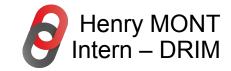
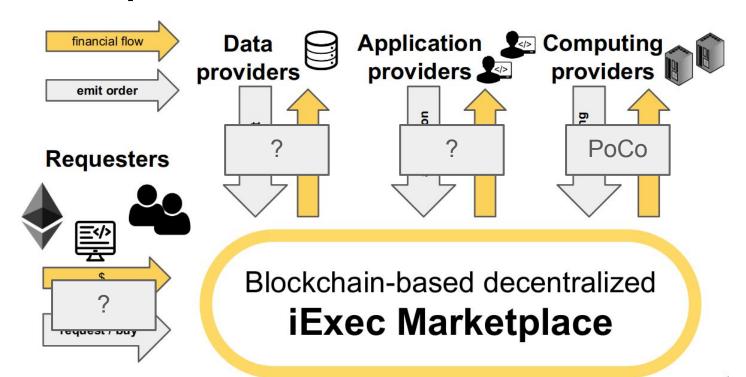
Incentivization of correct behavior in a decentralized computing marketplace



### **Identified problem**



## Game Theory based model [4]

		Computing provider	
		S	F
et	S	( <u>U<sub>c</sub>-(Price<sub>a</sub>+Price<sub>c</sub>)</u> , <u>Price<sub>a</sub></u> , <u>Price<sub>c</sub>-Cost<sub>c</sub></u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , 0, <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

		Computing provider	
		S	F
set	S	(0 , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost_+Slash_))
Asset	F	( <u>0</u> , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

### Players:

- Requester
- Asset provider
- Computing provider

### Strategies:

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

### Payoffs:

• (Requester, Asset, Computing)

U<sub>r</sub>: Utility from the result
Slash<sub>c</sub>: Computing provider slash
Price<sub>a</sub>: Asset price
Price<sub>c</sub>: Computing price
Cost<sub>c</sub>: Computing cost

# Game Theory based model: example 1

		Computing provider	
		S	F
set	S	( <u>U<sub>c</sub>-(Price<sub>a</sub>+Price<sub>c</sub>)</u> , <u>Price<sub>a</sub></u> , <u>Price<sub>c</sub>-Cost<sub>c</sub></u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , 0, <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

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

#### Result:

Task completed successfully

		Computing provider	
		s	F
set	S	(0 , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

U<sub>r</sub>: Utility from the result
Slash<sub>c</sub>: Computing provider slash
Price<sub>a</sub>: Asset price
Price<sub>c</sub>: Computing price
Cost<sub>c</sub>: Computing cost

# Game Theory based model: example 2

		_		
		Computing provider		
		S	F	
set	S	( <u>U<sub>r</sub>-(Price<sub>a</sub>+Price<sub>c</sub>)</u> , <u>Price<sub>a</sub></u> , <u>Price<sub>c</sub>-Cost<sub>c</sub></u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))	
Asset	F	( <u>0</u> , 0, <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost_+Slash_))	

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

### Result:

Task failed

		Computing provider	
		S	F
set	S	(0 , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost_+Slash_))
Asset	F	( <u>0</u> , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

U<sub>r</sub>: Utility from the result
Slash<sub>c</sub>: Computing provider slash
Price<sub>a</sub>: Asset price
Price<sub>c</sub>: Computing price
Cost<sub>c</sub>: Computing cost

		Computing provider	
		S	F
et	S	( <u>U<sub>r</sub>-(Price<sub>a</sub>+Price<sub>c</sub>)</u> , <u>Price<sub>a</sub></u> , <u>Price<sub>c</sub>-Cost<sub>c</sub></u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , 0, <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost_+Slash_))

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

#### Result:

Task failed

		Computing provider	
		S	F
set	S	(0 , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))

U<sub>r</sub>: Utility from the result
Slash<sub>c</sub>: Computing provider slash
Price<sub>a</sub>: Asset price
Price<sub>c</sub>: Computing price
Cost<sub>c</sub>: Computing cost

