

The Bitcoin Backbone: Analysis and Applications

Juan Garay (Yahoo Labs)

Aggelos Kiayias (U. of Athens)

Nikos Leonardos (U. Paris Diderot — Paris 7)

Decentralized Payment Systems

- Traditional *e-cash* (D. Chaum,...): centralized approach
- First decentralized “cryptocurrency” — Bitcoin — announced in 2008
- January 2009: the Bitcoin network is created. A number of other cryptocurrencies follow suit
- High impact; a number of other potential applications: contracts, reputation systems, name services, etc.

Bitcoin Players

Miners

- Do work to maintain the transaction ledger
- Get rewards for their work:
 - i. fees
 - ii. new bitcoins

Payers

- Broadcast a transaction stating they send bitcoin
- Rely on security of digital signatures to ensure money is not stolen

Payees

- Have to generate a Bitcoin address
- Have to verify their address is credited

Valid Transactions

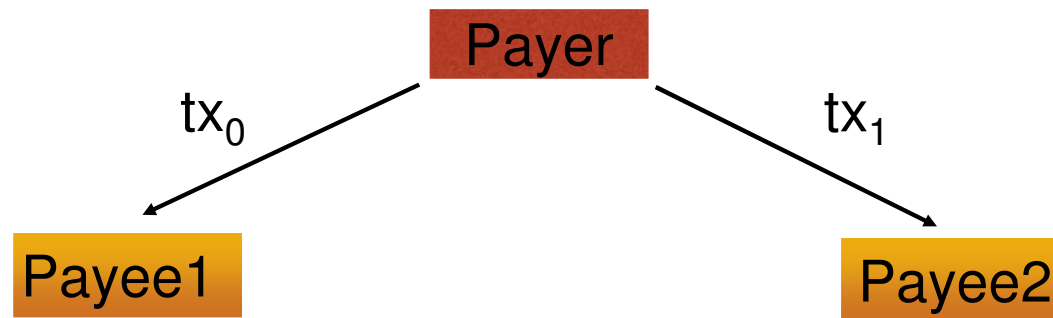
- Transactions are organized by miners in a *transaction ledger* τ
- There is a well-defined public predicate that given a transaction ledger and a transaction decides whether the transaction “makes sense”

$$\text{Valid}(\tau, tx) \in \{\text{True}, \text{False}\}$$

- Each miner will accept a transaction only if it is valid given its local view of the ledger

Double-spending Bitcoin

- The "litmus test" for any payment system



- Double-spending transactions are inconsistent:

$$tx_b \in \tau \rightarrow \text{Valid}(\tau, tx_{1-b}) = \text{False}$$

- No honest miner will accept an invalid transaction
- As long as miners agree on τ no double-spending is feasible

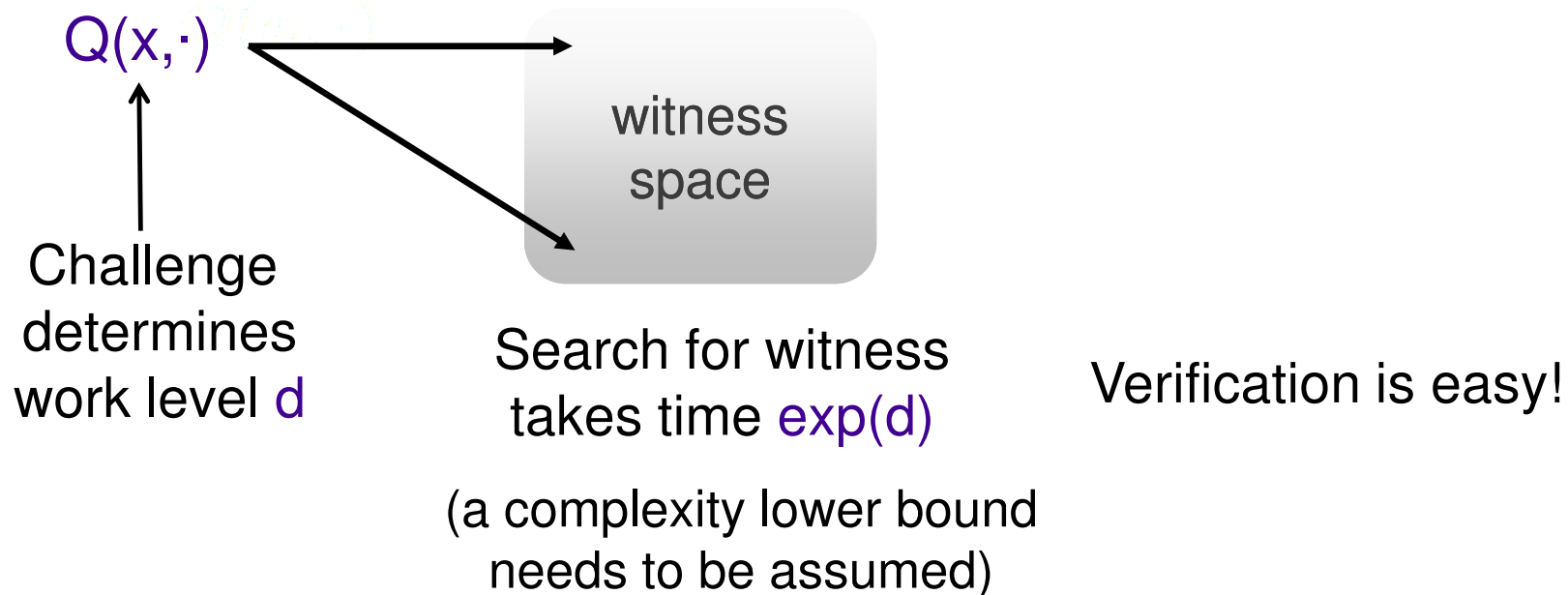
Double-spending Bitcoin (2)

