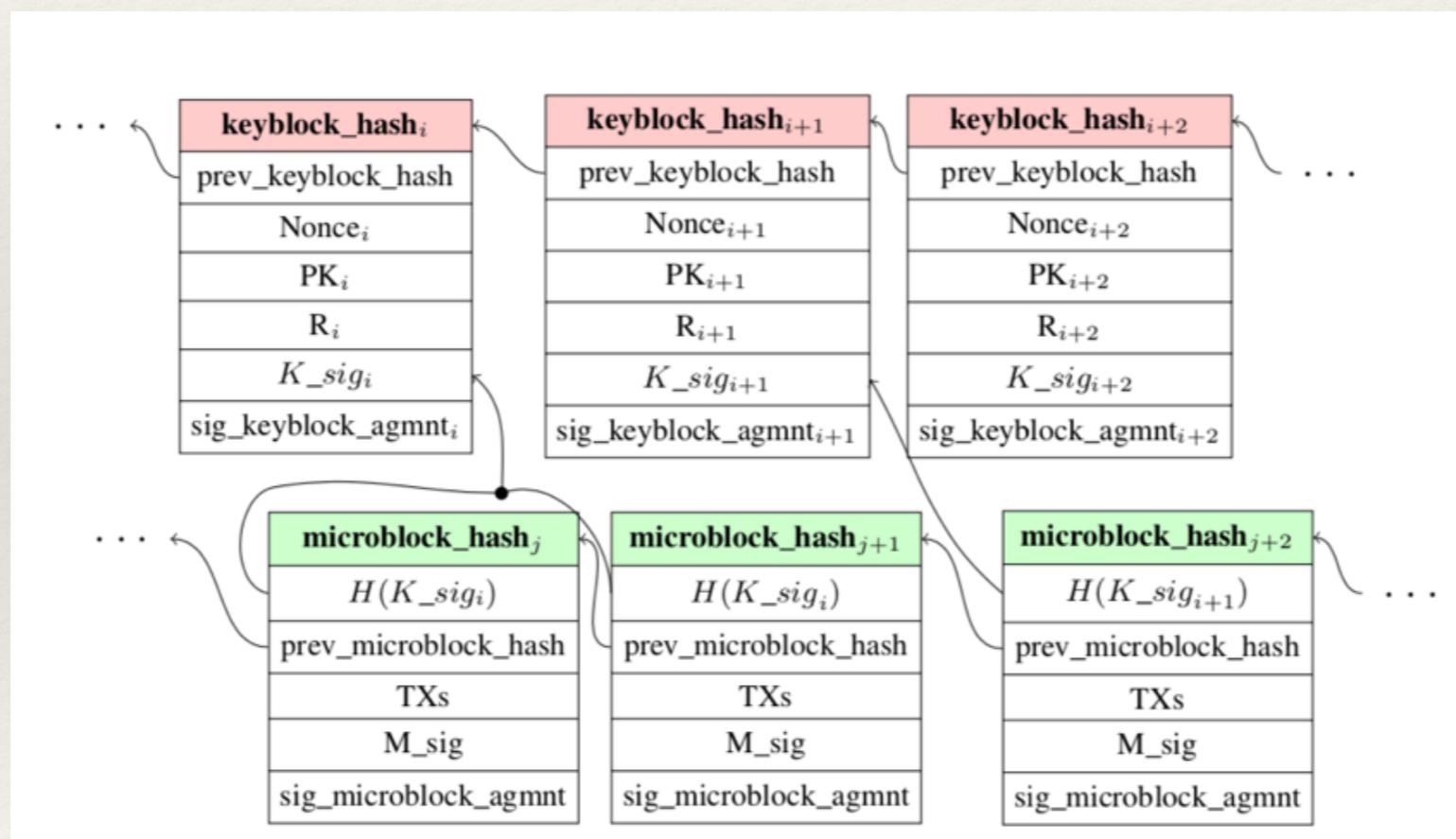
- Microblocks contain transactions, created by a random leader
- ❖ Each block is “pinned” by the consensus group

Block pinning

- Top reputed miners dynamically form a consensus group
- Each **keyblock** is proposed to the consensus group to be “pinned” through reputation-based weighted voting consensus
- A new leader is randomly determined by the newly pinned keyblock
 - $$l_i := x_j \quad s.t. \quad x_j \in \mathbb{X} \quad \wedge \quad j = H(K_sig_i) \mod |\mathbb{X}|$$

Block pinning

- The elected leader commits transactions into microblocks
- Microblocks are also pinned by the consensus group
- Microblocks are linked back to the keyblock



Reputation is your power

Control over reputation

1. Gain reputation by contributing ‘good’ work

1. total amount of contributed,
2. the regularity of that work
3. calculated over the contribution of the entire system of all periods