## Game Theory based model

		Computing provider	
		S	F
set	S	( <u>U<sub>c</sub>-(Price<sub>a</sub>+Price<sub>c</sub>)</u> , <u>Price<sub>a</sub></u> , <u>Price<sub>c</sub>-Cost<sub>c</sub></u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
Asset	F	( <u>0</u> , 0, <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0, 0,</u> -(Cost_+Slash_)

		Computing provider	
		S	F
Asset	S	(0 , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
	F	( <u>0</u> , <u>0</u> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>0</u> , <u>0</u> , -(Cost <sub>e</sub> +Slash <sub>e</sub> ))

### 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<sub>r</sub>: Utility from the result
Slash<sub>c</sub>: Computing provider slash
Price<sub>a</sub>: Asset price
Price<sub>c</sub>: Computing price
Cost<sub>c</sub>: Computing cost

# Game Theory based model, with dynamic cost

		Computing provider	
		S	F
Asset	S	( <u>U(Price_+Price_)</u> , <u>PriceCost_a</u> , <u>PriceCost_a</u> )	( <u>0</u> , -Cost <sub>a</sub> , -Slash <sub>c</sub> )
	F	( <u>0</u> , 0, -(Cost <sub>c</sub> +Slash <sub>c</sub> ))	( <u>0</u> , <u>0</u> , <u>-Slash</u> <sub>e</sub> )

		Computing provider	
		S	F
Asset	S	(0, -Cost <sub>a</sub> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))	( <u>0</u> , -Cost <sub>a</sub> , <u>-Slash</u> <sub>e</sub> )
	F	( <u>0</u> , <u>0</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))	( <u>0</u> , <u>0</u> , <u>-Slash</u> <sub>c</sub> )

### 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<sub>.</sub>: Utility from the result Slash : Computing provider slash Price : Asset price Price Computing price Cost : Computing cost

## Game Theory based model with blind slashing

		Computing provider	
		S	F
Asset	S	$(\underline{U_r}-(\underline{Price_a}+\underline{Price_c}), \underline{Price_a}, \underline{Price_c}-\underline{Cost_c})$	( <u>-Slash</u> , <u>-Slash</u> , -(Cost <sub>c</sub> +Slash <sub>c</sub> ))
	F	( <u>-Slash<sub>r</sub>,</u> -Slash <sub>a</sub> , <u>-(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>-Slash</u> , <u>-Slash</u> , <u>-(Cost +Slash</u> ))

#### Results:

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

		Computing provider	
		s	F
Asset	S	(-Slash <sub>r</sub> , <u>-Slash<sub>a</sub>, -(Cost<sub>c</sub>+Slash<sub>c</sub>)</u> )	( <u>-Slash</u> <sub>r</sub> , <u>-Slash</u> <sub>a</sub> , <u>-(Cost_+Slash_)</u> )
	F	( <u>-Slash</u> , <u>-Slash</u> , <u>-(Cost</u> +Slash))	( <u>-Slash</u> <sub>e</sub> , <u>-Slash</u> <sub>a</sub> , <u>-(Cost</u> <sub>e</sub> +Slash <sub>e</sub> ))

U<sub>r</sub>: Utility from the result

Price<sub>a</sub>: Asset price

Price<sub>c</sub>: Computing price

Cost<sub>c</sub>: Computing cost

Slash<sub>r</sub>: Requester slash

Slash<sub>a</sub>: Asset provider slash

Slash<sub>c</sub>: Computing provider slash

## Not possible to get rid of all Nash Equilibriums

- 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 ⇒ non desirable Nash Equilibria.
  - a. Build trust between players so that they believe the other will switch strategies as agreed ⇒ reputation system encourages belief in other players right choice and coordination.
  - b. A punition (slashing) mechanism align individual incentives with collective outcomes ⇒ encourage the players to coordinate on a better strategy.
- ⇒ Ruin theory?

## Can we access worker logs?

- I explored <u>thegraph from bellecour</u>.
- 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?

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