- If *single* miner exists, then double-spending is infeasible — but Bitcoin would be guaranteed solely by that entity
- How to facilitate multiple miners while preventing double-spending?
- How to scale this to thousands... millions... of users at a global scale and maintain security?
 - No PKI or authenticated channels, so standard secure multi-party computation (MPC) [Yao82, GMW87] techniques cannot be used (cf. [SD14])

Answer: Proofs of Work (aka “Time-Lock” Puzzles)

[DN92, RSW96, Bac97, JB99]

$Q(\cdot, \cdot)$: Polynomial-time predicate



Using POWs

- Miners collect a set of transactions

$$\mathbf{tx} = (tx_1, tx_2, \dots, tx_i)$$

- Then do “work”

$i := 0$; while $\text{Hash}(i; \text{Hash}(\tau, \mathbf{tx})) > D$ do $i++$

- If while loop terminates broadcast (τ, i, \mathbf{tx}) (new “block”)

Using POWs (2)

- If a vector $(\tau', i', \mathbf{tx}')$ is received, check

$$(\tau = \tau') \wedge (\text{Hash}(i'; \text{Hash}(\tau, \mathbf{tx}')) \leq D)$$

- Expand the transaction ledger

$$\tau := \tau' \parallel \mathbf{tx}'$$

(called a “blockchain” — denoted \mathcal{C})

$$\tau \parallel \mathbf{tx}' \rightarrow \tau'$$

Longest Chain Wins

- Size *does matter* in Bitcoin:
 - If $(\tau \neq \tau')$ then miners compare their respective sizes in terms of number of blocks
- Miners' basic rule: If my chain is not smaller, I keep it; else I switch to the new one

Analyzing the Bitcoin Protocol

- Nakamoto: Initial set of arguments of why Bitcoin prevents double-spending attacks
 - Wait for the transaction that gives credit to advance into the blockchain a number of k blocks, then prob. of attacker building another blockchain drops exp'ly with k
- Adversary vs. honest player working on a chain perform a random walk
- Assuming an honest majority the adversary cannot “catch” the honest players
- Nakamoto’s analysis can be easily seen to be limited
 - The adversary can be **more creative** than just mining in private until he obtains a longer chain. E.g., it can broadcast conflicting chains to different sets of honest miners in order to **split their mining power**

Our Work

- Analysis of Bitcoin in a general adversarial model
- We extract, formally describe, and analyze the core of the Bitcoin protocol — the *Bitcoin backbone*
- Protocol parameterized by three application-specific external functions
 - $V(\cdot)$: *content (of chain) validation predicate*
 - $I(\cdot)$: *input contribution function*
 - $R(\cdot)$: *chain reading function*

Our Work (2)

- Two fundamental properties of the Bitcoin backbone, assuming $(1/2)$ -bounded adversary and high network synchronicity
 - *Common prefix*: After adequately “pruning” their local chains, honest parties share a common prefix
 - *Chain quality*: Guaranteed ratio of blocks contributed by the honest parties
- **Note:** Rather abstract properties of distributively maintained data structure

Our Work (3)

Backbone properties	Nakamoto BA protocol Π_{BA}^{nak}	Our BA protocol $\Pi_{BA}^{1/3}$	Public Ledger Π_{PL}	Our BA protocol $\Pi_{BA}^{1/2}$
common prefix	Agreement $\frac{1}{2}$	Agreement $\frac{1}{2}$	<i>Persistence:</i> transactions are permanent and ordered $\frac{1}{2}$	Agreement $\frac{1}{2}$
chain quality	Validity ϵ	Validity $\frac{1}{3}$	<i>Liveness:</i> transactions are eventually included $\frac{1}{2}$	Validity $\frac{1}{2}$

