# Selfish Mining in Blockchain Systems

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#### **Outlines**

- Introductions
  - Blockchains
  - Selfish Mining Strategy
- 2 Research Works on Multiple Selfish Miners
  - Multiple Selfish Mining Strategy
  - An Accurate Analytical Model (ICC2024)
  - Rational Mining Strategy (ICNC2024)
- Ongoing & Future Works
  - A Stochastic Lightweight Blockchain
  - Security Analysis of Sharded Blockchains



#### **Bitcoins**

#### Bitcoin: A Peer-to-Peer Electronic Cash System

Satoshi Nakamoto satoshin@gmx.com www.bitcoin.org

Abstract. A purely peer-to-peer version of electronic cash would allow online payments to be sent directly from one party to another without going through a financial institution. Digital signatures provide part of the solution, but the main benefits are lost if a trusted third party is still required to prevent double-spending. We propose a solution to the double-spending problem using a peer-to-peer network. The network timestamps transactions by hashing them into an ongoing chain of hash-based proof-of-work, forming a record that cannot be changed without redoing the proof-of-work. The longest chain not only serves as proof of the sequence of events witnessed, but proof that it came from the largest pool of CPU power. As long as a majority of CPU power is controlled by nodes that are not cooperating to attack the network, they'll generate the longest chain and outpace attackers. The network itself requires minimal structure. Messages are broadcast on a best effort basis, and nodes can leave and rejoin the network at will, accepting the longest proof-of-work chain as proof of what happened while they were gone.



#### **Blockchains**

- Blockchain is a decentralized ledger stored in a distributed network
- Transactions are securely stored in blocks
- Consecutive blocks form a blockchain using cryptography
- Hash value of previous block is stored

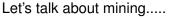




## Mining & Miners

- Node creating the block earns rewards (Miner)
- Mining is the process to create a valid block in order to get rewards







## **Mining & Proof-of-Works**

• Who will earn the reward?

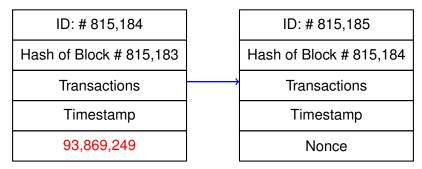
ID: # 815,184
Hash of Block # 815,183
Transactions
Timestamp
Nonce

Hash of Block #815,183:



## Mining & Proof-of-Works

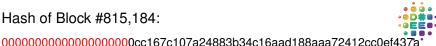
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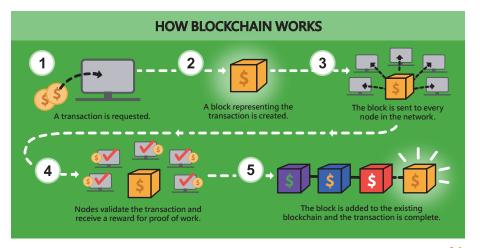
Hash of Block #815,183:

0000000000000000003d09220e85bbdbb832b86e3dc711c5cda888b1daf5985

Hash of Block #815,184:



#### **How A PoW Blockchain Works?**

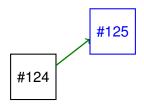




- How many rewards can a miner earn?
- The number of nonces attempted by a miner per unit of time is defined as his mining rate
- Generally, the probability which the next block is mined by a specific miner shall be proportional to his mining rate
- A mining strategy called selfish mining enables a miner to be profitable; that is, to earn more rewards than he would be entitled to
- Main idea of selfish mining is not to broadcast the mined blocks when a selfish miner mined a new block

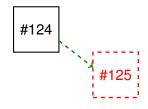
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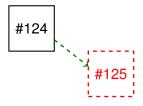


- If honest miner mined the next block first, he announces the block immediately
- All other miners validate the block and start to mine the next one

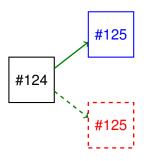




- If honest miner mined the next block first, he announces the block immediately
- All other miners validate the block and start to mine the next one
- If selfish miner mined the next block first, he hides the block in his private branch and starts to mine the next one



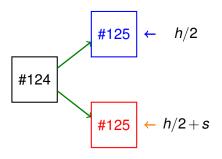




If then honest miner mined the next block first under the above condition:

The honest miner announces the block immediately

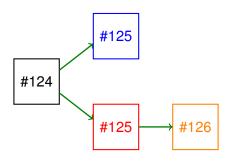




If then honest miner mined the next block first under the above condition:

- The honest miner announces the block immediately
- The selfish miner releases his hidden block immediately

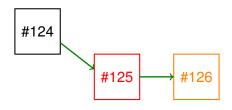
Longest Chain Rule: The branch on which the next block is mined (longest chain) becomes the valid chain



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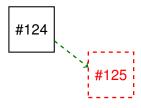
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Longest Chain Rule: The branch on which the next block is mined first (longest chain) becomes the valid chain



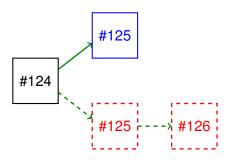




If selfish miner mined the next block first under the above condition:

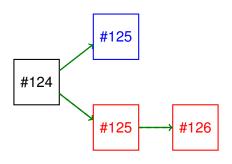
The selfish miner hides the blocks in his branch





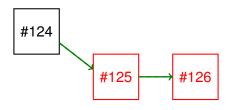
- The selfish miner hides the blocks in his branch
- If the honest miner mined the block now, the honest miner releases the block immediately





- The selfish miner hides the blocks in his branch
- If the honest miner mined the block now, the honest miner releases the block immediately
- The selfish miner releases his all blocks immediately



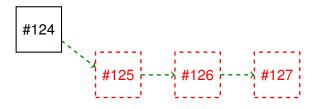


- The selfish miner hides the blocks in his branch
- If the honest miner mined the block now, the honest miner releases the block immediately
- The selfish miner releases his all blocks immediately
- Longest chain rule is applied





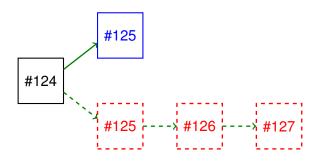




If selfish miner mined the next block first under the above condition:

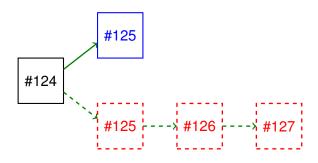
• The selfish miner hides the blocks in his branch





- The selfish miner hides the blocks in his branch
- If the honest miner mined the block now, the honest miner releases the block immediately





- The selfish miner hides the blocks in his branch
- If the honest miner mined the block now, the honest miner releases the block immediately
- The selfish miner does NOTHING now



#### **Reward Earned by Selfish Miner**

Analytical Model Proposed by I. Eyal and E.G. Sirer

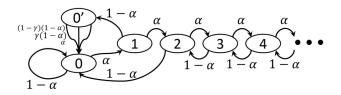


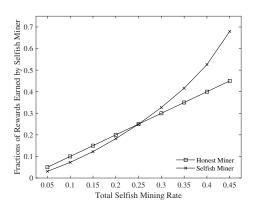
Fig. 1: State machine with transition frequencies.