2. Lose reputation if misbehaved

Algorithm 2 Reputation algorithm

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Helps bootstrapping, and supports both permissioned and permissionless ledger

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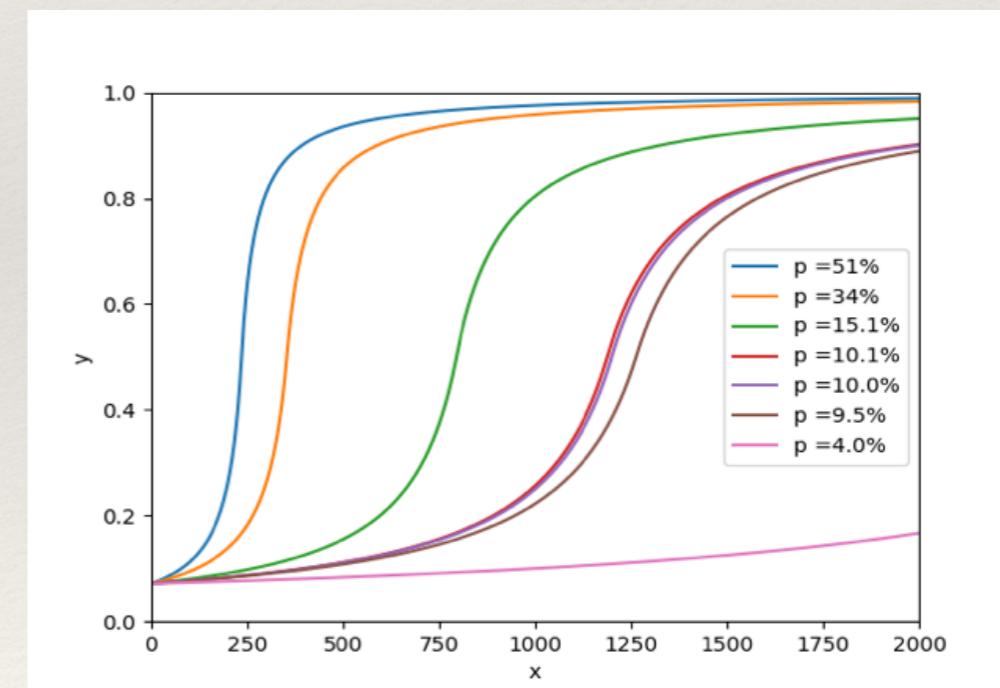
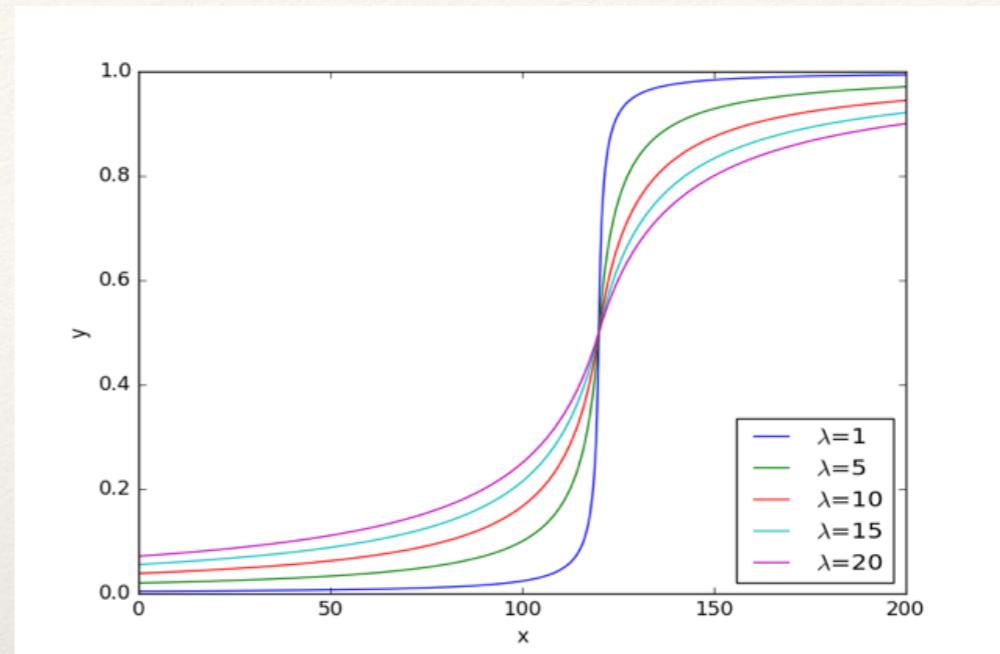
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Reputation is your power

3. The **social objectives** of reputation:

- i. **careful start**, through an initial slow increase;
- ii. potential for quick reward of mature participants, through **fast increase in mid-life**;
- iii. prevention of over-control, by **slow increase near the top**



Reputation is your power

Reputation distribution of miners over time.