Model

- Protocol executed by fixed no. of parties n (not necessarily known to participants); (active/“rushing”/adaptive) adversary controls a subset
- Underlying graph not fully connected; messages delivered through “diffusion” mechanism (“Broadcast”)
- Parties *cannot* authenticate each other; adversary can “spooof” source of message
- Assume time is divided in rounds; within each round all messages are delivered
 - Important in terms of Bitcoin’s inherent assumption regarding the players’ ability to produce POWs

Model (2)

- “Flat model:” In a single round, all parties are allowed the same number of queries to a cryptographic hash function, modeled as a *random oracle* [BR93]
 - “*q*-bounded synchronous model”
 - $t < n$ parties controlled by adv. $\rightarrow t \cdot q$ queries/round
 - $t < n/2$ corresponds to adv. controlling strictly less of the system’s total “hashing power”

Model (3)

- Let

$p = D/2^k$: prob. of POW solution

α : Expected POW solutions by honest parties in a round

β : Adversary's expected POW solutions in a round

$f = \alpha + \beta$ (Total/System's POW rate)

$\gamma = \alpha - \alpha^2$ (Lower bound on prob. that exactly one honest party computes a POW solution in a round)

- Assume $\gamma > \lambda\beta$, $\lambda \in [1, \infty)$

- Relation between “good” and “bad” hashing power

The Bitcoin Backbone Protocol

Algorithm 4 The Bitcoin backbone protocol, parameterized by the *input contribution function* $I(\cdot)$ and the *chain reading function* $R(\cdot)$.

```
1:  $\mathcal{C} \leftarrow \varepsilon$ 
2:  $st \leftarrow \varepsilon$ 
3:  $round \leftarrow 0$ 
4: while TRUE do
5:    $\tilde{\mathcal{C}} \leftarrow \text{maxvalid}(\mathcal{C}, \text{any chain } \mathcal{C}' \text{ found in RECEIVE}())$ 
6:    $\langle st, x \rangle \leftarrow I(st, \tilde{\mathcal{C}}, round, \text{INPUT}(), \text{RECEIVE}())$  ▷ Determine the  $x$ -value to insert.
7:    $\mathcal{C}_{\text{new}} \leftarrow \text{pow}(x, \tilde{\mathcal{C}})$ 
8:   if  $\mathcal{C} \neq \mathcal{C}_{\text{new}}$  then
9:      $\mathcal{C} \leftarrow \mathcal{C}_{\text{new}}$ 
10:    BROADCAST( $\mathcal{C}$ )
11:  end if
12:   $round \leftarrow round + 1$ 
13:  if INPUT() contains READ then
14:    write  $R(x_{\mathcal{C}})$  to OUTPUT()
15:  end if
16: end while
```

RECALL

Our Work (2)

- Two fundamental properties of the Bitcoin backbone, assuming $(1/2)$ -bounded adversary and high network synchronicity
 - *Common prefix*: After adequately “pruning” their local chains, honest parties share a common prefix
 - *Chain quality*: Guaranteed ratio of blocks contributed by the honest parties

- **Note:** Rather abstract properties of distributively maintained data structure

