

Economic Incentives and Souls in Schelling-point Based Oracles

WILLIAM GEORGE

Research Lead, Kleros

kleros.io



K L E R O S



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INCUBATOR



**European
Commission**

Winner of the Blockchains for Social Good
Prize from the European Union's Horizon
2020 research and innovation programme

bpifrance

New Payment

Payment Info

Title

Eg. Marketing Services Agreement with John

Fund Receiver

Enter the ETH address of the counterparty to this agreement. Make sure to use an address this party controls (Do not use an exchange address).

Amount

 ETHAmount that will be sent to the escrow as payment for the service. Funds will stay in the escrow until the payment is completed. Automatic Payment (Optional) Agreement Documents (Optional)

Extra Details | Cryptocurrency Transaction

Asset to exchange

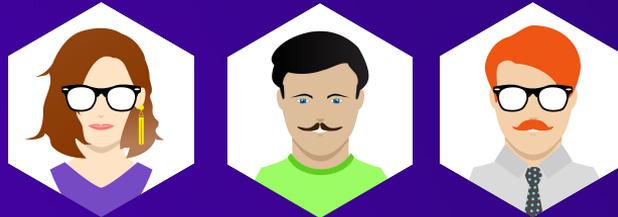
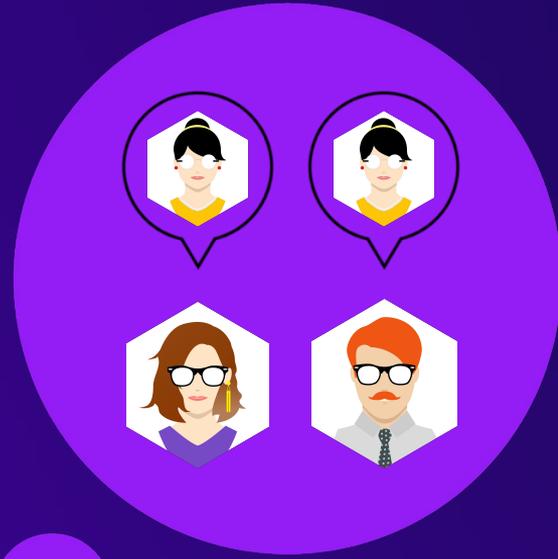
Address to send the asset



KLEROS



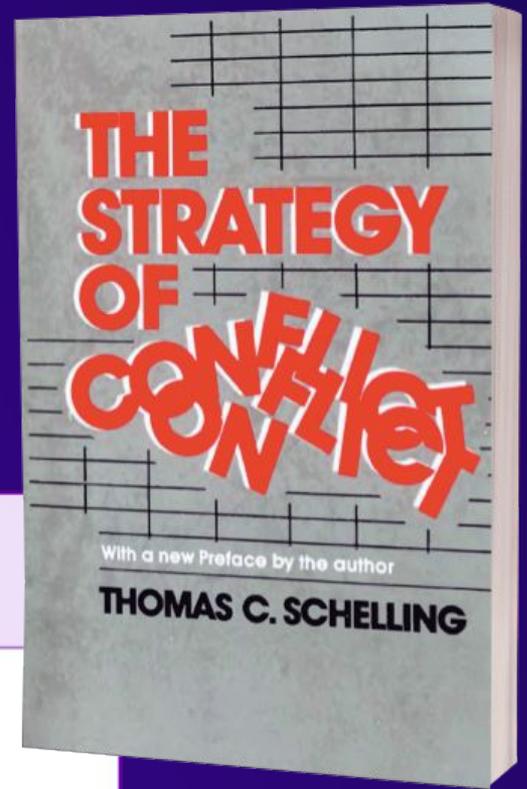
KLEROS



Schelling Point

→ “solution that people tend to use in the absence of communication because it seems natural, special, or relevant to them”

		You vote	
		X	Y
The majority vote	X	1	-1
	Y	-1	1



→ Non-transferable

→ Have to present the bad with the good (short of scraping entire wallet - starting over)

