

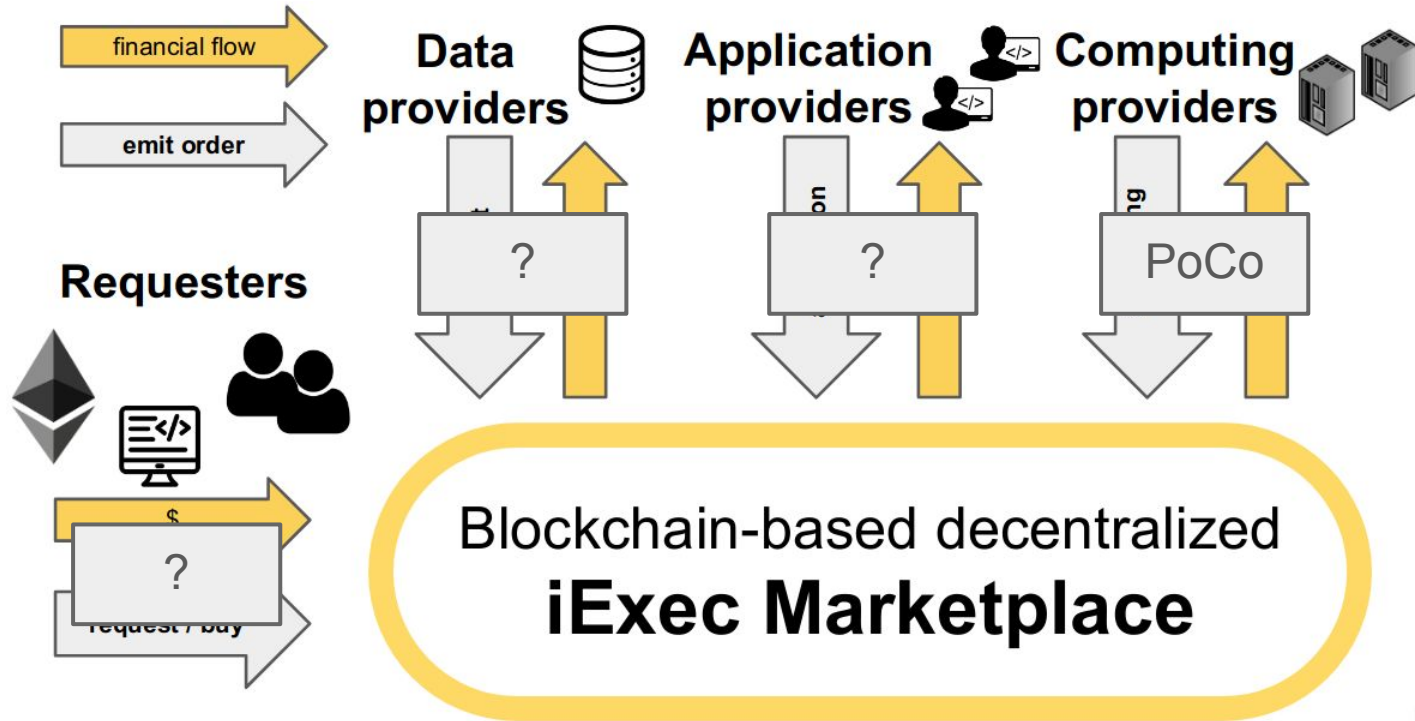
# Incentivization of correct behavior in a decentralized computing marketplace

25/07/2024



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# Identified problem



⇒ Currently no incentive mechanisms for Requesters, Data providers and Application providers.



# Can we access worker logs ?

1. I explored [thegraph from bellecour](#).
2. I found information about tasks (We can see the difference between transactions reaching or not a consensus).
3. I did not find a way to check worker logs and errors during computation.
4. I could however retrieve task status, requester, dApp provider, dataset provider and workerpool owner. Should we try looking for pattern on failed tasks ?

# Game Theory based model [4]

Requester: S

		Computing provider	
		S	F
Asset	S	$(U_r - (\text{Price}_a + \text{Price}_c), \text{Price}_a, \text{Price}_c - \text{Cost}_c)$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Requester: F

		Computing provider	
		S	F
Asset	S	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Players:

- Requester
- Asset provider
- Computing provider

Strategies:

- S: Do the work correctly
- F: Do the work incorrectly

Payoffs:

- (Requester, Asset, Computing)

$U_r$ : Utility from the result  
 $\text{Slash}_c$ : Computing provider slash  
 $\text{Price}_a$ : Asset price  
 $\text{Price}_c$ : Computing price  
 $\text{Cost}_c$ : Computing cost