• Fraction of reward earned by the selfish miner  $RW(\alpha)$  can be calculated by a closed-form function of his mining rate  $\alpha$ 

$$\label{eq:RW} \textit{RW}(\alpha) = \left\{ \begin{array}{ll} 1 & \text{if } \alpha \geq 0.5, \\ \frac{\alpha(1-\alpha)^2[4\alpha + \frac{1}{2}(1-2\alpha)] - \alpha^3}{1-\alpha[1+(2-\alpha)\alpha]} & \text{otherwise} \ . \end{array} \right.$$



#### **Rewards & Profitable Threshold (25%)**



- Profitable: Earns more than those earned if he is honest
- Profitable threshold: the smallest mining rate making a miner profitable

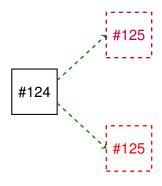


#### **Multiple Selfish Miners**

- Selfish mining strategy enables a miner to be profitable
- Multiple miners with sufficient mining rates may choose to employ selfish mining strategy in order to earn more rewards
- There will be multiple independent selfish miners in the blockchain without knowing each other
- We consider a blockchain with TWO selfish miners in this paper

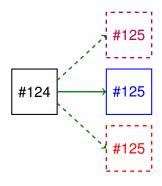


An honest miner  $Henry(r_h)$  and two selfish miners  $Alice(r_a)$  and  $Bob(r_b)$ 



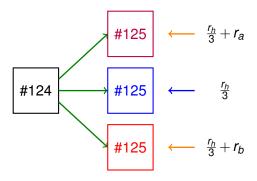


An honest miner  $Henry(r_h)$  and two selfish miners  $Alice(r_a)$  and  $Bob(r_b)$ 





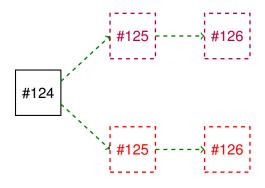
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Longest chain rule shall be applied.

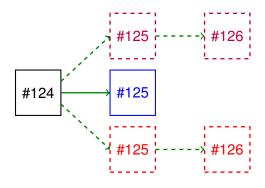


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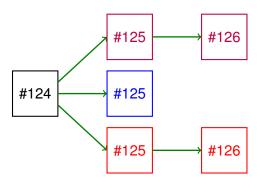


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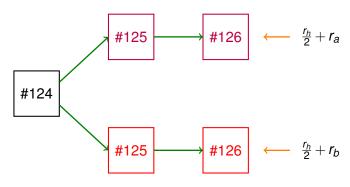
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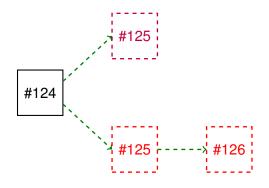


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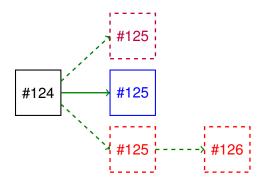


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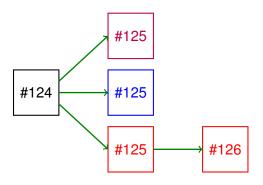






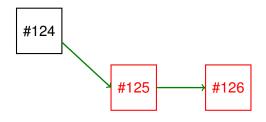






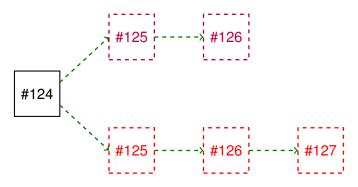


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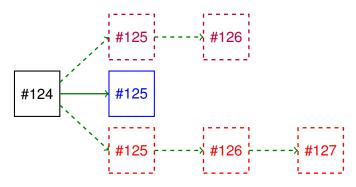


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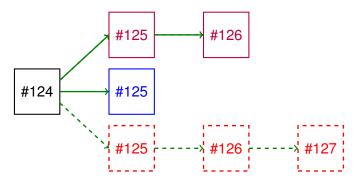




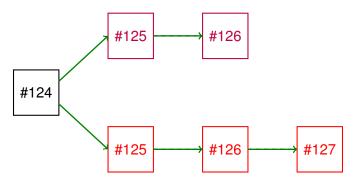






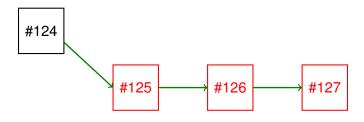








An honest miner  $Henry(r_h)$  and two selfish miners  $Alice(r_a)$  and  $Bob(r_h)$ 



Longest chain rule shall be applied.



# An Accurate Analytical Model

 S.W. Wang and S.S. Tzeng, "An Accurate Analytical Model for A Proof-of-Work Blockchain with Multiple Selfish Miners," in 2024 IEEE International Conference on Communications (ICC) Denver, Colorado, USA, June 9-13, 2024



#### **Motivations & Contributions**

- Previous works use simulations to study the interesting properties of earned rewards
  - Time consuming
  - Lack of theoretical contributions
- An analytical model to calculate the rewards earned by different miners is much more desirable



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#### **The Question**

Can we efficiently and accurately calculate the reward earned by each miner in a blockchain with two selfish miners?



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#### **The Question**

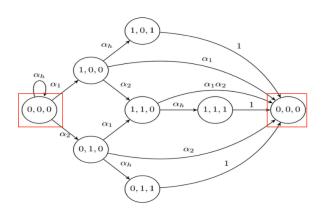
Can we efficiently and accurately calculate the reward earned by each miner in a blockchain with two selfish miners?

### The Answer & Our Contribution

Yes. A closed-form expression with high accuracy is derived.

### **Previous Work: Two Selfish Miners**

• Analytical Model Proposed by Q. Bai, and et al.

