



TRUTH

JUSTICE

ALGOS

Cryptocurrencies II: Selfish Mining

Teachers: Ariel Procaccia and Alex Psomas (this time)

- Last time:
 - Basic concepts
 - Double spend attack
- Today: Block withholding attacks (Selfish mining)
 - Get a taste of some AGT works on cryptocurrencies

SETUP

- Each miner i has mining power p_i
- $\sum_{i=1}^n p_i = 1$
- Each miner chooses a chain to mine on top of, and find a block after a random time t distributed (according to an exponential random variable with mean p_i^{-1})
- Pools behave as a single agent with mining power equal to the sum of participants
- The expected **reward** of i is the (expected) fraction of blocks that i mined out of the total number of blocks *in the longest chain*

LONGEST CHAIN IN THIS WORLD

- Whenever selected to build a block, point to the node “furthest from the root”
 - Break ties in favor of the one you hear first
- Broadcast to the whole network

Intuition [Nakamoto 08, the entire Bitcoin community]

- If all other miners follow the longest chain protocol
- And you have $<50\%$ of the mining power
- Your best response is to also follow the longest chain protocol

WHY?

- Intuition:
- You only get rewards if your blocks are included in the longest chain
- The rest of the network has more power than you, so if you try to mine your own private chain you'll never catch up
- Nakamoto even has a correct random walk analysis
 - Doesn't consider more clever deviations

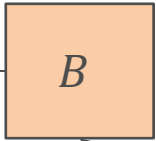
SELFISH MINE: IDEA

- Everyone mines on top of block B
- Hide a valid block B_s
- Everyone else is wasting resources trying to extend B , while you extend B_s without any competition

Theorem [Eyal-Sirer 14]

If you have $>33\%$ of the mining power, following the longest chain protocol is **not** a best response to all others following the longest chain protocol