Common Prefix Property

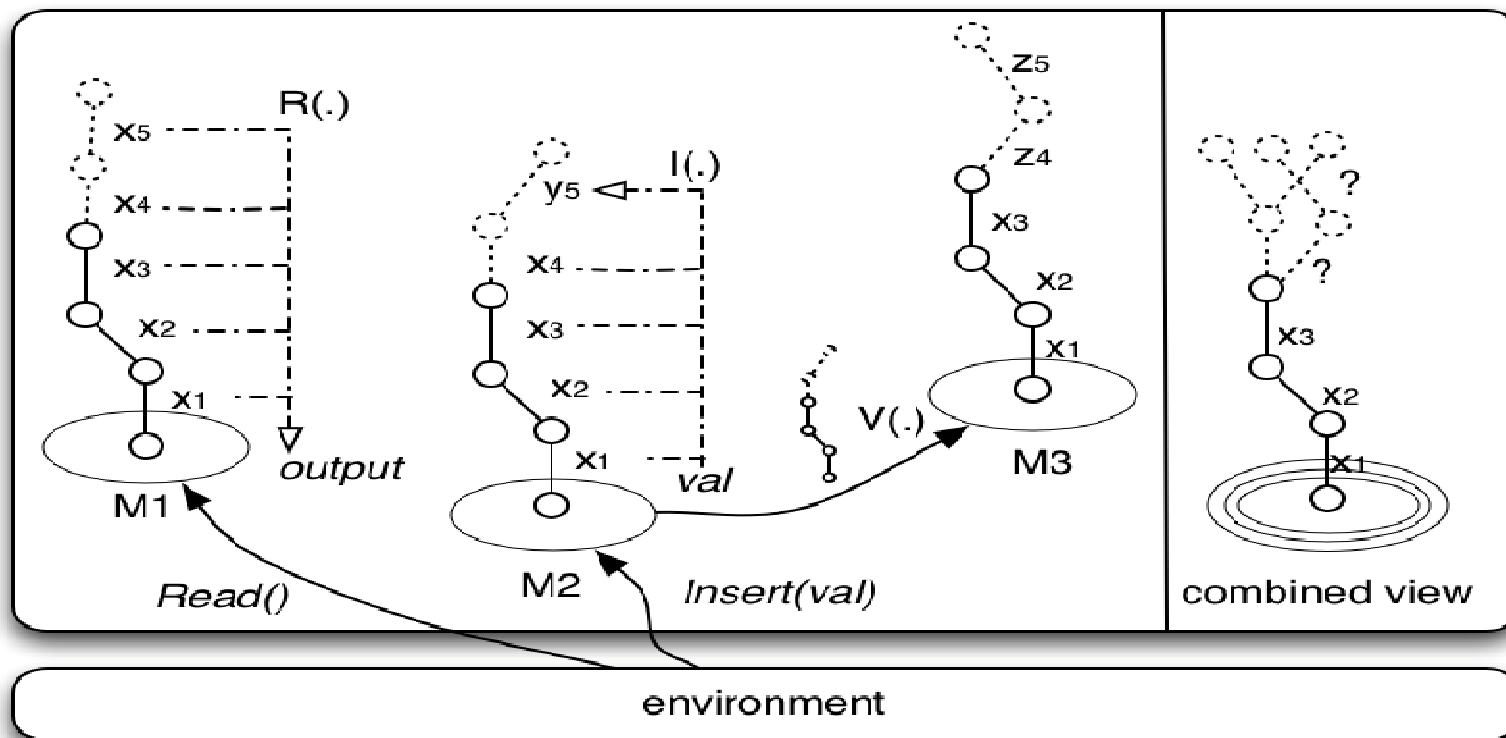
- **Definition** (Common prefix, w/ param. k). For any pair of honest parties P_1, P_2

$$C_{1,[k]} \preceq C_2 \text{ and } C_{2,[k]} \preceq C_1$$

| C_1 C_2 C_3 C_4 C_5 C_6 C_7 C_8 C_9 C_{10} C_{11} C_{12} C_{13} C_{14} C_{15} C_{16} C_{17} C_{18} C_{19} C_{20} C_{21} C_{22} C_{23} C_{24} C_{25} C_{26} C_{27} C_{28} C_{29} C_{30} C_{31} C_{32} C_{33} C_{34} C_{35} C_{36} C_{37} C_{38} C_{39} C_{40} C_{41} C_{42} C_{43} C_{44} C_{45} C_{46} C_{47} C_{48} C_{49} C_{50} C_{51} C_{52} C_{53} C_{54} C_{55} C_{56} C_{57} C_{58} C_{59} C_{60} C_{61} C_{62} C_{63} C_{64} C_{65} C_{66} C_{67} C_{68} C_{69} C_{70} C_{71} C_{72} C_{73} C_{74} C_{75} C_{76} C_{77} C_{78} C_{79} C_{80} C_{81} C_{82} C_{83} C_{84} C_{85} C_{86} C_{87} C_{88} C_{89} C_{90} C_{91} C_{92} C_{93} C_{94} C_{95} C_{96} C_{97} C_{98} C_{99} C_{100}

C_1 C_2 C_3 C_4 C_5 C_6 C_7 C_8 C_9 C_{10} C_{11} C_{12} C_{13} C_{14} C_{15} C_{16} C_{17} C_{18} C_{19} C_{20} C_{21} C_{22} C_{23} C_{24} C_{25} C_{26} C_{27} C_{28} C_{29} C_{30} C_{31} C_{32} C_{33} C_{34} C_{35} C_{36} C_{37} C_{38} C_{39} C_{40} C_{41} C_{42} C_{43} C_{44} C_{45} C_{46} C_{47} C_{48} C_{49} C_{50} C_{51} C_{52} C_{53} C_{54} C_{55} C_{56} C_{57} C_{58} C_{59} C_{60} C_{61} C_{62} C_{63} C_{64} C_{65} C_{66} C_{67} C_{68} C_{69} C_{70} C_{71} C_{72} C_{73} C_{74} C_{75} C_{76} C_{77} C_{78} C_{79} C_{80} C_{81} C_{82} C_{83} C_{84} C_{85} C_{86} C_{87} C_{88} C_{89} C_{90} C_{91} C_{92} C_{93} C_{94} C_{95} C_{96} C_{97} C_{98} C_{99} C_{100}