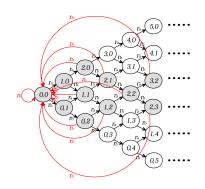


- Two states with the same definition.
- Not very accurate because some states are ignored



## **The Proposed Analytical Model**

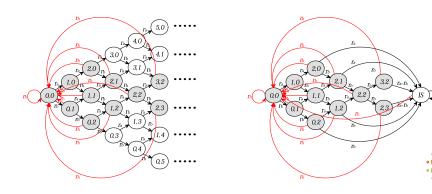
- State (n<sub>a</sub>, n<sub>b</sub>): Alice and Bob have their private branches with n<sub>a</sub>
  and n<sub>b</sub> blocks respectively
- End-of-Selfish (ES) states and In-Selfish (IS) states





## **The Proposed Analytical Model**

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  and n<sub>b</sub> blocks respectively
- End-of-Selfish (ES) states and In-Selfish (IS) states



## **Steady-State Probabilities**

• Steady state probability of an ES state  $(n_a, n_b)$ :

$$\pi_{n_a,n_b} = \begin{pmatrix} n_a + n_b \\ n_a \end{pmatrix} r_a^{n_a} \begin{pmatrix} n_b \\ n_b \end{pmatrix} r_b^{n_b} \pi_{0,0}$$

Steady state probability of an IS state:

$$\pi_{lS} = r_a(\pi_{2,0} + \pi_{2,1} + \pi_{3,2} + \pi_{2,3}) + r_b(\pi_{0,2} + \pi_{1,2} + \pi_{3,2} + \pi_{2,3})$$

• Sum of the probabilities equals to 1 where  $\pi_{0,0}$  can be easily obtained.

$$\pi_{IS} + \sum_{s \in ES} \pi_s = 1$$

Closed-form expressions are obtained



## Our Model: End-of-Selfish (ES) and In-Selfish (IS) States

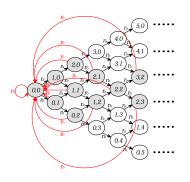
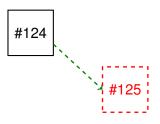
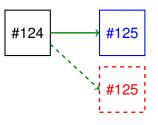


Figure 1: Exact Model

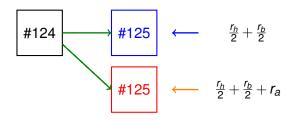
Figure 2: Approximate Model





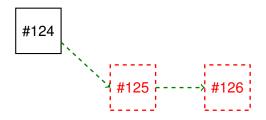




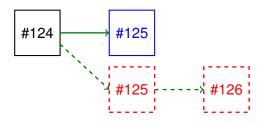


State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry R <sub>h</sub> (s)
(1,0)	$2r_a + r_b/2 + r_h/2$	r <sub>b</sub>	$3r_h/2+r_b/2$
(0,1)	r <sub>a</sub>	$r_a/2+2r_b+r_h/2$	$3r_h/2 + r_a/2$

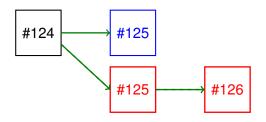




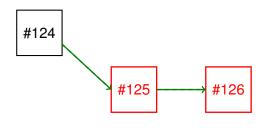








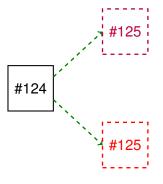




State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry $R_h(s)$
(2,0)	2	0	0
(0,2)	0	2	0

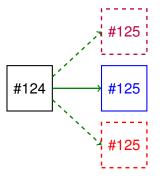


## **State** (1,1)



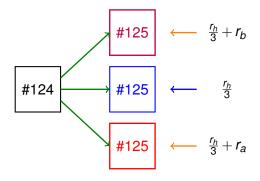


## **State** (1,1)



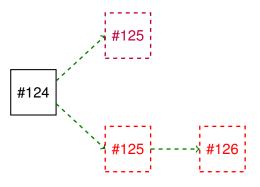


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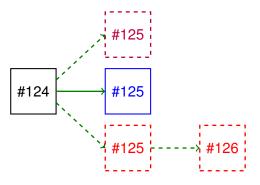


State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry $R_h(s)$
(1,1)	$2r_a + r_h/3$	$2r_b + r_h/3$	4 <i>r</i> <sub>h</sub> /3

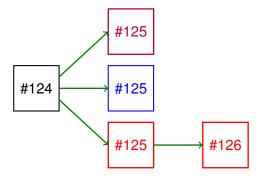




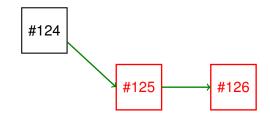








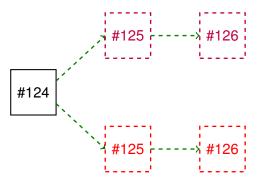




State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry R <sub>h</sub> (s)
(2,1)	2	0	0
(1,2)	0	2	0

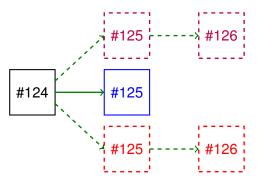


## **State** (2,2)



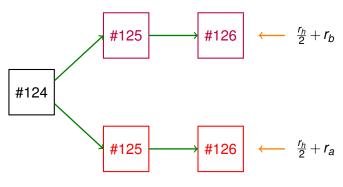


## **State** (2,2)





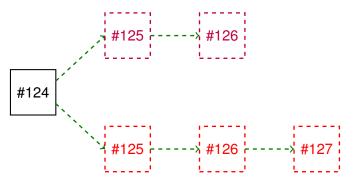
## **State** (2,2)



State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry $R_h(s)$
(2,2)	$3r_a+r_h$	$3r_b + r_h$	r <sub>h</sub>



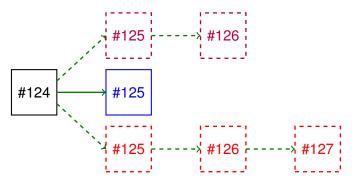
## **State** (2,3) and (3,2)





## **State** (2,3) and (3,2)

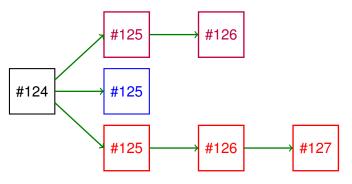
Honest miner  $Henry(r_h)$  and Selfish Miners  $Alice(r_a)$  and  $Bob(r_b)$ 





## **State** (2,3) and (3,2)

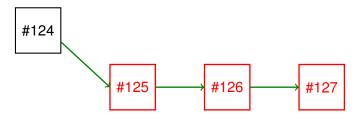
Honest miner  $Henry(r_h)$  and Selfish Miners  $Alice(r_a)$  and  $Bob(r_b)$ 





## **State** (2,3) and (3,2)

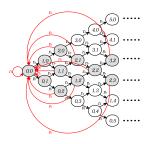
Honest miner  $Henry(r_h)$  and Selfish Miners  $Alice(r_a)$  and  $Bob(r_b)$ 



State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry $R_h(s)$	
(3,2)	3	0	0	
(2,3)	0	3	0	



### **IS State**



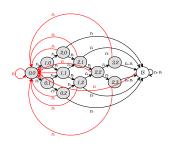


Figure 3: Exact Model

Figure 4: Approximate Model

State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry R <sub>h</sub> (s)	
IS	$3r_a^3/(r_a^3+r_b^3)$	$3r_b^3/(r_a^3+r_b^3)$	0	