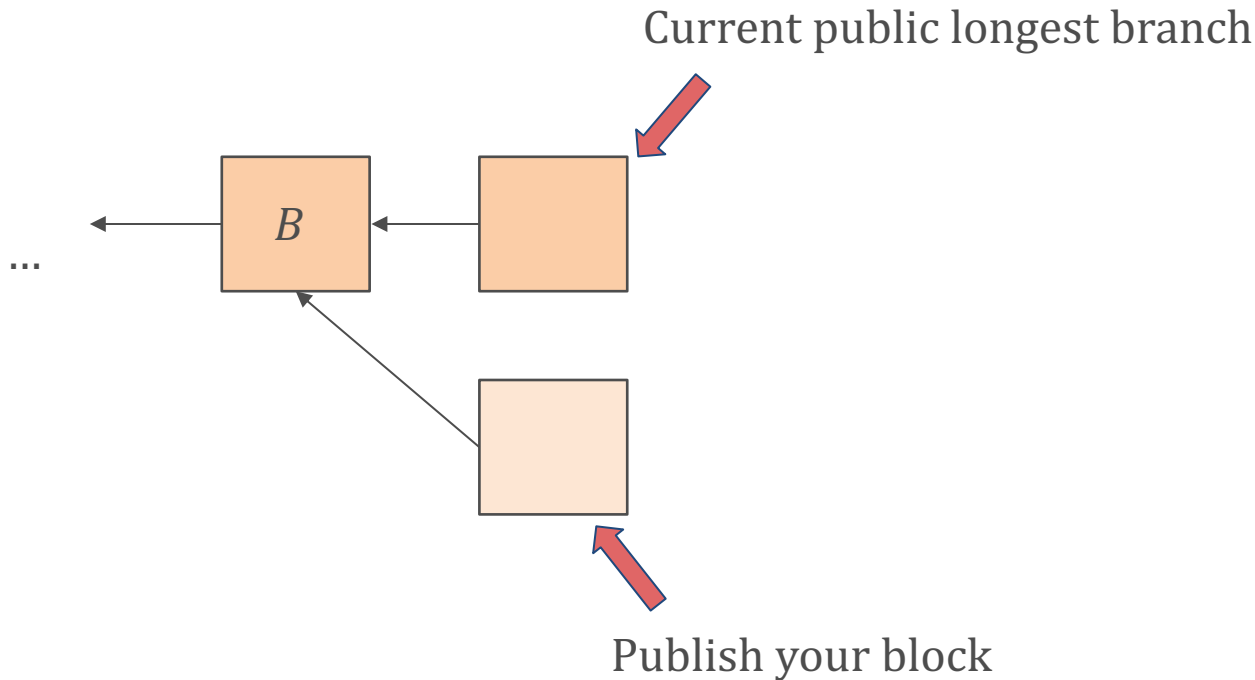
Current public longest branch



Keep this one secret

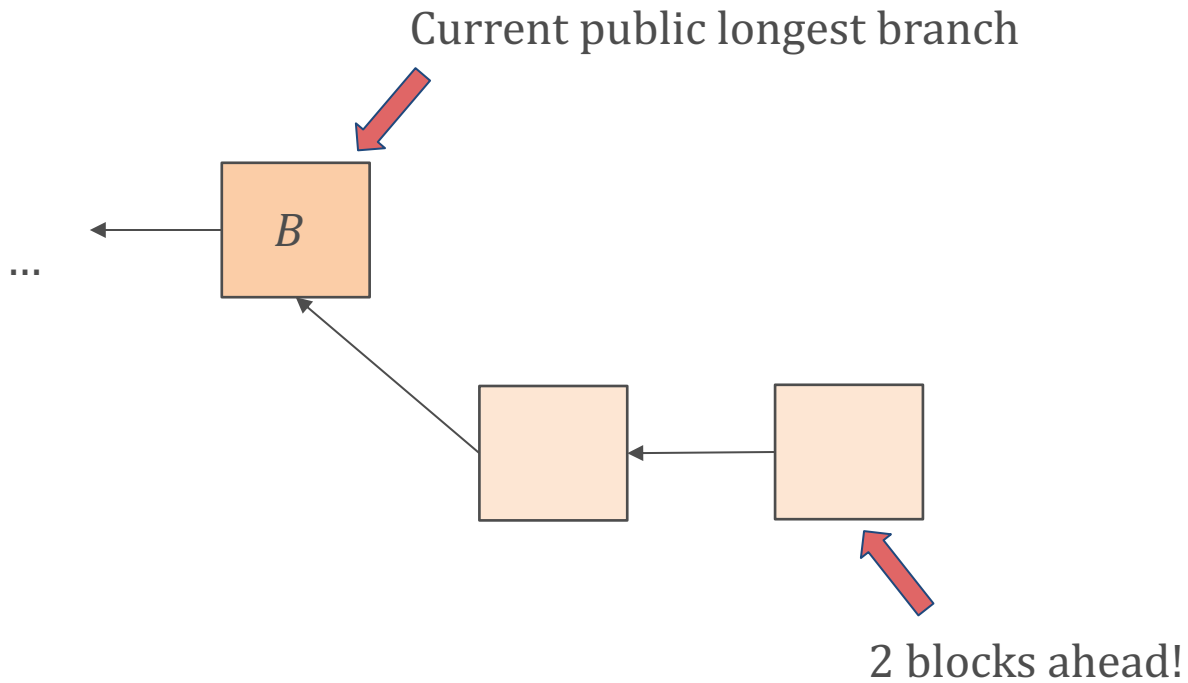
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SCENARIO 1: THE OTHERS CATCH UP



- Some honest miners will try extend your block because they heard about it first (natural network delays)
- Basically a toss-up

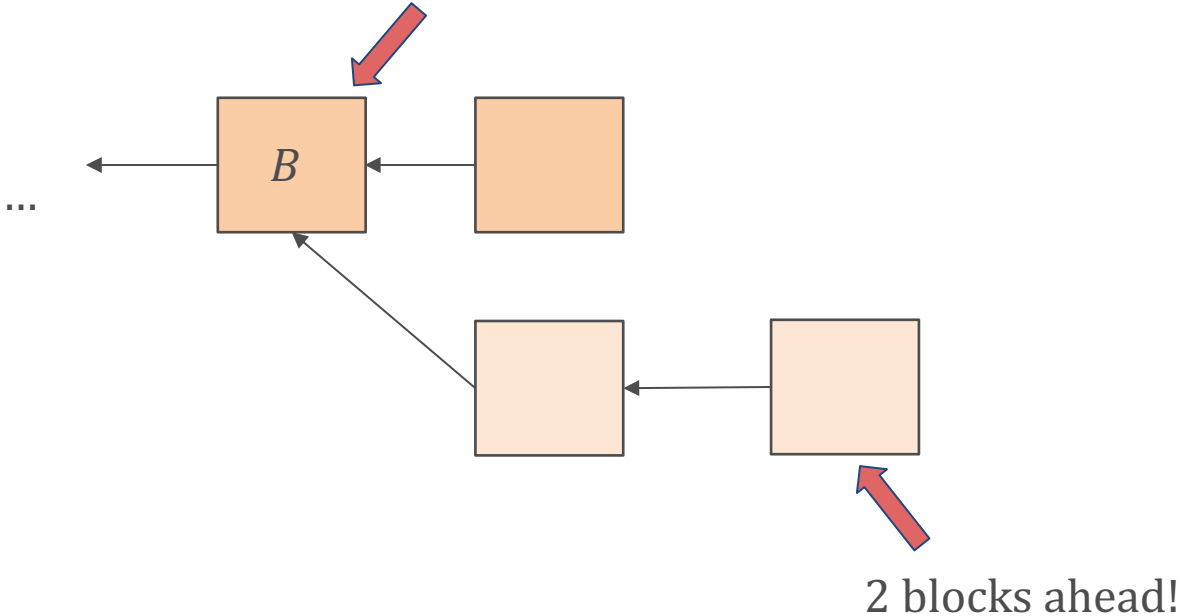
SCENARIO 2: YOU MINE A NEW ONE



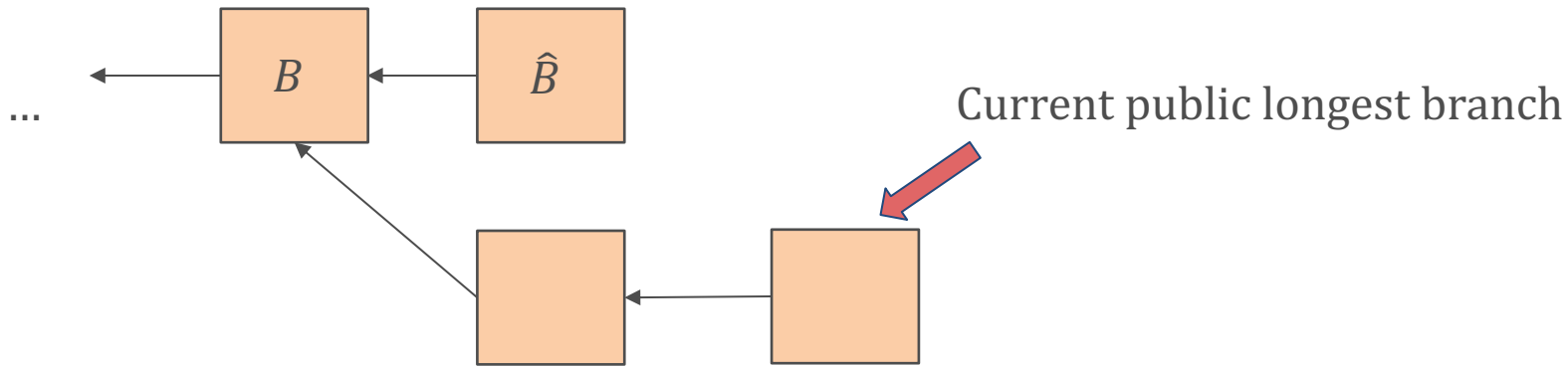
Try to make your private chain even longer!