Common Prefix Property (2)



Common Prefix Property (3)

- **Definition.** (Common prefix, w/ param. k) For any pair of honest parties P_1, P_2

$$C_{1,[k]} \preceq C_2 \text{ and } C_{2,[k]} \preceq C_1$$

- **Theorem** (Common prefix, w/ param. k). Let $\lambda^2 - f\lambda - 1 \geq 0$. No matter the adversary's strategy, the chains of two honest parties satisfy the common-prefix property with probability

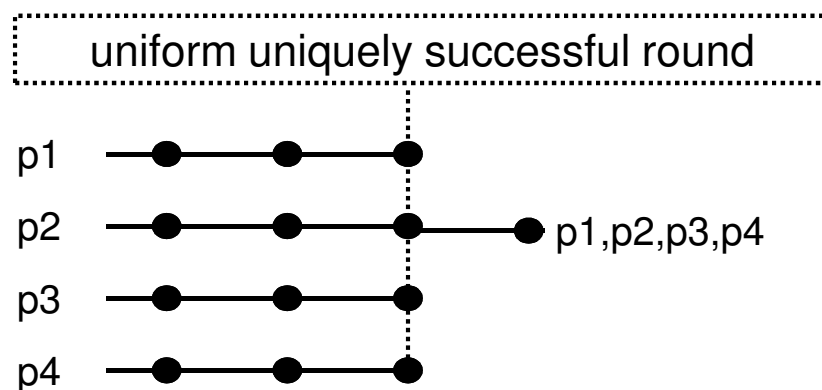
$$1 - e^{-\Omega(k)}$$

BY THE WAY

Common Prefix Property (4)

- **Common-prefix theorem:** (proof idea)

- *Uniform round:* Round where all honest parties invoke a POW with a chain of the same length
- *Uniquely successful round:* Round when exactly one honest party is successful



Common Prefix Property (5)

- **Common-prefix theorem:** (proof idea, cont'd)
 - *Uniform uniquely successful rounds* allow parties to reach a "convergence block"
 - To maintain a "fork," adv. must produce a POW for each convergence block
 - The rate of **u.u.s.** rounds is $(1 - \beta)\lambda$

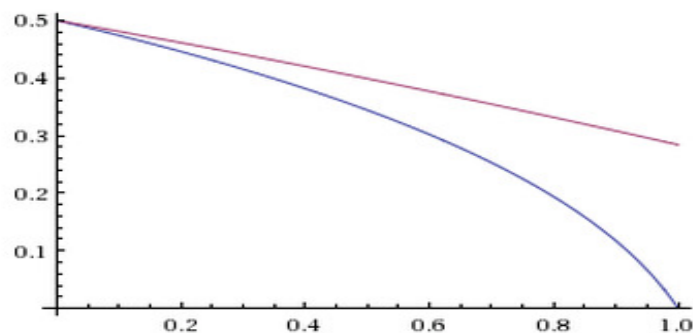
In order for the adversary to maintain a fork for a certain length

$$\beta > (1 - \beta)\lambda$$

This is equivalent to $\lambda^2 - f\lambda - 1 < 0 \rightarrow \dots$ (Chernoff bounds)

Common Prefix Property (6)

- Only if $f \rightarrow 0$ we can let $\lambda \rightarrow 1$ (adversarial tolerance up to 50%) (fast information propagation)
- As $f \rightarrow 1$ we have $\lambda \rightarrow (1 + \sqrt{5})/2$ (Golden Ratio)



Adversarial bound (y-axis) wrt network synchronization f (x-axis) so that common prefix is ensured in Bitcoin (blue) vs. Bitcoin with lexicographic tie-breaking (red)

Chain Quality Property

- **Theorem** (Chain quality). Any sequence of ℓ blocks in an honest party's chain will contain $1 - 1/\lambda$ proportion of honest blocks with probability

$$1 - e^{-\Omega(\ell)}$$

- The theorem is tight
 - There is an adversarial strategy that restricts the honest parties to a ratio of exactly $1 - 1/\lambda$
 - The strategy is a type of *selfish mining* [ES14]: Malicious miners mine blocks in private attempting to “kill” honest parties' blocks when they become available

Chain Quality Property (2)

- *Ideal* chain quality: A set of parties with hashing power α may control up to αL blocks in a blockchain of length L
vs
- Our chain quality bound is much more pessimistic (as the adv. can control almost all the blocks)
vs $1/2$
- **Selfish mining** implies that this is tight... Bitcoin is not incentive-compatible