## **Our Model: Expected Earned Rewards**

State s	Alice $R_a(s)$	Bob $R_b(s)$	Henry R <sub>h</sub> (s)
(0,0)	0	0	1
(1,0)	$2r_a + r_b/2 + r_h/2$	r <sub>b</sub>	$3r_h/2 + r_b/2$
(0,1)	ra	$r_a/2+2r_b+r_h/2$	$3r_h/2 + r_a/2$
(2,0)	2	0	0
(0,2)	0	2	0
(1,1)	$2r_a + r_h/3$	$2r_b + r_h/3$	4 <i>r</i> <sub>h</sub> /3
(2,1)	2	0	0
(1,2)	0	2	0
(2,2)	$3r_a + r_h$	$3r_b + r_h$	r <sub>h</sub>
(3,2)	3	0	0
(2,3)	0	3	0
IS	$3r_a^3/(r_a^3+r_b^3)$	$3r_b^3/(r_a^3+r_b^3)$	0



# **Our Model: Steady-State Probability**

• Let  $\pi_{n_a,n_b}$  be the steady-state probability of state  $(n_a,n_b)$ .

$$\pi_{n_a,n_b} = \binom{n_a + n_b}{n_b} r_a^{n_a} r_b^{n_b} \pi_{0,0}$$

•  $\pi_{IS}$  can be calculated as follows.

$$\pi_{lS} = r_a(\pi_{2,0} + \pi_{2,1} + \pi_{3,2} + \pi_{2,3}) + r_b(\pi_{0,2} + \pi_{1,2} + \pi_{3,2} + \pi_{2,3})$$

Sum of the steady-state probabilities equals to 1.

$$\pi_{IS} + \sum_{s \in ES} \pi_s = 1 \tag{1}$$

where  $\pi_{0,0}$  can be easily obtained.

• The steady-state probability and expected earned rewards can expressed in a closed-form of  $r_a$ ,  $r_b$ , and  $r_h$ .

#### **Numerical Results**

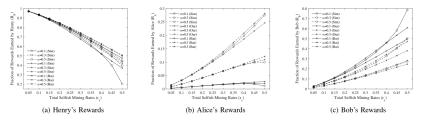


Fig. 3: Fractions of rewards earned by Henry, Alice, and Bob

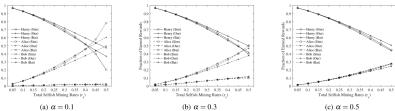


Fig. 4: Fractions of rewards earned with different values of  $\alpha$ 



## **Our Model: Extension to Multiple Selfish Miners**

- **Step. 1** Use *n*-tuple states to describe the blockchain with *n* selfish miners
- Step. 2 Identify the ES states and IS states
- Step. 3 For each ES states, calculate the expected rewards
- Step. 4 For IS states, merge them into one single state and approximate the expected rewards
- Step. 5 Calculate steady-state probability
- Step. 6 Calculate the fractions of earned rewards



#### **Conclusions**

- An accurate analytical model for Proof-of-Work blockchain with two selfish miners is proposed
- Except the situation when there is a selfish miner with dominant mining rate, the maximum percentage of differences is 4.98%
- Our proposed analytical model performs closer to the simulation results than previous approach



# Rational Mining Strategy

 S.W. Wang, "A Game Theory Based Rational Mining Strategy in Blockchains With Multiple Rational Miners," in 2024 International Conference on Computing Networking and Communications (ICNC) (ICNC 2024), Big Island, Hawaii, USA, 2024.



#### **Rational Miners**

- If a miner is rational, he may choose honest rather than selfish mining strategy in order to earn more rewards if his mining rate is not large enough
- In a blockchain with a single rational miner and all others are honest miners, it has been shown that the miner can be profitable if the fraction of his mining rate is larger than 25%
- Rational Mining in a blockchain with a single rational miner:
  - fraction of mining rate > 0.25: selfish mining
  - fraction of mining rate < 0.25: honest mining</p>



#### **Rational Miners**

- Blockchains with two (2) rational miners are investigated
- Analytical models are employed
- Two selfish miners Alice and Bob are independent without knowing each other
- Payoff matrices with mining rates between 0.1 and 0.5

Rewa	ards	Bob's Strategy		
(Alice,	Bob)	Honest	Selfish	
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$	
Strategy Selfish		$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$	



Rewa	ards	Bob's Strategy			
(Alice,	Bob)	Honest Selfish			
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$		
Strategy Selfish		$R_a^{SH}, R_b^{SH}$ $R_a^{SS}, R_b^{SS}$			

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

Rewa	ards	Bob's Strategy			
(Alice,	Bob)	Honest Selfish			
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$		
Strategy Selfish		$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$		

•  $R_a^{HH}$  and  $R_b^{HH}$ : Proportional to their mining rates

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

Rewa	ards	Bob's Strategy			
(Alice,	Bob)	Honest Selfish			
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$		
Strategy	Strategy Selfish		$R_a^{SS}, R_b^{SS}$		

- $R_a^{HH}$  and  $R_b^{HH}$ : Proportional to their mining rates
- $\bullet$   $R_a^{HS}, R_b^{HS},$   $R_a^{SH}, R_b^{SH};$  Only one single selfish miner

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

Rewa	ards	Bob's Strategy		
(Alice,	Bob)	Honest Selfish		
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$	
Strategy Selfish		$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$	

- $R_a^{HH}$  and  $R_b^{HH}$ : Proportional to their mining rates
- $R_a^{HS}$ ,  $R_b^{HS}$ ,  $R_a^{SH}$ ,  $R_b^{SH}$ : Only one single selfish miner
  - Selfish miner: Earns rewards by RW function

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

Rewa	ards	Bob's Strategy			
(Alice,	Bob)	Honest Selfish			
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$		
Strategy	Strategy Selfish		$R_a^{SS}, R_b^{SS}$		

- $R_a^{HH}$  and  $R_b^{HH}$ : Proportional to their mining rates
- $R_a^{HS}$ ,  $R_b^{HS}$ ,  $R_a^{SH}$ ,  $R_b^{SH}$ : Only one single selfish miner
  - Selfish miner: Earns rewards by RW function
  - Honest miner: Shares the remaining rewards with Henry

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

Rewa	ards	Bob's Strategy		
(Alice,	Bob)	Honest	Selfish	
Alice's	Honest	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$	
Strategy Selfish		$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$	

- $R_a^{HH}$  and  $R_b^{HH}$ : Proportional to their mining rates
- $R_a^{HS}$ ,  $R_b^{HS}$ ,  $R_a^{SH}$ ,  $R_b^{SH}$ : Only one single selfish miner
  - Selfish miner: Earns rewards by RW function
  - Honest miner: Shares the remaining rewards with Henry
- R<sub>a</sub><sup>SS</sup>, R<sub>b</sub><sup>SS</sup>: By an analytical model proposed by Bai, et. al.<sup>1</sup>

<sup>&</sup>lt;sup>1</sup>Q. Bai, X. Zhou, X. Wang, Y. Xu, X. Wang and Q. Kong, "A Deep Dive Into Blockchain Selfish Mining," in *ICC 2019 - 2019 IEEE International Conference on Communications (ICC)*, Shanghai, China, 2019, pp. 1-6.