SCENARIO 2: YOU MINE A NEW ONE

Current public longest branch



SCENARIO 2: YOU MINE A NEW ONE



- Intuition: The effort of honest miners for creating \hat{B} is wasted!

TOY ANALYSIS

- **LuckyLongestChain:**
 - Whenever selected to build a block, point to the longest chain node, and break ties in favor of SelfishMiner.
 - Always broadcast your block.
- **LuckySelfishMine**
 - Whenever selected to build a block, point to the longest chain node, and break ties in favor of SelfishMiner.
 - Broadcast your block iff there is another node of the same distance from the root

TOY ANALYSIS

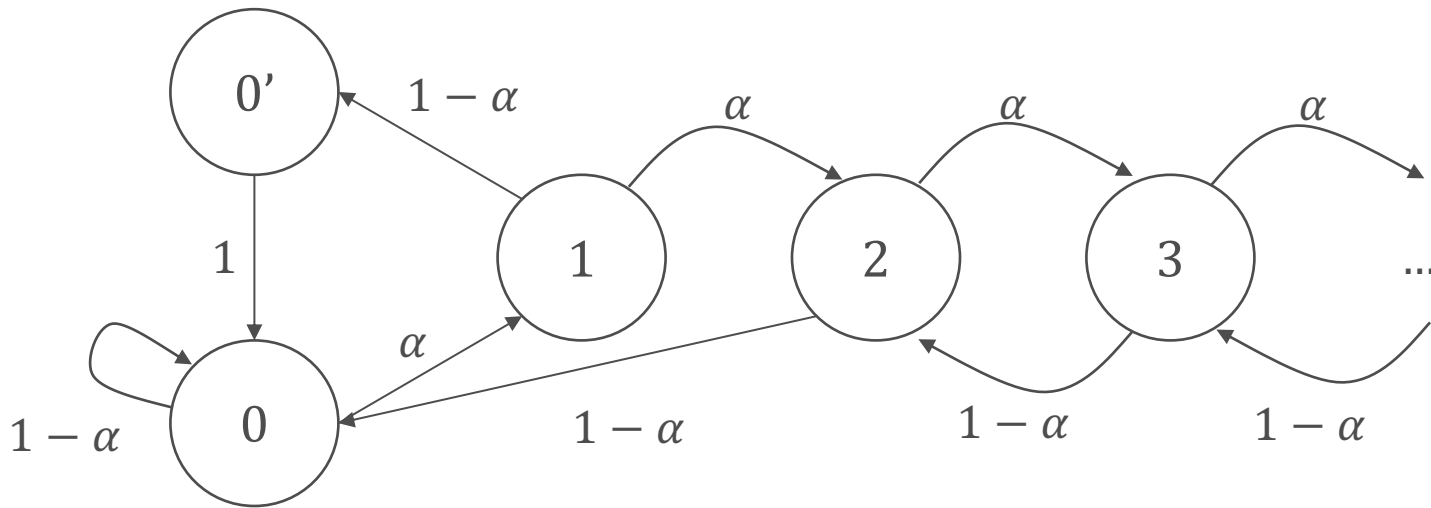
- LuckySelfishMine is strictly better than LuckyLongestChain, if everyone else is playing LuckyLongestChain.
 - With x fraction of the mining power it gives $x/(1 - x)$ fraction of the blocks (instead of x)
- Intuition:
 - Every block is on the longest chain
 - Every block “negates” one other block by the honest people, effectively reducing the overall computational power that goes in actual block making
- We’ll show morally the same result for real LongestChain

SELFISH MINE RECAP

- Maintain a private chain
- If *private chain* = 0, and others find block try to extend that
- If *private chain* = 1 and others find block, publish *private chain* and try to extend it
- If *private chain* = 2 and others find block, publish *private chain* and restart
- If *private chain* > 2 and others find block, publish first unpublished block of *private chain*