Time	[0, 0.2)	[0.2, 0.4)	[0.4, 0.6)	[0.6, 0.8)	[0.8, 1]
1 month	100%	-	-	-	-
6 months	64.7%	35.3%	-	-	-
1 year	21.8%	78.2%	-	-	-
2 years	9.6%	31.7%	38.1%	15.2%	-
3 years	2.7%	21.6%	19.5%	38.1%	15.2%
4 years	2.7%	19.1%	-	25%	53.2%
4 years	2.7%	15.1%	4%	17.9%	60.3%
20 years	0.4%	2.3%	-	3%	94.3%

Reputation is your power

Reputation-based incentives lead miners to work diligently and honestly

A successful miner

1. gets all mining rewards
2. shares transaction fees with a randomly selected leader, according to the reputation.
3. gets >60 times better transaction fees than BTC, due to high throughput

Algorithm 1 Reward sharing algorithm

Input: The sequence $\mathbb{M} = \{m_0, m_1, \dots, m_{n-1}\}$ of microblocks pinned in the $(i - 1)$ -th epoch, the signature K_sig_i contained in the i -th pinned keyblock, and the reputation R of the miner who created the $(i - 1)$ -th keyblock.

Output: Two subsets $\mathbb{M}', \mathbb{M}'' \subseteq \mathbb{M}$ of microblocks, where transaction fees contained in \mathbb{M}' (resp. \mathbb{M}'') are allocated to the miner (resp. the leader) as reward.

```
1:  $i' = H(K\_sig_i) \bmod n$ 
2:  $k = 0$ 
3:  $\mathbb{M}' = \emptyset$ 
4: while  $k < R \cdot n$  do
5:    $j = i' + k \bmod n$ 
6:    $\mathbb{M}' = \mathbb{M}' \cup \{m_j\}$ 
7:    $k = k + 1$ 
8: end while
9:  $\mathbb{M}'' = \mathbb{M} \setminus \mathbb{M}'$ 
```

Reputation is your power

Voting power is *integrated power*

(i.e. the *past* work over time, toward reputation)
rather than *instantaneous power*

(i.e. the *now* sheer computing power)

- Only top reputed nodes get involved in the consensus;
- The voting power of a top reputed node is the ratio of its reputation to all top reputed nodes

The weight of x_i 's vote is $\frac{R_i}{\sum_{i=1}^{|\mathbb{X}|} R_i}$, for all possible x_i .

What do we enforce?

The increase of any miner's voting power is bounded by “physics”!

$$\frac{d^2 P_d}{dN \cdot dt} = \frac{1}{2} \frac{\lambda}{(\lambda + |x - a|)^2} \leq \frac{1}{2\lambda}$$

λ and a are system parameters, and x is defined in the reputation algorithm.