## **Payoff Matrices**

Payoff Ma	atrices		Bob's Strategy								
rayon matrices		$r_b$	0.1		0.	0.2		0.3		0.4	
	$r_a$		Honest	Selfish	Honest	Selfish	Honest	Selfish	Honest	Selfish	
	0.1	Honest	0.100,0.100	0.103,0.072	0.100,0.200	0.102,0.182	0.100,0.300	0.096,0.327	0.100,0.400	0.079,0.526	
	0.1	Selfish	0.072,0.103	0.078,0.078	0.072,0.206	0.079,0.199	0.072,0.309	0.068,0.359	0.072,0.412	0.054,0.550	
į į	0.2	Honest	0.200,0.100	0.206,0.072	0.200,0.200	0.204,0.182	0.200,0.300	0.192,0.327	0.200,0.400	0.158,0.526	
Alice's	0.2	Selfish	0.182,0.102	0.199,0.076	0.182,0.204	0.199,0.199	0.182,0.307	0.177,0.369	0.182,0.409	0.136,0.574	
Strategy	0.3	Honest	0.300,0.100	0.309,0.072	0.300,0.200	0.307,0.182	0.300,0.300	0.289,0.327	0.300,0.400	0.237,0.526	
	0.5	Selfish	0.327,0.096	0.359,0.068	0.327,0.192	0.369,0.177	0.327,0.289	0.341,0.341	0.327,0.385	0.262,0.555	
	0.4	Honest	0.400,0.100	0.412,0.072	0.400,0.200	0.409,0.182	0.400,0.300	0.385,0.327	0.400,0.400	0.316,0.526	
	0.4	Selfish	0.526,0.079	0.550,0.054	0.526,0.158	0.574,0.136	0.526,0.237	0.555,0.262	0.526,0.316	0.455,0.455	

- All above payoff matrices have only one Nash equilibrium
- Find more details when mining rate is between 0.2 and 0.3



## **Payoff Matrices**

Payoff Ma	otrione					Bob's	Strategy			
rayon wi	atrices	$r_b$	0.20 0.21 0.22			22	0.23			
	$r_a$		Honest	Selfish	Honest	Selfish	Honest	Selfish	Honest	Selfish
	0.20	Honest	0.200,0.200	0.204,0.182	0.200,0.210	0.204,0.195	0.200,0.220	0.203,0.209	0.200,0.230	0.202,0.222
	0.20	Selfish	0.182,0.204	0.199,0.199	0.182,0.215	0.198,0.214	0.182,0.225	0.198,0.230	0.182,0.235	0.196,0.246
	0.21	Honest	0.210,0.200	0.215,0.182	0.210,0.210	0.214,0.195	0.210,0.220	0.213,0.209	0.210,0.230	0.212,0.222
	0.21	Selfish	0.195,0.204	0.214,0.198	0.195,0.214	0.213,0.213	0.195,0.224	0.212,0.229	0.195,0.234	0.211,0.245
	0.22	Honest	0.220,0.200	0.225,0.182	0.220,0.210	0.224,0.195	0.220,0.220	0.223,0.209	0.220,0.230	0.222,0.222
	0.22	Selfish	0.209,0.203	0.229,0.197	0.209,0.213	0.229,0.212	0.208,0.223	0.228,0.228	0.208,0.233	0.227,0.245
411 - 1	0.23	Honest	0.230,0.200	0.235,0.182	0.230,0.210	0.234,0.195	0.230,0.220	0.233,0.209	0.230,0.230	0.232,0.222
Alice's Strategy	0.23	Selfish	0.222,0.202	0.246,0.196	0.222,0.212	0.245,0.211	0.222,0.222	0.244,0.227	0.222,0.232	0.243,0.243
Strategy	0.24	Honest	0.240,0.200	0.245,0.182	0.240,0.210	0.244,0.195	0.240,0.220	0.244,0.209	0.240,0.230	0.243,0.222
	0.24	Selfish	0.236,0.201	0.263,0.195	0.236,0.211	0.262,0.210	0.236,0.221	0.262,0.225	0.236,0.231	0.261,0.242
	0.25	Honest	0.250,0.200	0.256,0.182	0.250,0.210	0.255,0.195	0.250,0.220	0.254,0.209	0.250,0.230	0.253,0.222
	0.23	Selfish	0.250,0.200	0.281,0.193	0.250,0.210	0.281,0.208	0.250,0.220	0.280,0.223	0.250,0.230	0.279,0.240
	0.26	Honest	0.260,0.200	0.266,0.182	0.260,0.210	0.265,0.195	0.260,0.220	0.264,0.209	0.260,0.230	0.263,0.222
	0.26	Selfish	0.265,0.299	0.300,0.191	0.265,0.209	0.300,0.205	0.265,0.219	0.299,0.221	0.265,0.229	0.299,0.237
	0.27	Honest	0.270,0.200	0.276,0.182	0.270,0.210	0.275,0.195	0.270,0.220	0.274,0.209	0.270,0.230	0.273,0.222
	0.27	Selfish	0.280,0.197	<b>0.319</b> ,0.189	0.280,0.207	0.320,0.203	0.280,0.217	0.320,0.218	0.280,0.227	0.320,0.234