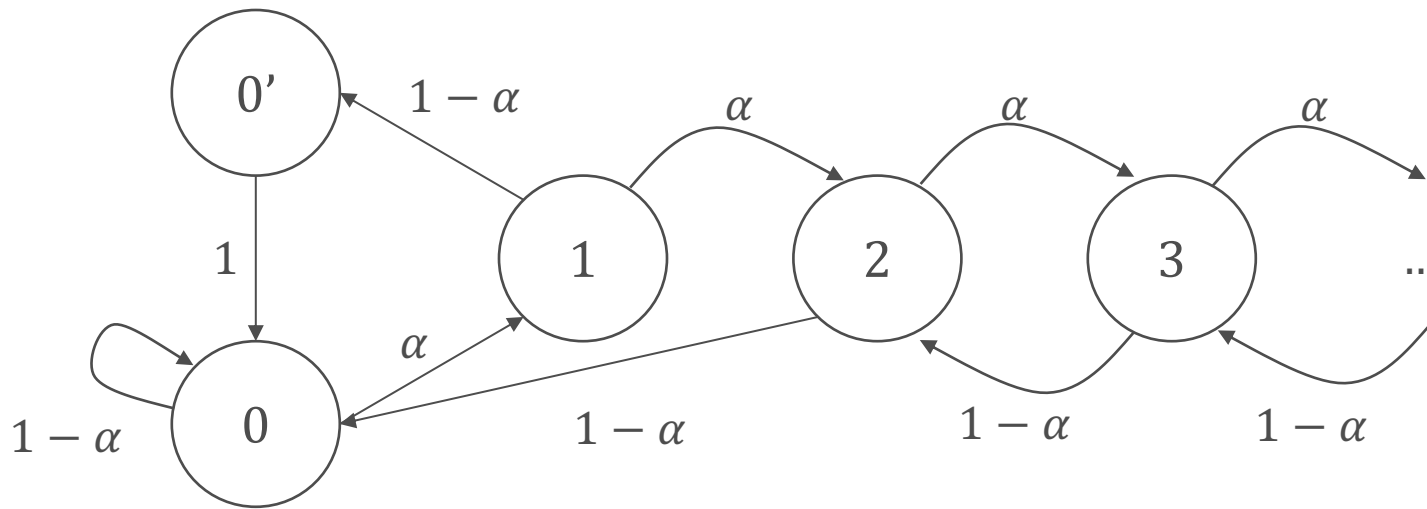
MODEL AS A 2 PLAYER GAME

- Attacker has α fraction of the computational power
- Honest miners have a $1 - \alpha$ fraction
- $\gamma =$ fraction of honest miners who break tie in favor of the attacker when there are two branches of equal length
- Goal: show that the selfish mining attack leads to the attacker having more than an α fraction of the blocks in the final chain



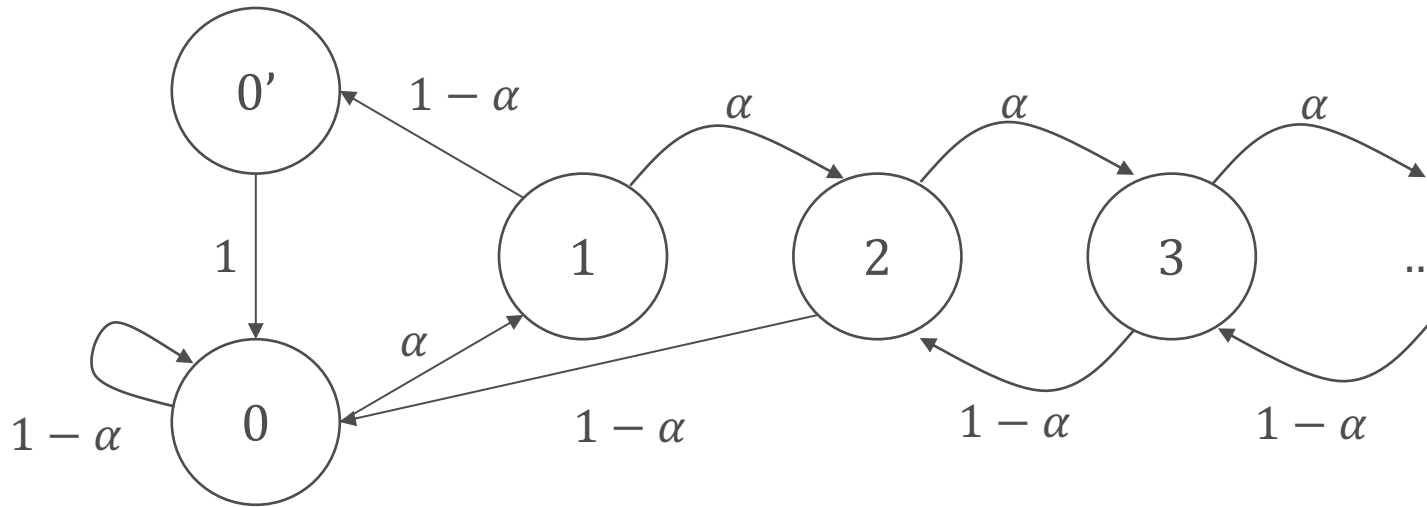
- State 0: no branches
- State 0': two public branches of length 1
- State i : private chain is i blocks long
- From 0' to 0:
 - Attacker makes a public block with frequency α
 - Honest miners that follow attacker make a public block with frequency $(1 - \alpha)\gamma$
 - Honest miners not following attacker make a public block with frequency $(1 - \alpha)(1 - \gamma)$