SBT wallet



INVOICE

overdue



Decentralized Society: Finding Web3's Soul¹

E. Glen Weyl,² Puja Ohlhaver,³ Vitalik Buterin⁴

May 2022

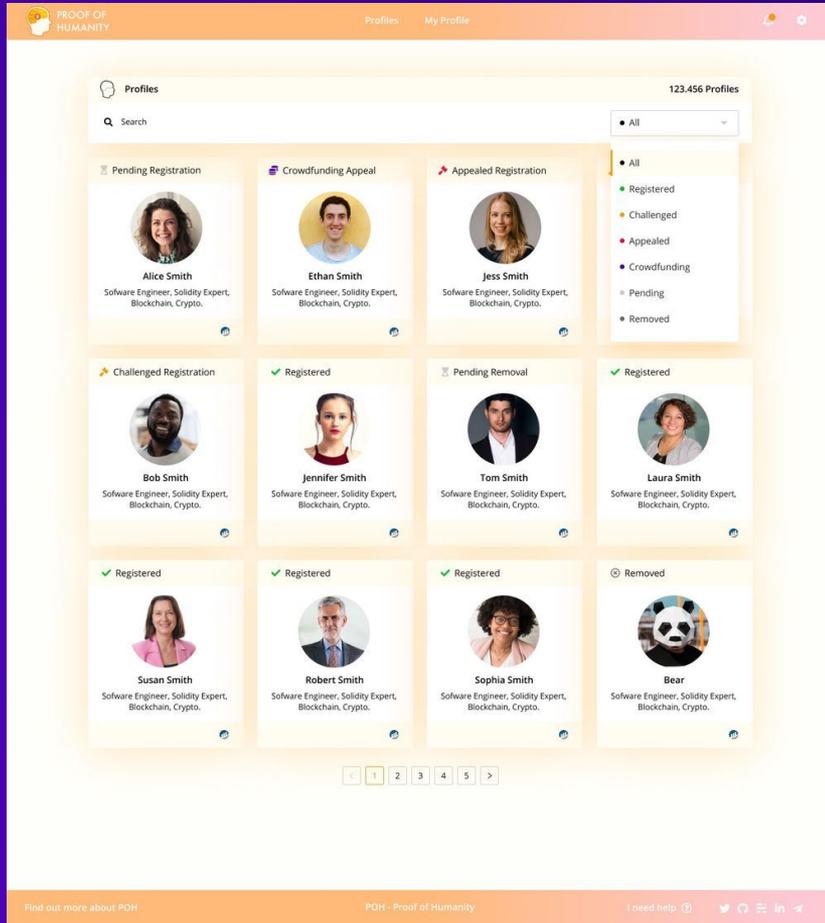
*"The Dao is the bearth and home
of the ten thousand things.*

*Good souls treasure it,
lost souls find shelter in it."*

— Laozi, #62

Abstract

Web3 today centers around expressing transferable, financialized assets, rather than encoding social relationships of trust. Yet many core economic activities—such as uncollateralized lending and building personal brands—are built on persistent, non-transferable relationships. In this paper, we illustrate how non-transferable “soulbound” tokens (SBTs) representing the commitments, credentials, and affiliations of “Souls” can encode the trust networks of the real economy to establish provenance and reputation. More importantly, SBTs enable other applications of increasing ambition, such as community wallet recovery, sybil-resistant governance, mechanisms for decentralization, and novel markets with decomposable, shared rights. We call this richer, pluralistic ecosystem “Decentralized Society” (DeSoc)—a co-determined sociality, where Souls and



PROOF OF HUMANITY

→ Proof of personhood/Sybil resistance tool

→ Curated list, if dispute over eligibility -> Kleros dispute



William George

Mathematician, cryptographer,
blockchain researcher.