## **Payoff Matrices**

Payoff Matrices			Bob's Strategy							
		$r_b$	0.24		0.25		0.26		0.27	
	$r_a$		Honest	Selfish	Honest	Selfish	Honest	Selfish	Honest	Selfish
	0.20	Honest	0.200,0.240	0.201,0.236	0.200,0.250	0.200,0.250	0.200,0.260	0.199,0.265	0.200,0.270	0.197,0.280
	0.20	Selfish	0.182,0.245	0.195,0.263	0.182,0.256	0.193,0.281	0.182,0.266	0.191,0.300	0.182,0.279	0.188,0.319
	0.21	Honest	0.210,0.240	0.211,0.236	0.210,0.250	0.210,0.250	0.210,0.260	0.209,0.265	0.210,0.270	0.207,0.280
	0.21	Selfish	0.195,0.244	0.210,0.263	0.195,0.255	0.208,0.281	0.195,0.265	0.206,0.300	0.195,0.275	0.203,0.320
	0.22	Honest	0.220,0.240	0.221,0.236	0.220,0.250	0.220,0.250	0.220,0.260	0.219,0.265	0.220,0.270	0.217,0.280
		Selfish	0.209,0.244	0.225,0.262	0.209,0.254	0.224,0.280	0.209,0.264	0.221,0.299	0.209,0.274	0.218,0.320
	0.23	Honest	0.230,0.240	0.231,0.236	0.230,0.250	0.230,0.250	0.230,0.260	0.229,0.265	0.230,0.270	0.227,0.280
Alice's Strategy		Selfish	0.222,0.243	0.242,0.261	0.222,0.253	0.240,0.279	0.222,0.263	0.238,0.299	0.222,0.273	0.234,0.320
	0.24	Honest	0.240,0.240	0.241,0.236	0.240,0.250	0.240,0.250	0.240,0.260	0.238,0.265	0.240,0.270	0.237,0.280
		Selfish	0.236,0.241	0.259,0.250	0.236,0.251	0.257,0.278	0.236,0.261	0.255,0.297	0.236,0.272	0.252,0.319
	0.25	Honest	0.250,0.240	0.251,0.236	0.250,0.250	0.250,0.250	0.250,0.260	0.248,0.265	0.250,0.270	0.247,0.280
	0.25	Selfish	0.250,0.240	0.278,0.257	0.250,0,250	0.276,0,276	0.250,0.260	0.274,0.295	0.250,0.270	0.270,0.318
	0.26	Honest	0.260,0.240	0.261,0.236	0.260,0.250	0.260,0.250	0.260,0.260	0.258,0.265	0.260,0.270	0.257,0.280
	0.20	Selfish	0.265,0.238	0.298,0.255	0.265,0.248	0.296,0.274	0.265,0.258	0.293,0.293	0.265,0.268	0.290,0.315
	0.27	Honest	0.270,0.240	0.272,0.236	0.270,0.250	0.270,0.250	0.270,0.260	0.268,0.265	0.270,0.270	0.266,0.280
	0.27	Selfish	0.280,0.237	0.319,0.252	0.280,0.247	0.317,0.270	0.280,0.257	0.315,0.290	0.280,0.266	0.312,0.312



# Payoff Matrices: Two miners both have dominant strategies

Rew	ards	Bob $r_b = 0.1$		
(Alice,	Bob)	Honest	Selfish	
Alice	Honest	0.200,0.100	<b>0.206</b> ,0.072	
$r_a = 0.2$	Selfish	0.182, <b>0.102</b>	0.199,0.076	

Rew	ards	Bob $r_b = 0.4$		
(Alice,	Bob)	Honest	Selfish	
Alice	Honest	0.300,0.400	0.237, <b>0.526</b>	
$r_a = 0.3$	Selfish	<b>0.327</b> ,0.385	0.262,0.555	

- Mining rate > 0.25: Selfish mining strategy
- Mining rate < 0.22: Honest mining strategy</li>



# Payoff Matrices: Only one miner has dominant strategy

Rewa	ards	Bob $r_b = 0.21$		
(Alice,	Bob)	Honest	Selfish	
Alice	Honest	0.240,0.210	0.244,0.195	
$r_a = 0.24$	Selfish	0.236, <b>0.211</b>	<b>0.262</b> ,0.210	

Rewa	ards	Bob $r_b = 0.27$		
(Alice,	Bob)	Honest	Selfish	
Alice	Honest	<b>0.230</b> ,0.270	0.227, <b>0.280</b>	
$r_a = 0.23$	Selfish	0.222,0.273	0.234,0.320	

 Mining rate between [0.22, 0.25]: Follow the other rational miner's strategy if he has dominant strategy

# Payoff Matrices: No miner has dominant strategy

Rewa	ırds	Bob $r_b = 0.24$		
(Alice,	Bob)	Honest	Selfish	
Alice	Honest	0.230,0.240	0.231,0.236	
$r_a = 0.23$	Selfish	0.222,0.243	0.242,0.261	

- Two Nash Equilibria exist
- Mixed strategy can be applied
- Select a strategy according to a probability distribution



# **Mixed Strategy**

R	ewards	Bob's Strategy		
(Ali	ice, Bob)	Honest(q)	Selfish $(1-q)$	
Alice's	Honest (p)	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$	
Strategy	Selfish (1 – p)	$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$	

Main idea: to make the other miner earn *indifferent* rewards no matter which strategy the other miner uses.

- Using honest mining, Bob earns  $p \times R_b^{HH} + (1-p) \times R_b^{SH}$ .
- Using selfish mining, Bob earns  $p \times R_b^{HS} + (1-p) \times R_b^{SS}$ .
- Solve equation  $p \times R_b^{HH} + (1-p) \times R_b^{SH} = p \times R_b^{HS} + (1-p) \times R_b^{SS}$



# **Mixed Strategy**

R	ewards	Bob's Strategy		
(Ali	ice, Bob)	Honest(q)	Selfish $(1-q)$	
Alice's	Honest (p)	$R_a^{HH}, R_b^{HH}$	$R_a^{HS}, R_b^{HS}$	
Strategy	Selfish $(1-p)$	$R_a^{SH}, R_b^{SH}$	$R_a^{SS}, R_b^{SS}$	

Main idea: to make the other miner earn *indifferent* rewards no matter which strategy the other miner uses.

• 
$$p = \frac{R_b^{SS} - R_b^{SH}}{R_b^{HH} + R_b^{SS} - R_b^{SH} - R_b^{HS}}$$

$$q = \frac{R_a^{SS} - R_a^{SH}}{R_a^{HH} + R_a^{SS} - R_a^{SH} - R_a^{HS}}$$



## **Rational Mining Strategy with Two Rational Miners**

- If mining rate is < 0.22, use Honest Mining</li>
- If mining rate is > 0.25, use Selfish Mining
- If mining rate ranges from 0.22 to 0.25,
  - If the other miner has dominant strategy, follow his dominant mining strategy
  - If the other miner has no dominant strategy, solve the payoff matrices according to the probability distribution



### **Numerical Results**

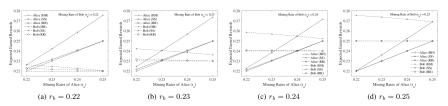


Fig. 1: Expected rewards earned by Alice and Bob under both honest, selfish, or rational mining strategies

- Both honest (HH) ≤ both rational (RR) ≤ both selfish (SS)
- Mixed strategy performs close to honest strategy



# **Ongoing Research Works**

- A Stochastic Lightweight Blockchain
- Security Analysis of Sharded Blockchain



# **Ongoing Research Works**

- A Stochastic Lightweight Blockchain
- Security Analysis of Sharded Blockchain



#### **Motivations**

- High computational power consumption is a crucial problem in a Proof-of-Work blockchain
- Reducing the number of miners raises security problem
- We propose a stochastic lightweight blockchain called SLChain which is able:
  - to reduce power consumption
  - to maintain fairness among all miners
  - to maintain robustness of majority attack
  - to maintain block time consistency
  - to mitigate the selfish mining attacks

simultaneously.