ANALYSIS



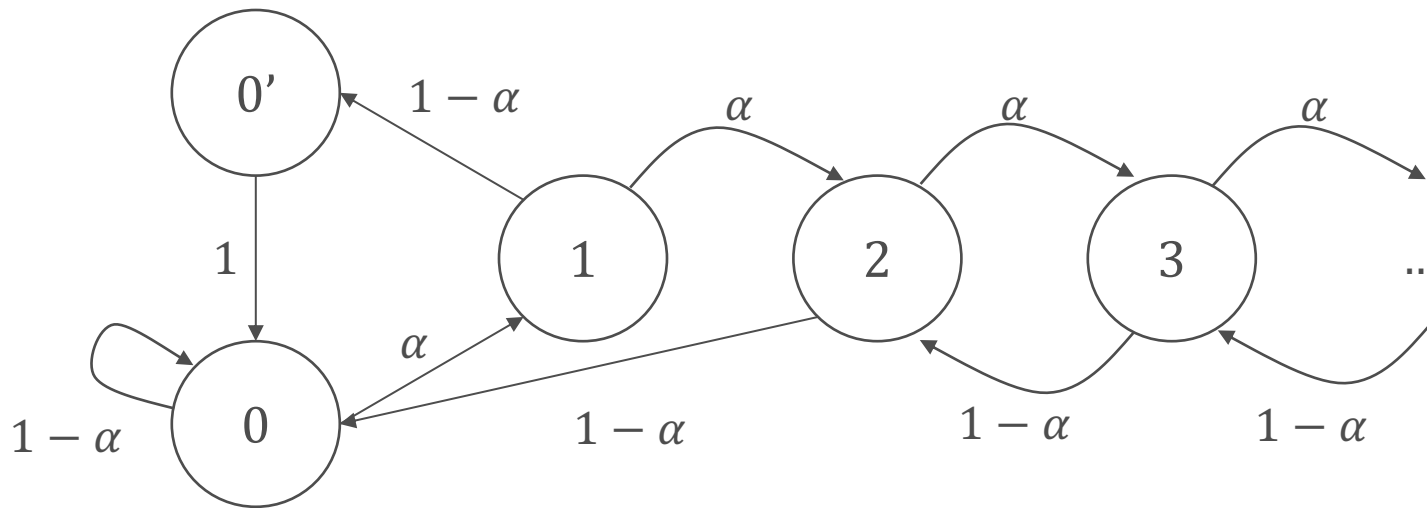
- $p_0 = (1 - \alpha)p_1 + (1 - \alpha)p_2 + (1 - \alpha)p_0$
- $p_{0'} = (1 - \alpha)p_1$
- $\alpha p_1 = (1 - \alpha)p_2$
- $\forall k \geq 2: \alpha p_k = (1 - \alpha)p_{k+1}$
- $\sum_{k=0}^{\infty} p_k + p_{0'} = 1$

ANALYSIS



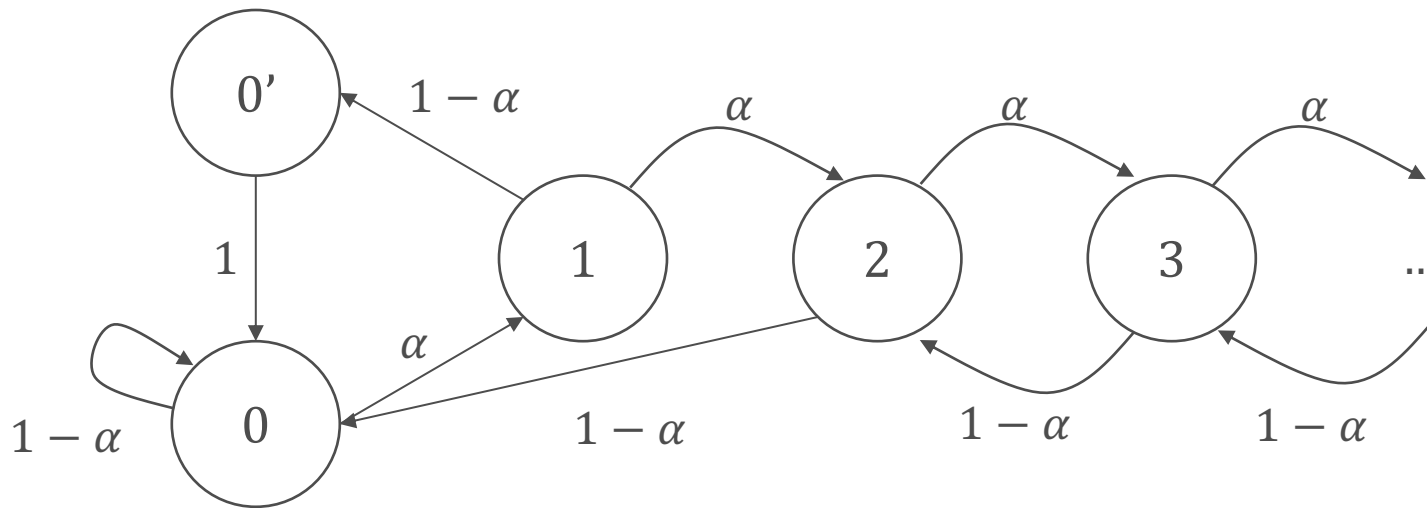
- $p_0 = \frac{\alpha - 2\alpha^2}{\alpha(2\alpha^3 - 4\alpha^2 + 1)}$
- $p_{0'} = \frac{(1 - \alpha)(\alpha - 2\alpha^2)}{1 - 4\alpha^2 + 2\alpha^3}$
- $p_1 = \frac{\alpha - 2\alpha^2}{2\alpha^3 - 4\alpha^2 + 1}$
- $\forall k \geq 2, p_k = \left(\frac{\alpha}{1 - \alpha}\right)^{k-1} \frac{\alpha - 2\alpha^2}{2\alpha^3 - 4\alpha^2 + 1}$

REVENUE



- a) Two branches of length 1, attacker finds a block
 - Attacker makes revenue of 2
 - $r_{att} += 2 \cdot p_{0'} \cdot \alpha$
- b) Two branches of length 1, honest miners find a block on top of attacker's block
 - Attacker and honest make 1 each
 - $r_{att} += p_{0'} \cdot \gamma \cdot (1 - \alpha), r_{hon} += p_{0'} \cdot \gamma \cdot (1 - \alpha)$
- c) Two branches of length 1, honest miners find a block on top of honest block
 - Honest make revenue of 2
 - $r_{hon} += p_{0'} \cdot (1 - \gamma) \cdot (1 - \alpha)$

REVENUE



d) No private branch, honest find block

- Honest make revenue of 1
- $r_{hon} += p_0 \cdot (1 - \alpha)$

e) Lead is 2. Honest find block; attacker publishes private chain

- Attacker makes revenue of 2
- $r_{att} += p_2 \cdot (1 - \alpha) \cdot 2$

f) Lead more than 2. Honest find block; attacker publishes one block

- Attacker makes revenue of 1
- $r_{att} += \Pr[\text{lead} > 2] \cdot (1 - \alpha)$