Vouchers

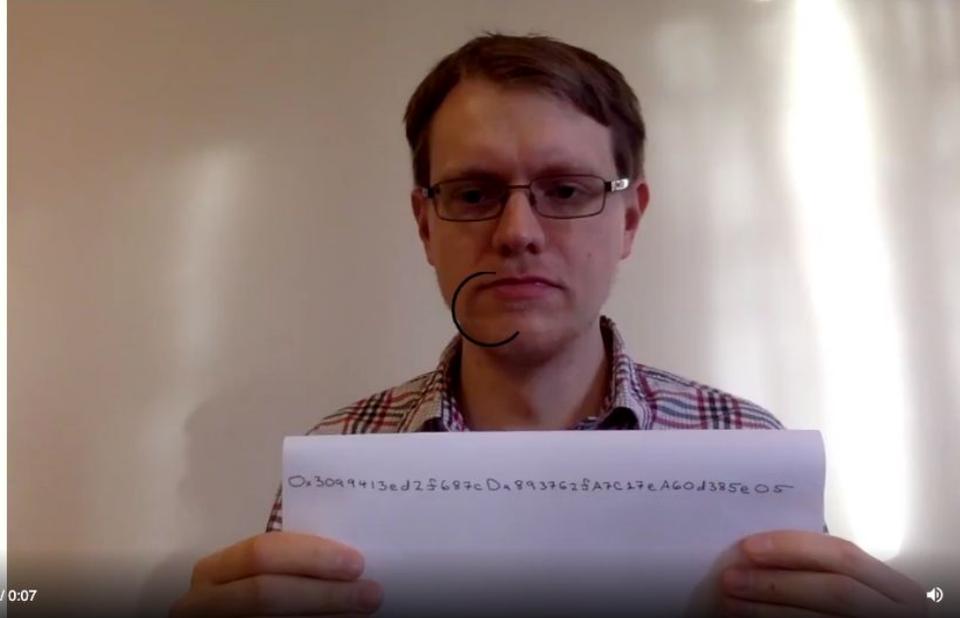
0/1

Deposit

0.00%

 William George

 0x3099413ed2f687cda893762fa7c17ea60d385e05



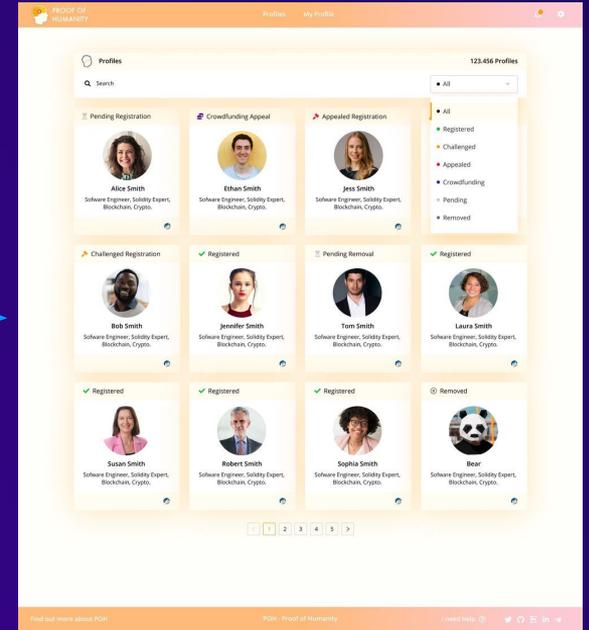
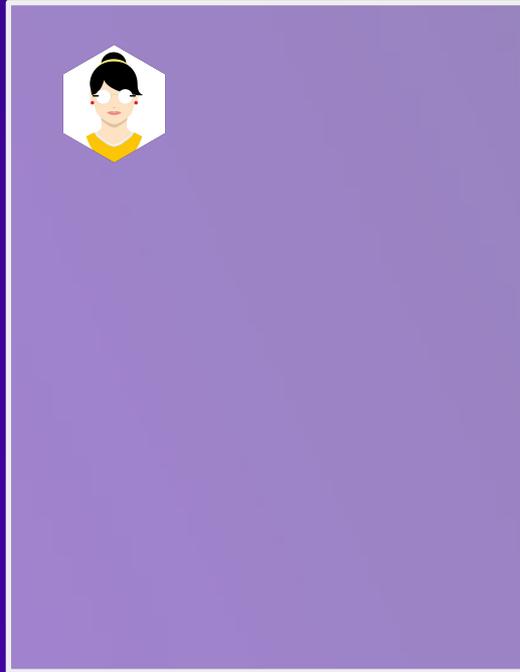
“I certify that I am a real human, and that I am not already registered in this registry.”