## **SLChain: A Stochastic Lightweight Blockchain**

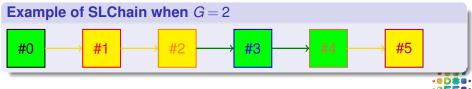
- Lightweight: Only a subset of miners is entitled to mine the next block
- Stochastic: The subset of entitled miners is randomly selected according to the hash value of previous block



# SLChain: A Stochastic Lightweight Blockchain

- Each miner is randomly assigned a unique miner id  $m_{id}$  which is an integer.
- 2 The hash value of previous block is an integer h.
- **3** A miner is entitled to mine the next block if the miner id  $m_{id}$  and the hash value of previous block h are congruent modulo G. That is,

$$m_{id} \equiv h \; ( \; \mathbf{mod} \; G).$$
 (2)



## **Properties**

- N: the total number of miners
- G: the number of groups
- Computational power:  $\frac{1}{G}$  of Nakamoto blockchain
- Fairness: The probability a miner mines the next block
  - Nakamoto blockchain:  $\frac{1}{N}$
  - ▶ SLChain:  $\frac{1}{G} \times \frac{1}{\frac{N}{G}} = \frac{1}{N}$
- Robustness to majority attack: The mined block shall be validated by ALL miners
- Block time consistency: the number of leading zeros shall be adjusted to  $\lfloor z \log_2 G \rfloor$  or  $\lceil z \log_2 G \rceil$  where z is the number of leading zeros in Nakamoto blockchain

# **Selfish Mining in Nakamoto Blockchain**



We have the following rewards in the competitive situation:

• 
$$0 < \alpha < \frac{1}{2}$$

• 
$$R_h(\alpha) = 2 \times \frac{1-\alpha}{2} + 1 \times \frac{1-\alpha}{2} = \frac{3(1-\alpha)}{2}$$

• 
$$R_s(\alpha) = 2 \times \alpha + 1 \times \frac{1-\alpha}{2} = \frac{1+3\alpha}{2}$$

$$P_h(\alpha) + R_s(\alpha) = 2$$



# Selfish Mining in SLChain



#124 #125 
$$\frac{1-\alpha}{G} + \frac{\alpha}{G}$$
#125 
$$\frac{1-\alpha}{G} + \frac{\alpha}{G}$$

• 
$$R_h^s(\alpha, G) = \frac{3(1-\alpha)}{2}$$

• 
$$R_s^s(\alpha, G) = \frac{1+3\alpha}{2}$$

• Probability: 
$$\frac{1}{G}$$

• 
$$R_h^d(\alpha,G) = \frac{3-2\alpha}{2}$$

• 
$$R_s^d(\alpha, G) = \frac{1+2\alpha}{2}$$

• Probability: 
$$\frac{G-1}{G}$$

## **Expected Earned Rewards**

• 
$$R_h(\alpha, G) = \frac{1}{G} \times R_h^s + \frac{G-1}{G} \times R_h^d = \frac{3G - \alpha - 2\alpha G}{2G}$$

• 
$$R_s(\alpha, G) = \frac{1}{G} \times R_s^s + \frac{G-1}{G} \times R_s^d = \frac{G+\alpha+2\alpha G}{2G}$$

# **Mitigation of Selfish Mining Attacks**

#### **Theorem**

The rewards earned by selfish miner in the proposed SLChain with  $G \ge 2$  is less than that in Nakamoto blockchain. That is,

$$R_s(\alpha,G) < R_s(\alpha,1)$$
 where  $G \ge 2$  and  $0 < \alpha < 1$ .

#### Proof.

$$R_{s}(\alpha,G) - R_{s}(\alpha,1) = \frac{2\alpha G + G + \alpha}{2G} - \frac{1+3\alpha}{2}$$

$$= \frac{2\alpha G + G + \alpha - 3\alpha G - G}{2G}$$

$$= \frac{\alpha(1-G)}{2G} < 0$$

The last inequality holds since G > 2 and  $\alpha > 0$ .



# **Earned Rewards in SLChain**

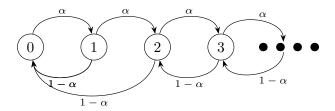


Figure 5: Markov chain of a blockchain with one selfish miner

$$\begin{cases} \pi_0 = \frac{1-2\alpha}{1-\alpha-\alpha^2} \\ \pi_1 = \frac{1-2\alpha}{1-\alpha-\alpha^2} \times \alpha \\ \pi_2 = \frac{1-2\alpha}{1-\alpha-\alpha^2} \times \frac{\alpha^2}{1-\alpha} \\ \pi_i = \frac{1-2\alpha}{1-\alpha-\alpha^2} \times \frac{\alpha^i}{(1-\alpha)^{i-1}} \quad \text{for all } i \geq 3 \end{cases}$$



# Rewards earned by the miners

**Table 1:** Expected rewards when the honest miner mined the block in each state of the SLChain

State i	Honest Miner	Selfish Miner	Total Rewards
i = 0	1	0	1
<i>i</i> = 1	$(3G-\alpha-2\alpha G)/2G$	$(G+\alpha+2\alpha G)/2G$	2
i = 2	0	2	2
<i>i</i> ≥ 3	0	1	1



# **Expected rewards**

- Honest miner:  $RW_h(\alpha, G) = 1 \times \pi_0 + R_h(\alpha, G) \times \pi_1$
- Selfish Miner:  $RW_s(\alpha, G) = R_s(\alpha, G) \times \pi_1 + 2 \times \pi_2 + 1 \times \sum_{i=3}^{\infty} \pi_i$ ;

# Fraction of rewards earned by selfish miner

$$F_{s}(\alpha,G) = \frac{RW_{s}(\alpha,G)}{RW_{h}(\alpha,G) + RW_{s}(\alpha,G)}$$

$$= \frac{R_{s}(\alpha,G)\pi_{1} + 2 \times \pi_{2} + 1 \times \sum_{i=3}^{\infty} \pi_{i}}{1 + \pi_{1} + \pi_{2}}$$

$$= \frac{(4G + 2)\alpha^{4} - (10G + 3)\alpha^{3} + (3G + 1)\alpha^{2} + G\alpha}{2G(\alpha^{3} - 2\alpha^{2} - \alpha + 1)}$$



# **Profitable Threshold**

#### **Theorem**

The value of profitable threshold  $\bar{\alpha}(G)$  is  $\frac{(4G+1)-\sqrt{8G^2+1}}{4(G+1)}$  in the proposed SLChain with the number of groups of miners G and  $0 < \alpha < 0.5$ .

# Proof.

We try to solve the inequality:

$$\frac{(4G+2)\alpha^4 - (10G+3)\alpha^3 + (3G+1)\alpha^2 + G\alpha}{2G(\alpha^3 - 2\alpha^2 - \alpha + 1)} \ge \alpha. \tag{3}$$

We have

$$\frac{\alpha(\alpha-1)[(2G+2)\alpha^2 - (4G+1)\alpha + G]}{2G(\alpha^3 - 2\alpha^2 - \alpha + 1)} \ge 0.$$
 (4)



#### **Profitable Threshold**

#### Proof.

Since  $0 < \alpha < 0.5$ , we have  $\alpha(\alpha - 1) < 0$  and  $\alpha^3 - 2\alpha^2 - \alpha + 1 > 0$ .