REVENUE

- Protocol adjusts difficulty so that there is a block every ~ 10 mins
- So, total revenue for attacker is

$$\frac{r_{att}}{r_{att} + r_{hon}} = \frac{\alpha(1 - \alpha)^2(4\alpha + \gamma(1 - 2\alpha)) - \alpha^3}{1 - \alpha(1 + (2 - \alpha)\alpha)}$$

Observation: Selfish mining is profitable when

$$\frac{1 - \gamma}{3 - 2\gamma} < \alpha < \frac{1}{2}$$

REVENUE

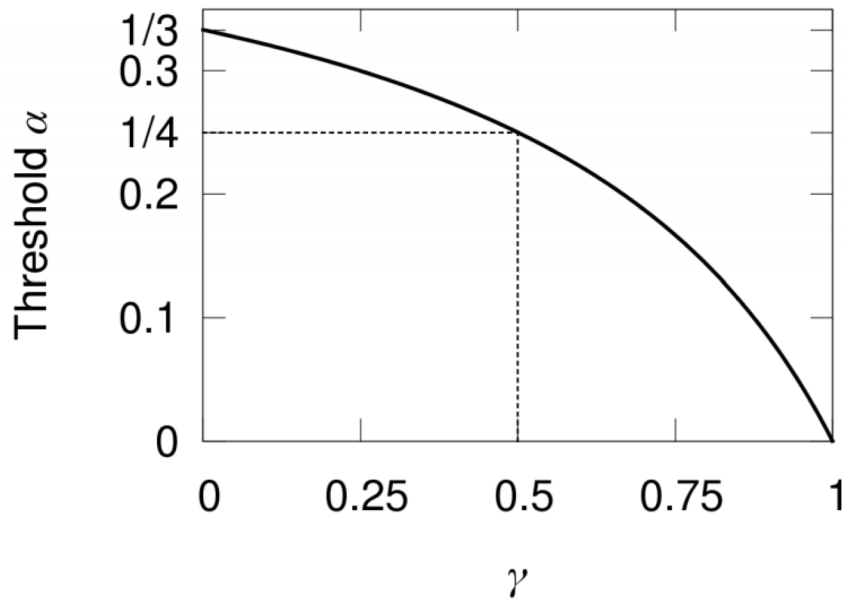


Fig. 3: For a given γ , the threshold α shows the minimum power selfish mining pool that will trump the honest protocol. The current Bitcoin protocol allows $\gamma = 1$, where Selfish-Mine is always superior. Even under unrealistically favorable assumptions, the threshold is never below $1/3$.

KIAYIAS, KOUTSOUPIAS, KYROPOULOU, TSELEKOUNIS 16

- Study strategic considerations regarding block withholding
- When is honest/longest chain behavior a Nash equilibrium?

SETUP [KKKT 16]

- n players/miners
- p_i = Probability that miner solves puzzle
 - $\sum_i p_i = 1$
- d = Depth of the game
 - Payoffs count only after d blocks
 - Mostly $d = \infty$
- r^* = reward of mining a block
 - Normalized to 1

SETUP

- Public state:
 - A rooted tree of blocks
 - Every node is labeled by one of the players (the miner)
 - Every level has at most one block labeled by player i (no reason for i to mine two)
- Private state of player i :
 - Same as public state, but might have some extra blocks labeled by i
 - Public state is a subtree

TWO MODELS

1. Immediate release model (today)

- Whenever a miner succeeds in mining a block, he releases it immediately, and all miners can continue from the newly mined block.

2. Strategic release model

- Whenever a miner succeeds in mining a block, it becomes common knowledge. The miner can decide to postpone its release; others cannot extend it until its public, but know it exists
- Of course, not meant to be realistic, but a stepping stone to the incomplete information game

STRATEGIES

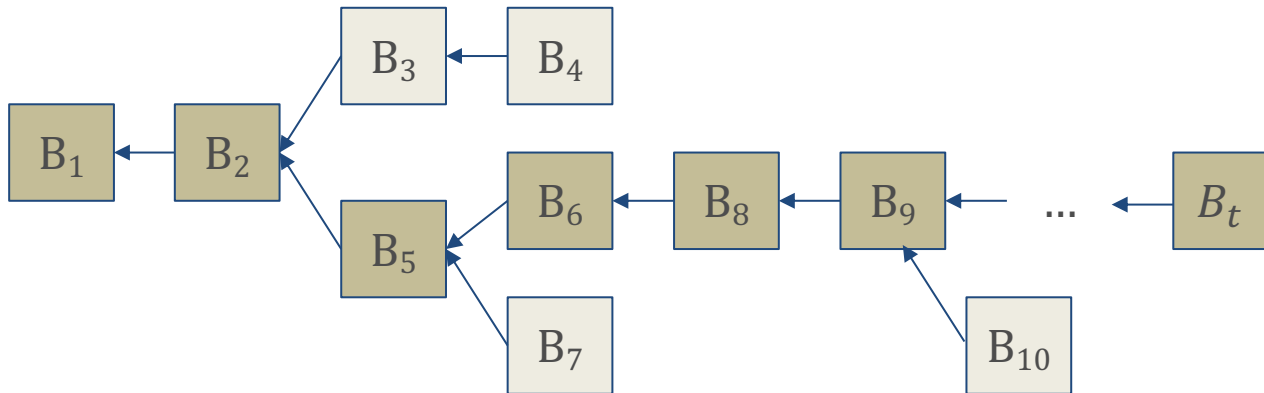
- Strategy: Two functions (μ_i, ρ_i)
 - Mining function μ_i selects a block from the public state to mine
 - Release function ρ_i which is a (perhaps empty) private part of the player's state which is added to the public state.
- FRONTIER/honest strategy: release any mined block immediately and select to mine one of the deepest blocks