Pending submissions:



“I am a human not already on the registry”

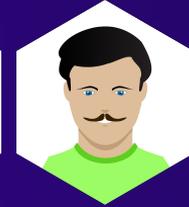
Deposit:



Pending submissions:



Jury



“I am a human not already on the registry”



Deposit:



CHALLENGER

Deposit:



Removal Request

A request to remove a submission in "Registered" state from the list can be made at any time by anyone submitting a deposit.

The removal requester has to either:

- Provide evidence that the above-cited acceptance criteria are not fulfilled by the submission.
 - Example: Send the following removal request
Evidence name: This user video is a deep-fake
Evidence description: You will find in the attached file an analysis report proving that this video is deep-faked.
- Or provide evidence that he is the submitter and wants to voluntarily remove his submission.
 - Example 1: Send a removal request from the same address as the submitter.
 - *Evidence Name: Self-removal of submission*
 - *Evidence Description: I am the submitter as proven by my address and I want to remove this submission.*

“Video attached is a recording of myself saying the sentence ‘I want to remove my own submission from the Proof of Humanity registry.’”



PROOF OF
HUMANITY

Registry Policy



- Example 2: Send a removal request from a different address than the submitter.
 - *Evidence Name: Self-removal of submission*
 - *Evidence Description: I am the submitter and I want to remove this submission. The video attached is a recording of myself saying the sentence "I want to remove my own submission from the Proof of Humanity registry."*

SBT wallet



addr 1

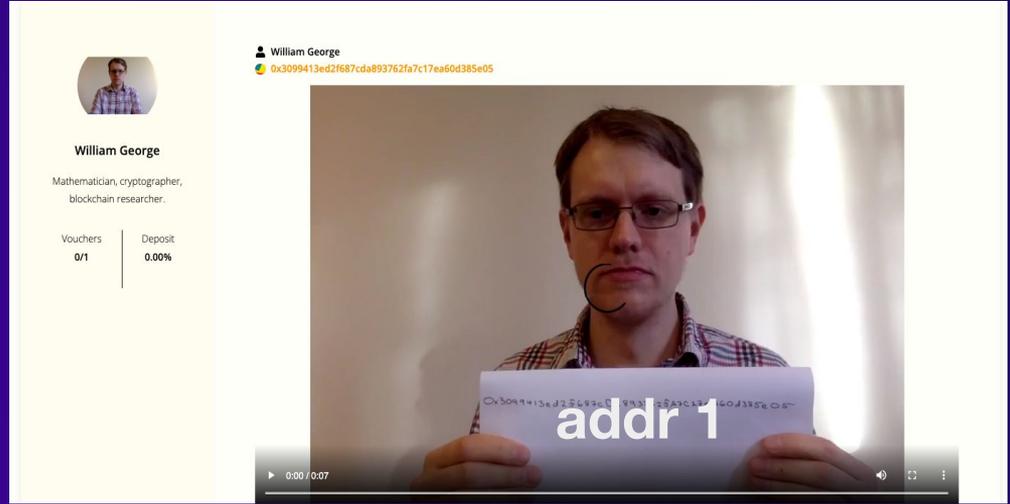
William George
0x3099413ed2f687cda893762fa7c17ea60d385e05

William George
Mathematician, cryptographer,
blockchain researcher.