Applications of the Bitcoin Backbone Protocol

Applications of the Backbone: Byz. Agreement [PSL80, LSP82]

- Byzantine agreement (BA): n parties start with an initial value v_i
 - Agreement: All honest parties output the same value
 - Validity: If all honest parties start with the same input (say, v), then they output this value
- BA in the *anonymous synchronous setting*
 - “Anonymous model without port awareness” [Okun05]
 - Deterministic BA not possible
 - *POW-based* protocols (cf. [AJK05, KMS14])

Nakamoto's BA Protocol

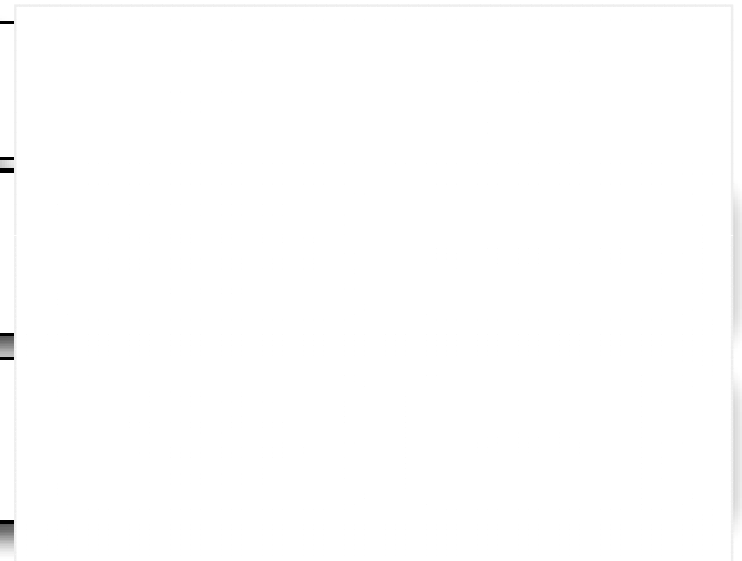
- The n parties start building a blockchain inserting their input
- If a party receives a longer blockchain switches to that one and switches its input
- When the blockchain is long enough the party outputs the value that it contains
- **Intuition:** Agreement would follow from the fact that honest parties will eventually agree on a single chain (for $(1/2)$ -bounded adv.)
- **Issue:** If adv. finds a solution first, then honest parties will extend adv.'s solution and switch to adv.'s input

Our First BA Protocol

- The n parties start building a blockchain inserting their inputs
- If a party receives a longer blockchain switches to that one but *keeps the same input*
- Once the blockchain is long enough the parties prune the last k blocks and output the *majority value* in the prefix
- Protocol tolerates $(1/3)$ -bounded adversaries

Summary of Results (1)

Backbone properties	Nakamoto BA protocol Π_{BA}^{nak}	Our BA protocol $\Pi_{BA}^{1/3}$
common prefix	Agreement $\frac{1}{2}$	Agreement $\frac{1}{2}$
chain quality	Validity ϵ	Validity $\frac{1}{3}$



Applications of the Backbone (2)

- **Robust transaction ledgers:** n unauthenticated parties accept transactions and build a *ledger* so that the following properties are satisfied:
 - (i) **Persistence:** If a transaction is "deep" enough in the ledger for one honest party, then it will be reported by all honest parties at the same location
 - (ii) **Liveness:** All honestly generated transactions eventually get deep enough in the ledger of an honest party
- We show how to instantiate the public transaction ledger for Bitcoin, by defining the sets of transactions and valid ledgers (see paper)

Applications of the Backbone (3)

■ Our second BA protocol

- The n parties build a ledger but now *generate transactions based on POWs that contain their inputs* — input itself must satisfy POW pred.
- Once the blockchain is long enough the parties prune the last k blocks and output the majority of the values drawn from the unique transactions
- Protocol tolerates $(1/2)$ -bounded adversaries
- POWs are *now used for two different tasks*

How do we prevent the adversary from shifting its hashing power from one to the other?

2-for-1 POWs

Algorithm 6 POW-based protocol fragment of Π_b , $b \in \{0, 1\}$ parameterized by q , D and hash functions $H_b(\cdot)$, $G(\cdot)$, $b \in \{0, 1\}$. The value w_b is determined from the protocol's context.

```
1: ... ▷ Value  $w_b$  is determined
2:  $ctr \leftarrow 1$ 
3:  $B \leftarrow \varepsilon$ 
4:  $h_b \leftarrow G(w_b)$ 
5: while ( $ctr \leq q$ ) do
6:   if ( $H(ctr, h_b) < D$ ) then
7:      $B_b \leftarrow \langle ctr, w_b \rangle$ 
8:     break
9:   end if
10:   $ctr \leftarrow ctr + 1$ 
11: end while
12: ... ▷ The POW  $B$  is exploited here
```