# Game Theory based model: example 1

		Computing provider	
		S	F
Requester: S	Asset	$(\underline{U_r - (Price_a + Price_c)}, \underline{Price_a}, \underline{Price_c - Cost_c})$	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$
	F	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$

Strategies:

- Requester plays S
- Asset provider plays S
- Computing provider plays S

Result:

- Task completed successfully

		Computing provider	
		S	F
Requester: F	Asset	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$
	F	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$	$(\underline{0}, \underline{0}, \underline{-(Cost_c + Slash_c)})$

$U_r$ : Utility from the result  
 $Slash_c$ : Computing provider slash  
 $Price_a$ : Asset price  
 $Price_c$ : Computing price  
 $Cost_c$ : Computing cost

# Game Theory based model: example 2

		Computing provider	
		S	F
Requester: S	Asset	S	F
	Asset	$(U_r - (\text{Price}_a + \text{Price}_c), \text{Price}_a, \text{Price}_c - \text{Cost}_c)$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Strategies:

- Requester plays S
- Asset provider plays F
- Computing provider plays S

Result:

- Task failed

		Computing provider	
		S	F
Requester: F	Asset	S	F
	Asset	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

$U_r$ : Utility from the result  
 $\text{Slash}_c$ : Computing provider slash  
 $\text{Price}_a$ : Asset price  
 $\text{Price}_c$ : Computing price  
 $\text{Cost}_c$ : Computing cost

# Game Theory based model: example 3

Requester: S

		Computing provider	
		S	F
Asset	S	$(U_r - (\text{Price}_a + \text{Price}_c), \text{Price}_a, \text{Price}_c - \text{Cost}_c)$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Strategies:

- Requester plays F
- Asset provider plays S
- Computing provider plays F

Result:

- Task failed

Requester: F

		Computing provider	
		S	F
Asset	S	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

$U_r$ : Utility from the result  
 $\text{Slash}_c$ : Computing provider slash  
 $\text{Price}_a$ : Asset price  
 $\text{Price}_c$ : Computing price  
 $\text{Cost}_c$ : Computing cost

# Game Theory based model

Requester: S

		Computing provider	
		S	F
Asset	S	$(U_r - (\text{Price}_a + \text{Price}_c), \text{Price}_a, \text{Price}_c - \text{Cost}_c)$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Requester: F

		Computing provider	
		S	F
Asset	S	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$	$(0, 0, -(\text{Cost}_c + \text{Slash}_c))$

Strategies:

- S: Do the work correctly
- F: Do the work incorrectly

Results:

- **Red Nash Equilibrium** leads to failure but are unstable.
- **Green Nash Equilibrium** lead to success and is stable.

$U_r$ : Utility from the result  
 $\text{Slash}_c$ : Computing provider slash  
 $\text{Price}_a$ : Asset price  
 $\text{Price}_c$ : Computing price  
 $\text{Cost}_c$ : Computing cost



# Game Theory based model, with dynamic cost

Requester: S

		Computing provider	
		S	F
Asset	S	$(\underline{U_r} - (\underline{\text{Price}}_a + \underline{\text{Price}}_c), \underline{\text{Price}}_a - \underline{\text{Cost}}_c, \underline{\text{Price}}_c - \underline{\text{Cost}}_e)$	$(\underline{0}, -\underline{\text{Cost}}_a, -\underline{\text{Slash}}_c)$
	F	$(\underline{0}, 0, -(\underline{\text{Cost}}_c + \underline{\text{Slash}}_c))$	$(\underline{0}, \underline{0}, -\underline{\text{Slash}}_e)$

Requester: F

		Computing provider	
		S	F
Asset	S	$(0, -\underline{\text{Cost}}_a, -(\underline{\text{Cost}}_c + \underline{\text{Slash}}_c))$	$(\underline{0}, -\underline{\text{Cost}}_a, -\underline{\text{Slash}}_e)$
	F	$(\underline{0}, \underline{0}, -(\underline{\text{Cost}}_c + \underline{\text{Slash}}_c))$	$(\underline{0}, \underline{0}, -\underline{\text{Slash}}_c)$

Strategies:

- S: Do the work correctly
- F: Do the work incorrectly

Results:

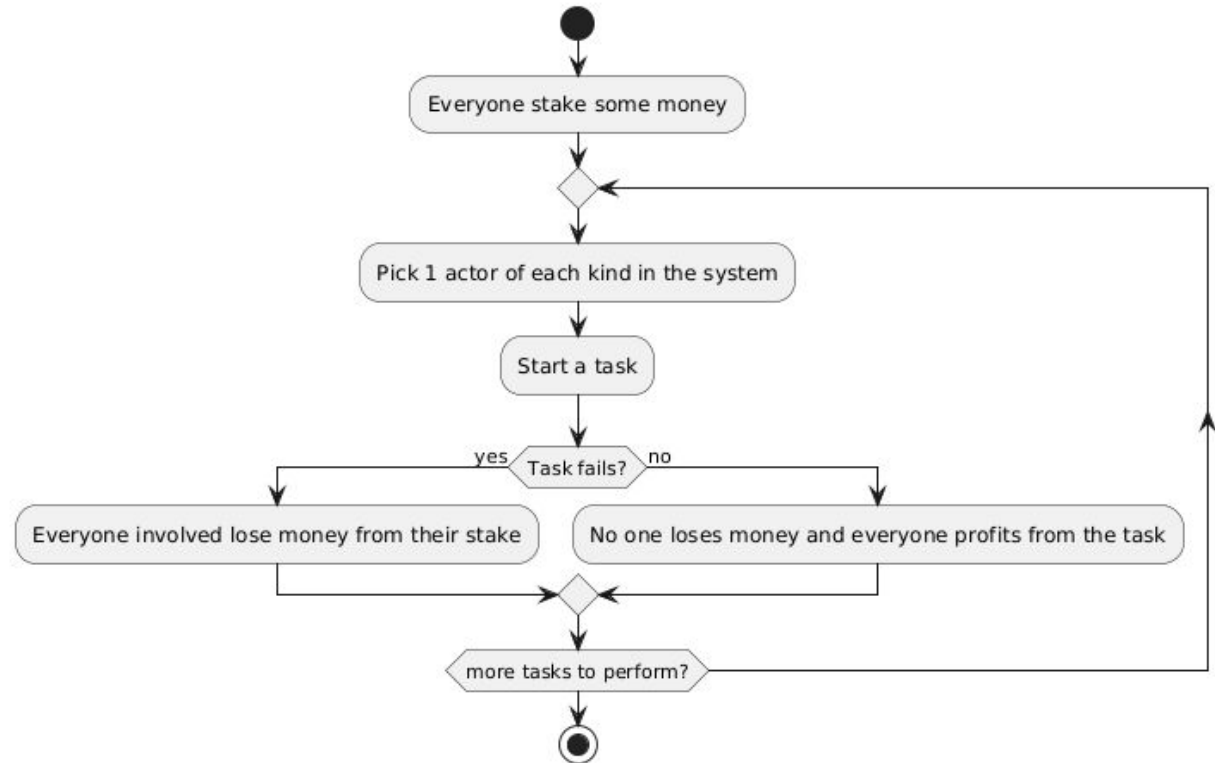
- **Red Nash Equilibrium** leads to failure but are unstable.
- **Green Nash Equilibrium** lead to success and is stable.

$U_r$ : Utility from the result  
 $\text{Slash}_c$ : Computing provider slash  
 $\text{Price}_a$ : Asset price  
 $\text{Price}_c$ : Computing price  
 $\text{Cost}_c$ : Computing cost

# Blind slashing system

Malicious actors will be involved in failed tasks more often and will lose more money.

⇒ Everyone will have an incentive to improve their behaviour. [6, 7]



# Game Theory based model with blind slashing

Requester: S

		Computing provider	
		S	F
Asset	S	$(U_r - (\text{Price}_a + \text{Price}_c), \text{Price}_a, \text{Price}_c - \text{Cost}_c)$	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$

Requester: F

		Computing provider	
		S	F
Asset	S	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$
	F	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$	$(-\text{Slash}_r, -\text{Slash}_a, -(\text{Cost}_c + \text{Slash}_c))$

Results:

- Same result as before
- Incentive to switch more quickly to the stable Nash Equilibrium
- Possibility for repeatedly failing actors to get ruined

$U_r$ : Utility from the result

$\text{Price}_a$ : Asset price

$\text{Price}_c$ : Computing price

$\text{Cost}_c$ : Computing cost

$\text{Slash}_r$ : Requester slash

$\text{Slash}_a$ : Asset provider slash

$\text{Slash}_c$ : Computing provider slash



# Not possible to get rid of all Nash Equilibriums

1. If more than one player is failing the task, other players are blocked in a suboptimal outcome. Then changing their strategy will not change the game outcome  $\Rightarrow$  non desirable Nash Equilibria.
  - a. Build trust between players so that they believe the other will switch strategies as agreed  $\Rightarrow$  reputation system encourages belief in other players right choice and coordination.
  - b. A punishment (slashing) mechanism align individual incentives with collective outcomes  $\Rightarrow$  encourage the players to coordinate on a better strategy.