Vouchers	Deposit
0/1	0.00%

0x3099413ed2f687cda893762fa7c17ea60d385e05
addr 1

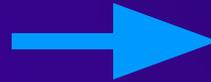
0:00 / 0:07



addr 1

addr 2

I want to remove my own submission.
Resubmit with addr2.



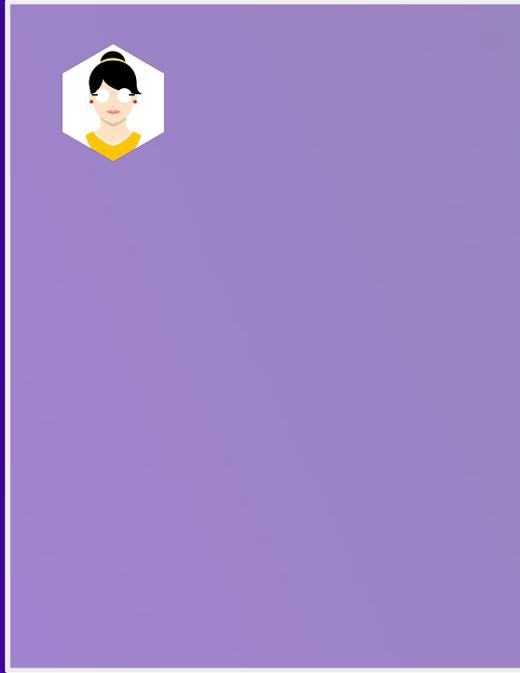
“  is an expert
in Subject X”

Pending submissions:



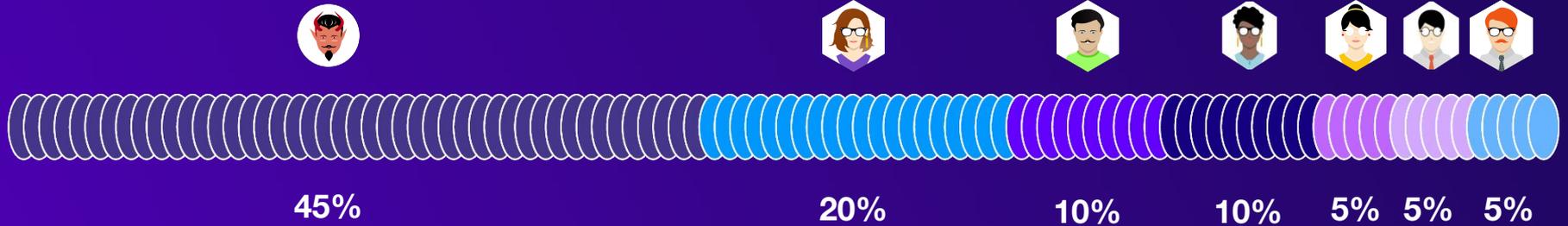
“I am an expert
in Subject X”

Deposit:



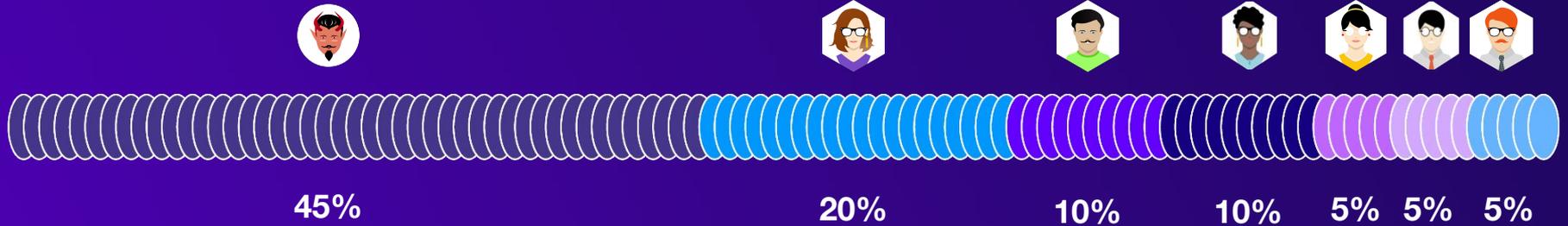
**Effects of using
proof-of-personhood
and SBTs on attack
resistance**