Algorithm 7 The *double proof of work* function, parameterized by q , D and hash functions $H(\cdot)$, $G(\cdot)$ that substitutes steps 2-11 of two POW-based protocols.

```
1: function double-pow( $w_0, w_1$ )
2:    $B_0, B_1 \leftarrow \varepsilon$ 
3:    $ctr \leftarrow 1$ 
4:   while ( $ctr \leq q$ ) do
5:      $h \leftarrow H(ctr, G(w_0), G(w_1))$ 
6:     if ( $h < D$ ) then
7:        $B_0 \leftarrow \langle ctr, w_0, G(w_1) \rangle$ 
8:       break
9:     end if
10:    if ( $[h]^R < D$ ) then
11:       $B_1 \leftarrow \langle ctr, w_1, G(w_0) \rangle$ 
12:      break
13:    end if
14:     $ctr \leftarrow ctr + 1$ 
15:  end while
16:  return  $\langle B_0, B_1 \rangle$ 
17: end function
```

Summary of Results (2)

Backbone properties	Nakamoto BA protocol Π_{BA}	Our BA protocol Π'_{BA}	Public Ledger Π_{PL}	Our BA protocol $\Pi_{BA}^{1/2}$
common prefix	Agreement $\frac{1}{2}$	Agreement $\frac{1}{2}$	<i>Persistence:</i> transactions are permanent and ordered $\frac{1}{2}$	Agreement $\frac{1}{2}$
chain quality	Validity c	Validity $\frac{1}{3}$	<i>Liveness:</i> transactions are eventually included $\frac{1}{2}$	Validity $\frac{1}{2}$

Conclusions

- Formal treatment of core of Bitcoin's transaction ledger — the Bitcoin “backbone”
 - “Common prefix” and “chain quality” as foundations for BA and robust transaction ledger protocols
- Deviations of concern
 - Network synchronization *vis-à-vis* POW rate: fast information propagation is essential
 - Adv.'s contributions to blockchain can be strictly larger than β : transaction liveness becomes fragile as $\beta \rightarrow 1/2$
- Fixed no. of participants
 - Difficulty D (“target T”) may be calibrated according to the no. of active players

References

- J. Garay, A. Kiayias and N. Leonardos, “The Bitcoin Backbone Protocol: Analysis and Applications.” Cryptology ePrint Archive: Report 2014/765
<http://eprint.iacr.org/2014/765>
- T. Holenstein, “Is There a Theory Behind Bitcoin?” ITS Science Colloquium 06.11.2014
<http://www.eth-its.ethz.ch/activities/its-science-colloquium/Holenstein.html>

YAHOO! LABS

Science-Driven Innovation

$$P^{(z|a_1)} = k |w, z, (a_1), r, \Theta, \Phi| \alpha$$

$$P^{(z|a_1)} = k |z, (a_1), r, \Theta, \Phi| P^{(w|a_1)} |z, w, (a_1), \Phi|$$

$$f(S_1) = \frac{f(S_1) + f(S_2)}{f(S_1) + f(S_2) + f(S_3) + f(S_4) + f(S_5)}$$

$$\text{Pr}(\text{DIRT}) = \prod_{a \in \Omega} \prod_{i=1}^n (1 - \text{Pr}(a|i))$$

$$f(r) = \frac{\sum_{\{e\} \subseteq E, \text{low appears in } e, t: e \in L(e)} |T|}{|T|} \quad \text{Pr}(q|T) = \frac{\sum_{\{e\} \subseteq E, \text{low appears in } e, t: e \in L(e)} |T|}{|T|}$$

$$\phi_{\lambda}(q, \phi) = \frac{1}{2^{|\Omega|} \text{IDF}(q)} \sum_{e \in S^*} \text{IDF}(e \cap q)$$

$$\hat{\beta} = \arg \min_{\beta} \sum_{i=1}^n (y_i - x_i^T \beta)^2 \quad R^1(A, w) = \frac{|GT^r \cap U_{e \in r, A}|}{|GT^r|}$$

$$\theta_r \sim \text{Dir}(\tilde{n}_r + \tilde{n}_r + \lambda \theta_{\pi(r)})$$

$$\text{Lin}(v, v) = \frac{\sum_{w \in \Omega} w [v(w) + v'(w)]}{\sum_{w \in \Omega} v [v(w) + v'(w)]}$$

$$\begin{aligned} \text{(1)} & \propto \text{Pr}(e, t, \tilde{q}, \tilde{z}) \\ & = \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{q}|e, t) \text{Pr}(\tilde{z}|e, t, \tilde{z}) \\ & \approx \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{z}) \text{Pr}(\tilde{q}|e, t, \tilde{z}) \end{aligned}$$