PHASES

- Game is played in phases
- In phase t player i is selected with probability p_i to extend the block indicated by μ_i
- Then everyone adds information to the public tree according to their release functions
- Repeat

PAYMENTS

- A miner makes revenue of 1 for *every* node in the *first* path to make it to depth d

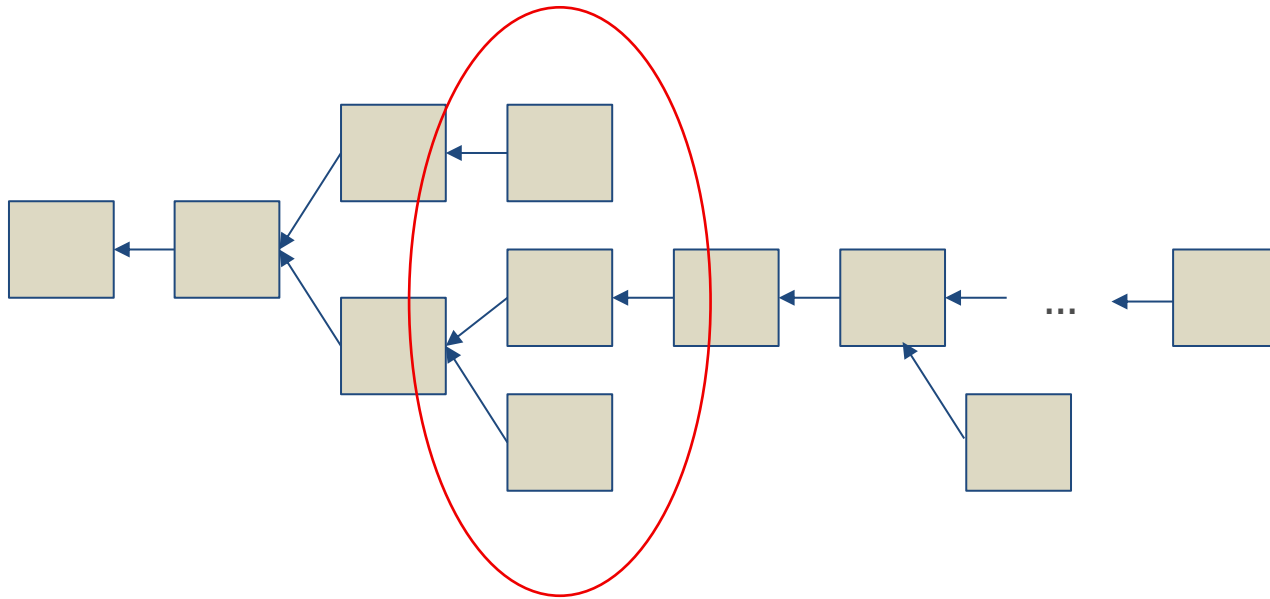


- Once B_5 is paid, no one tries to extend B_3 or B_4

IMMEDIATE RELEASE GAME

- Want to see when FRONTIER is a best response to everyone else playing FRONTIER
- Problem reduces to a two player game
- Miner 2 with computational power $1 - p$ plays honestly/FRONTIER
- Miner 1 with computational power p best responds to miner 1
- Public state is a tree of width at most 2: two long branches with lengths (a, b)
 - a = length of branch where miner 1 mines
 - b = length of branch where miner 2 mines