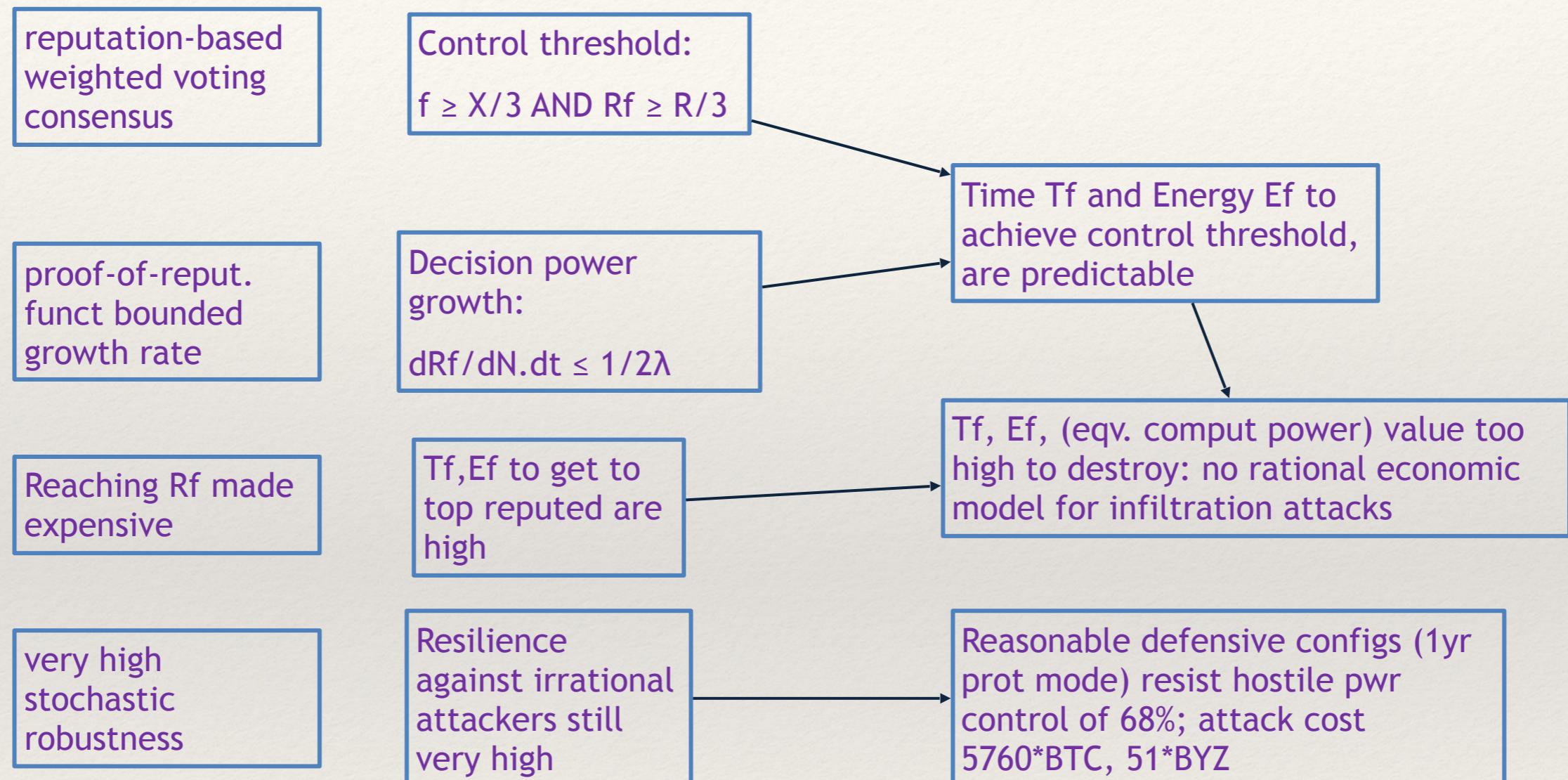
What do we enforce?

The increase of any miner's voting power is bounded by “physics”!

$$\frac{d^2 P_d}{dN \cdot dt} = \frac{1}{2} \frac{\lambda}{(\lambda + |x - a|)^2} \leq \frac{1}{2\lambda}$$

λ and a are system parameters, and x is defined in the reputation algorithm.

RECAP: The logic of RepuCoin in a nutshell



Security and Dependability:

The minimum cost of successfully attacking RepuCoin

Joining time \ Target	1 week	1 month	3 months	6 months
1 month	infeasible	45%	30%	27%
3 months	infeasible	90%	45%	33%
6 months	infeasible	infeasible	68%	45%
9 months	infeasible	infeasible	90%	54%
12 months	infeasible	infeasible	infeasible	68%
18 months	infeasible	infeasible	infeasible	91%
20 months	infeasible	infeasible	infeasible	infeasible

Security and Dependability:

The minimum cost of successfully attacking RepuCoin

Joining time \ Target	1 week	1 month	3 months	6 months
1 month	infeasible	BTC: *635; BYZ: *6	BTC: *1271; BYZ: *11	BTC: *2287; BYZ: *20
3 months	infeasible	BTC: *1270; BYZ: *11	BTC: *1906; BYZ: *17	BTC: *2795; BYZ: *25
6 months	infeasible	infeasible	BTC: *2880; BYZ: *26	BTC: *3812; BYZ: *34
9 months	infeasible	infeasible	BTC: *3812; BYZ: *34	BTC: *4574; BYZ: *41
12 months	infeasible	infeasible	infeasible	BTC: *5760; BYZ: *51
18 months	infeasible	infeasible	infeasible	BTC: *7708; BYZ: *69
20 months	infeasible	infeasible	infeasible	infeasible

Comparison

Attacks/Features	BitCoin	BitCoin-NG	ByzCoin	RepuCoin
Double spending attacks	☠	☠	↗	↗
Selfish mining attack	☠	☠	☠	↗
Bribery/flash attack	☠	☠	☠	↗
Eclipse attacks	☠	☠	:(:(
Non-forkable chain	☠	☠	↗	↗
Liveness	↗	↗	☠	↗
Throughput	7 tps	?	1,000 tps	10,000 tps

- ↗ The system is secure against this attack
- ☠ The system is vulnerable to this attack
- :(The system can prevent double spending, but its throughput maybe reduced.

256 Bytes / TX
 13 nodes
 1KB / Kblock
 2 MB / Mblock

Future work: Join me!