$$\forall X, r \subseteq \Omega, X \subseteq Y, Y \subseteq \Omega \setminus Y: \\ \text{Pr}(X \cup (Z) - f(X) \geq f(Y \cup (Z)) - f(Y))$$

$$\text{sim}_{\text{set}}(d, d', w) = \mathbb{E}_t[\text{Pr}(d|w) \cdot \text{Pr}(d'|w)]$$

$$\hat{\beta} = \arg \min_{\beta} \|Y - X\beta\|_2^2 = \arg \min_{\beta} \sum_{i=1}^n (y_i - x_i^T \beta)^2$$

$$\text{Pr}(I) = \max_{I \subseteq \Omega, I} \text{Pr}(I)$$

$$E(S_1) = \frac{\sum_{j>1} f(S_j) I_j}{\sum_{j>1} f(S_j)}$$

$$f(S_2) = \frac{f(S_1) + f(S_2)}{f(S_1) + f(S_2) + f(S_3) + f(S_4) + f(S_5)}$$

$$\text{score}_{\text{DIRT}}(LHS \rightarrow RHS)$$

$$= \sqrt{\text{sim}(v_r^2, v_r^2) \cdot \text{sim}(v_1^H, v_1^H)}$$

$$\text{(1)} \text{Pr}(v_r, \Theta, \Phi) \propto \text{Pr}(w|a_1) |z, w, (a_1), \Phi|$$

$$\text{Pr}(t, z|e, \tilde{q}) \propto \text{Pr}(e, t, \tilde{q}, \tilde{z})$$

$$= \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{z}|e, t) \text{Pr}(\tilde{q}|e, t, \tilde{z})$$

$$\approx \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{z}) \text{Pr}(\tilde{q}|e, t, \tilde{z})$$

$$\text{(2)} \quad B = \begin{pmatrix} f(I_1^U) \\ \vdots \\ f(I_1^D) \end{pmatrix} = (p^{i_1}, p^{i_2}, \dots, p^{i_n})$$

$$\text{(1)} \text{(2)} \frac{\text{Pr}(t|e) \text{Pr}(\tilde{z}|e, t) \text{Pr}(\tilde{q}|e, t, \tilde{z})}{\text{Pr}(t|e) \text{Pr}(\tilde{z}) \text{Pr}(\tilde{q}|e, t, \tilde{z})} = \sum_{i=1}^{i=I-1} (\beta_i - \beta_{i+1})^2$$

$$Y = \arg \min_Y \|Q - P Y\|_2^2 + \|\tilde{F}(\Lambda_1) Y\|_2^2 + \|\tilde{F}(\Lambda_2) Y\|_2^2$$

$$f(S_1) + \hat{f}(S_2) \arg \min \|Y - X\beta\|_2^2 = \arg \min_{\beta} \sum_{i=2}^n (y_i - x_i^T \beta)^2$$

$$\text{Pr}(\text{DIRT}) = \prod_{a \in \Omega} \prod_{i=1}^n (1 - \text{Pr}(a|i))$$

$$\|\tilde{F}(\Lambda_1) Y\|_2^2 + \|\tilde{F}(\Lambda_2) Y\|_2^2 \quad \text{Pr}(q|T) = \frac{\sum_{\{e\} \subseteq E, \text{low appears in } e, t: e \in L(e)} |T|}{|T|}$$

$$\hat{Y} = \arg \min_Y \|Q - P Y\|_2^2 + \|\tilde{F}(\Lambda_1) Y\|_2^2 + \|\tilde{F}(\Lambda_2) Y\|_2^2$$

$$\phi_{\lambda}(q, \phi) = \frac{1}{2^{|\Omega|} \text{IDF}(q)} \sum_{e \in S^*} \text{IDF}(e \cap q)$$

$$\sum_{i=1}^{i=I-1} (\beta_i - \beta_{i+1})^2 \quad R^1(A, w) = \frac{|GT^r \cap U_{e \in r, A}|}{|GT^r|}$$

$$\theta_r \sim \text{Dir}(\tilde{n}_r + \tilde{n}_r + \lambda \theta_{\pi(r)})$$

$$\text{Lin}(v, v) = \frac{\sum_{w \in \Omega} w [v(w) + v'(w)]}{\sum_{w \in \Omega} v [v(w) + v'(w)]}$$

$$\text{(1)} \propto \text{Pr}(e, t, \tilde{q}, \tilde{z})$$

$$= \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{z}|e, t) \text{Pr}(\tilde{q}|e, t, \tilde{z})$$

$$\approx \text{Pr}(e) \text{Pr}(t|e) \text{Pr}(\tilde{z}) \text{Pr}(\tilde{q}|e, t, \tilde{z})$$