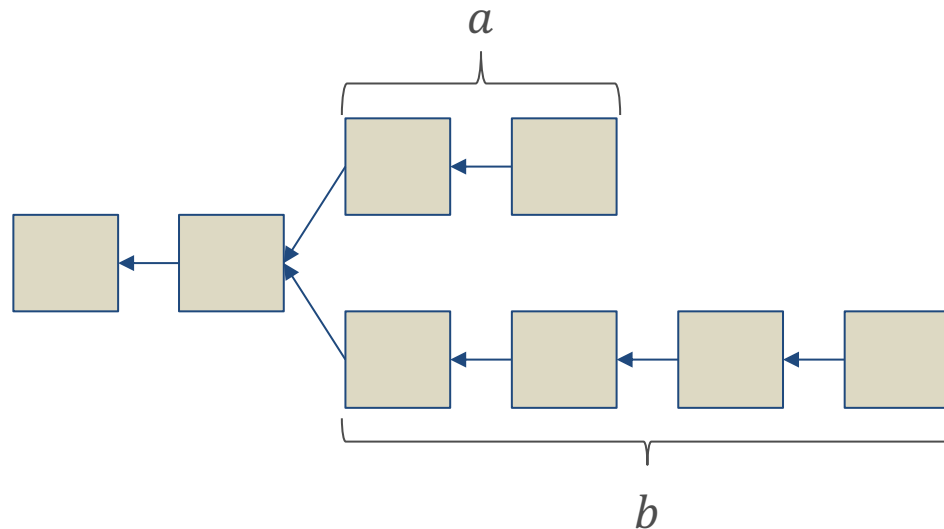
IMMEDIATE RELEASE GAME



This never happens

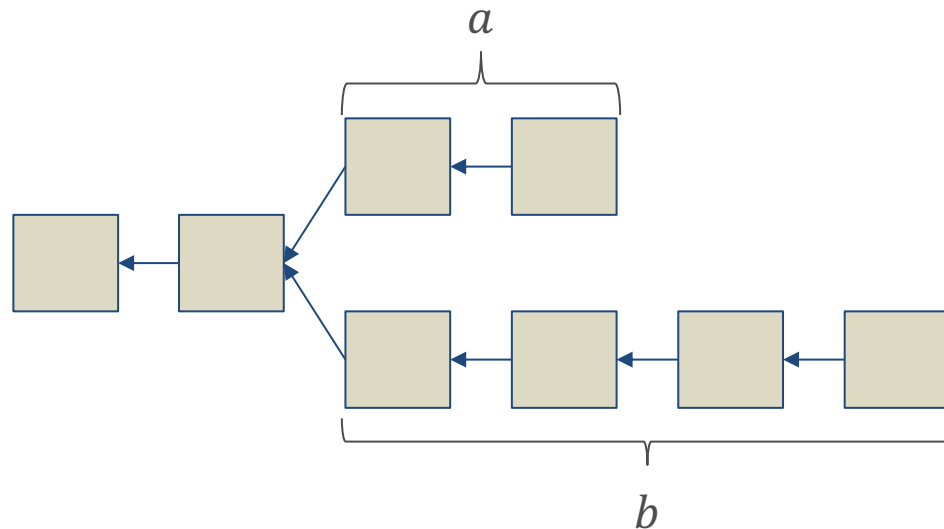
IMMEDIATE RELEASE GAME

- State could be $(0,0)$
- If $b > 0$, then since Miner 2 is extending the longest chain, $b > a$
 - Eg $(3,1)$ never happens



IMMEDIATE RELEASE GAME

- **Mining states (M):** both mine their own chain
- **Capitulation states (C):** miner 1 gives up
- **Winning states (W):** miner 2 switches ($a > b$)



IMMEDIATE RELEASE GAME

- $g_k(a, b)$: expected gain of miner 1 when the branch of the honest miner in the execution tree is extended by k levels, when starting from an (a, b) tree
 - Intuitively should not depend on (a, b)
- g^* = expected gain per level
- $g^* = \frac{g_k(a,b) - g_{k'}(a,b)}{k - k'}$, for large k, k' and all a, b
- $g_k(a, b) = k \cdot g^* + \phi(a, b)$
 - $\phi(a, b) = \lim_{k \rightarrow \infty} g_k(a, b) - k \cdot g^* =$ advantage of miner 1 for being in state (a, b)
 - Alternatively, $\phi(a, b)$ is the expected value of $g_k(a, b) - k \cdot g^*$ until $(0,0)$ is reached
- Objective of miner 1: **maximize g^***

IMMEDIATE RELEASE GAME

- For $(a, b) \in M$: with probability p we go to $(a + 1, b)$, otherwise to $(a, b + 1)$
- For $(a, b) \in C$: miner 1 abandons branch.
New state $(0, s)$
 - Not necessarily $(0,0)$
- For $(a, b) \in W$: miner 2 abandons branch.
New state $(0,0)$

- Strategy = pair (M, s) where $(0, s)$ is the state miner 1 jumps to when giving up

IMMEDIATE RELEASE GAME

- Define $g_k(a, b)$ recursively

$$\begin{aligned}
 &g_k(a, b) \\
 = &\begin{cases} g_{k-1}(0,0) + a, & \text{if } a = b + 1 \\ \max\{ \underbrace{\max_{s=0, \dots, b-1} \{g_k(0, s)\}}_{\text{Give up}}, \underbrace{p g_k(a+1, b) + (1-p) g_{k-1}(a, b+1)}_{\text{Don't give up}} \} \end{cases}
 \end{aligned}$$

- Similar for ϕ

$$\begin{aligned}
 &\phi(a, b) \\
 = &\begin{cases} \phi(0,0) + a - g^*, & \text{if } a = b + 1 \\ \max\{ \max_s \phi(0, s), p \phi(a+1, b) + (1-p) \phi(a, b+1) - (1-p) g^* \} \end{cases}
 \end{aligned}$$

- $\phi(0,0) = 0$

IMMEDIATE RELEASE GAME

Theorem: FRONTIER is not a best response for $p \geq 0.455$

Proof:

- Say $d = 3$
- $M = \{(0,0), (0,1), (1,1), (1,2), (2,2)\}$, $s = 1$
 - Capitulate in (a, b) , $b \geq 3$, and jump to $(0,1)$
- Need to confirm that $g^* \geq p$
 1. Compute $\phi(a, b)$
 - $\phi(0,0) = 0$, $\phi(0,1) = (g^* - p)/(1 - p)$, $\phi(2,2) = \dots$
 2. It must be that $\phi(a, b) \geq \phi(0,1)$ for $(a, b) \in M$
 3. Picking $g^* = \frac{p^2(2+2p-5p^2+2p^3)}{1-p^2+2p^3-p^4}$ makes everything hold for all $p \geq 0.455$

IMMEDIATE RELEASE GAME

Theorem: FRONTIER is a NE if and only if $p \leq h_0$, where $h_0 \in [0.361, 0.455]$

Corollary: Frontier is a NE if $p \leq 0.361$

IMMEDIATE RELEASE GAME

Proof sketch:

Starting at any state (a, b) , one of the two miners will give up.

1. Bound the probability that miner 1 wins this race starting from state (a, b)
 - $r(a, b) \leq \left(\frac{p}{1-p}\right)^{1+b-a}$
2. Bound the difference of ϕ between different states as a function of the probability of winning
 - $\phi(a, b)$ is non-decreasing in a
3. Using all of the above, get an upper bound on $\phi(0,1)$ as a function of p
 - $\phi(0,1)$ can't be positive, so solve for p

STRATEGIC RELEASE GAME

Theorem: FRONTIER is a NE when a miner i has relative computational power $p_i \leq 0.308$

Major open direction:

- Do these results extend to incomplete information games?

NEXT TIME

- Transaction fees
- Incentives in mining pools
- Beyond Proof of Work