# Blind slashing system and ruin theory [8]

The overall task failure rate in the system can be written as:

$$F = 1 - (1 - F_u) \cdot (1 - \text{mean}(F_u))^3$$

For a given participant, the expected loss per task is:

$$L = F \times P$$

So the time (number of task) to ruin that participant is:

$$T = \frac{S_0}{L} = \frac{S_0}{F \times P}$$

T: Time to ruin

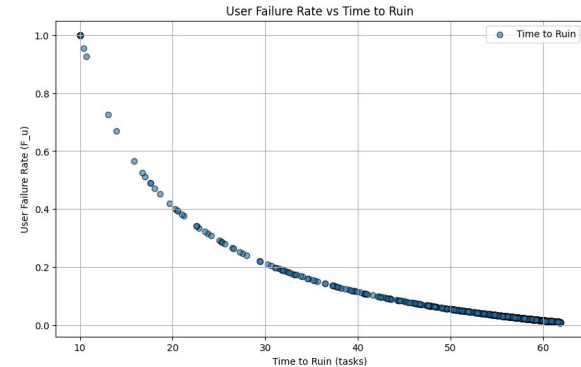
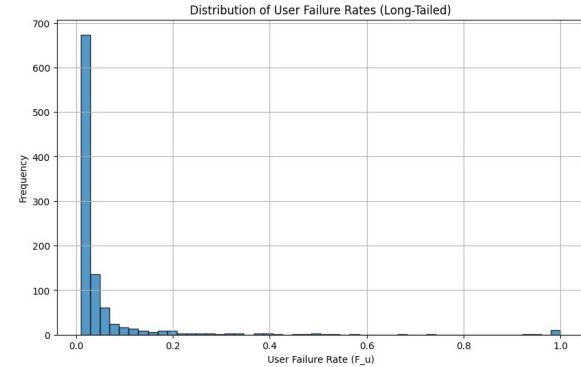
F: Task failure rate

$S_0$ : Initial stack

$F_u$ : User failure rate

L: Loss per task

P: Penalty for failure





# Blind slashing system: shortcoming

If we want users to be profitable, 2 options:

- F is null  $\Rightarrow$  **no room for error.**
- P is null  $\Rightarrow$  **no slashing mechanism.**

$$L \leq 0 \Leftrightarrow F \times P \leq 0 \Leftrightarrow \begin{cases} F \leq 0 \\ P \leq 0 \end{cases}$$

F: Task failure rate  
P: Penalty for failure  
L: Loss per task

# Blind slashing/recovery system and ruin theory

The expected loss per task without recovery:

$$L = F \times P$$

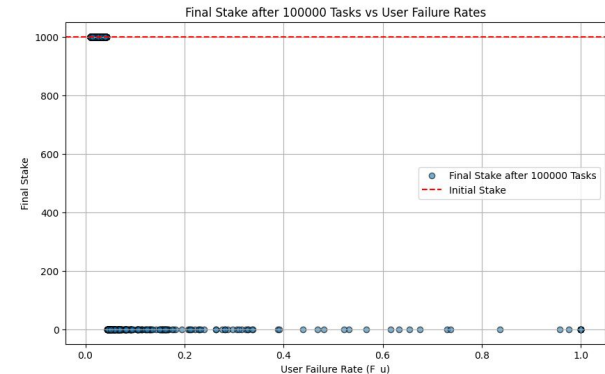
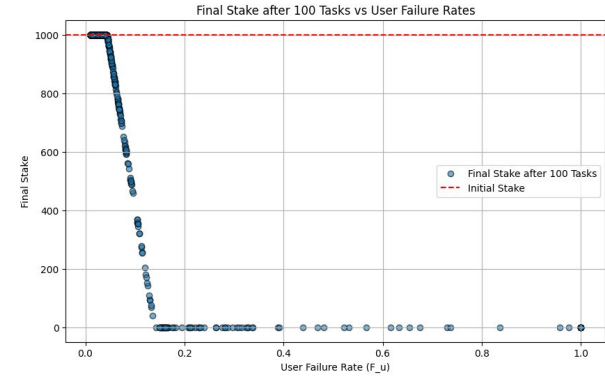
The expected recovery per task:

$$R = (1 - F) \times R$$

The net expected loss in stake per task:

$$L_{\text{net}} = L - R = F \times P - (1 - F) \times R$$

$L_{\text{net}}$ : Net loss per task	F: Task failure rate
R: Recovery for success	P: Penalty for failure





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