Then, we solve the inequality:

$$(2G+2)\alpha^2 - (4G+1)\alpha + G \le 0. (5)$$

We have

$$\frac{(4G+1)-\sqrt{8G^2+1}}{4(G+1)} \le \alpha < \frac{1}{2}.$$
 (6)

The profitable threshold is  $\frac{(4G+1)-\sqrt{8G^2+1}}{4(G+1)}$ .

Note: When G = 1, the profitable threshold is  $\frac{4+1-\sqrt{8+1}}{4\times2} = \frac{2}{8} = 25\%$ .



# **Upper Bounds of Profitable Threshold**

#### **Theorem**

The upper bound of profitable threshold in the proposed SLChain is 29.29%.

# Proof.

The profitable threshold  $\bar{\alpha}(G)$  has been proved in previous theorem.

When the number of *G* approaches to infinity, we have

$$\lim_{G \to \infty} \frac{(4G+1) - \sqrt{8G^2 + 1}}{4(G+1)} = \frac{4G - \sqrt{8G^2}}{4G} = \frac{4 - 2\sqrt{2}}{4} = 29.29\%$$
 (7)



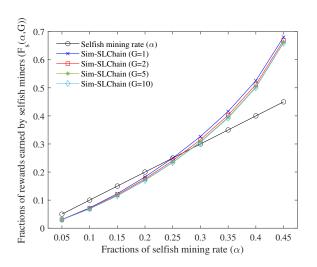


Figure 6: Fractions of rewards earned by selfish miner in SLChain



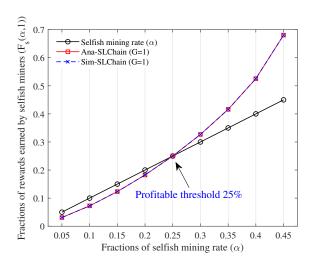


Figure 7: SLChain (G=1)



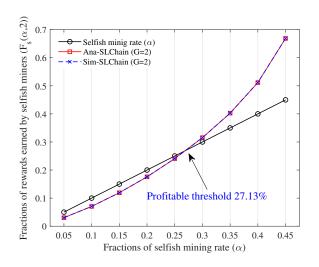


Figure 8: SLChain (G=2)



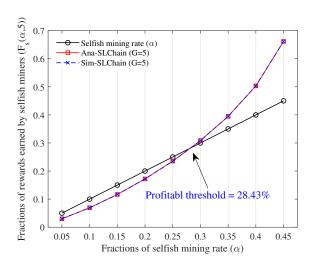


Figure 9: SLChain (G=5)



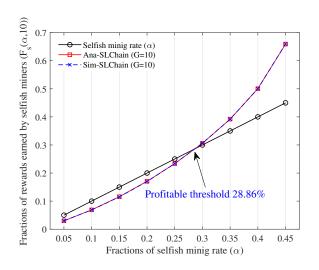


Figure 10: SLChain (G=10)



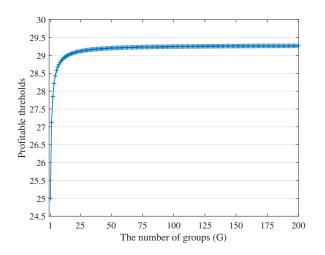


Figure 11: Profitable thresholds of SLChain



#### **Conclusions**

- A stochastic lightweight blockchain (SLChain) is proposed:
  - to reduce power consumption
  - to maintain fairness among miners
  - to maintain robustness of majority attack
  - to maintain block time consistency
  - to mitigate selfish mining attack

# simultaneously.

- An accurate analytical model is proposed to calculate the fraction of rewards earned by selfish miner
- Upper bounds of the profitable threshold is derived (29.29%)



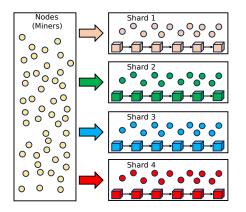
# **Ongoing Research Works**

- A Stochastic Lightweight Blockchain
- Security Analysis of Sharded Blockchain



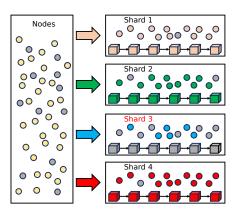
#### **Motivations**

- Scalability of Bitcoin blockchain: 7 transactions per second
- Sharding: dividing the nodes and transactions into different groups(shards)



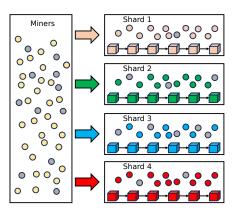


# **Majority Attacks**

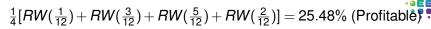


- Single Shard Takeover (SST): Blockchain fails if one shard is attacked
- Probability of SST (P<sub>SST</sub>) is calculated

# **Selfish Mining Attacks**



- Nakamoto blockchain:  $RW(\frac{11}{48}) = 22.08\% < \frac{11}{48} = 22.92\%$  (Not profitable)
- Sharded blockchain:



#### Questions

#### **The Question**

In a shard, the number of nodes/miners is much smaller than Nakamoto blockchain. Therefore, sharding mechanism reduces the security level of a blockchain, is it?

#### Our method

- We propose some analytical models to calculate:
  - Probability of SST ( $P_{SST}$ ) for majority attack
  - Rewards earned by selfish miners (ER) for selfish mining attack
  - Profitable threshold (PT) for selfish mining attack
- We conduct simulations to verify the proposed analytical model
- We study the relationships between the three metrics and the number of shards

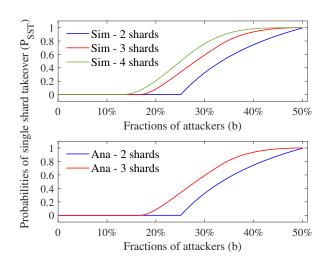


Figure 12: Majority attack in sharded blockchain



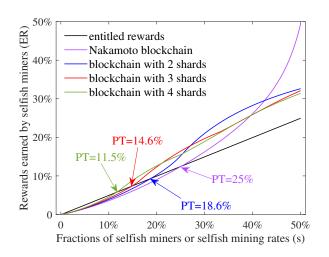


Figure 13: Selfish mining attack in sharded blockchain



#### **Conclusions**

#### **The Question**

Sharding mechanism reduces the security level of a blockchain, is it?

#### **Answer**

Not necessarily.

- Majority attack:
  - Probability of SST ( $P_{SST}$ ): YES.  $P_{SST}$  increases with the number of shards.
- Selfish mining attack:
  - Rewards earned by selfish miners (ER): Not neccessarily.
  - Profitable threshold (PT): YES. PT decreases with the number of shards.



# Thank you!

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