Jury selection without proof-of-personhood



Jury:

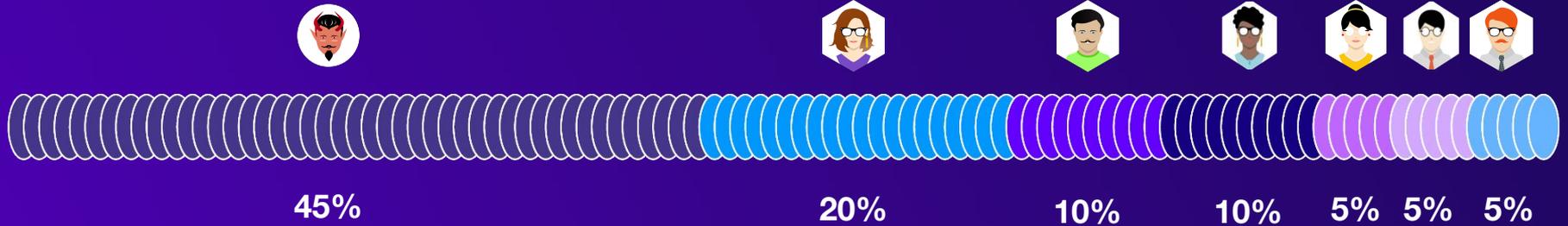
Jury selection without proof-of-personhood



Jury:



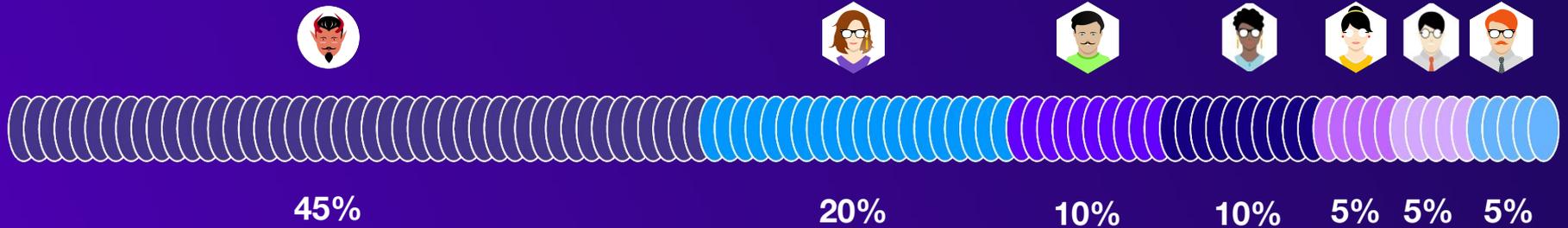
Jury selection without proof-of-personhood



Jury:



Jury selection without proof-of-personhood



Jury:



45% chance
of another



55% chance
of someone else

42.5% overall
chance of getting

≥ 2  's

Jury selection without proof-of-personhood



**Security
Model**

**No participant
controls more
than 50% of
stake**

Quadratic Funding

Suppose participants $1, \dots, K$ contribute c_1^p, \dots, c_K^p respectively to project p

Then project p receives a grant of :

$$\left(\sum_j \sqrt{c_j^p} \right)^2 - \sum_j c_j^p$$

Quadratic Funding

Proposal: Give  a grant
Contribution

-  0
-  1
-  1
-  4
-  0
-  1
-  0

Total Subsidy:

$$(3 \cdot \sqrt{1} + \sqrt{4} + 3 \cdot \sqrt{0})^2 - 7 = 18$$

Proposal: Give  a grant
Contribution

-  7
-  0
-  0
-  0
-  0
-  0
-  0

Total Subsidy:

$$(\sqrt{7} + 6 \cdot \sqrt{0})^2 - 7 = 0$$

Quadratic Funding with secure proof-of-personhood

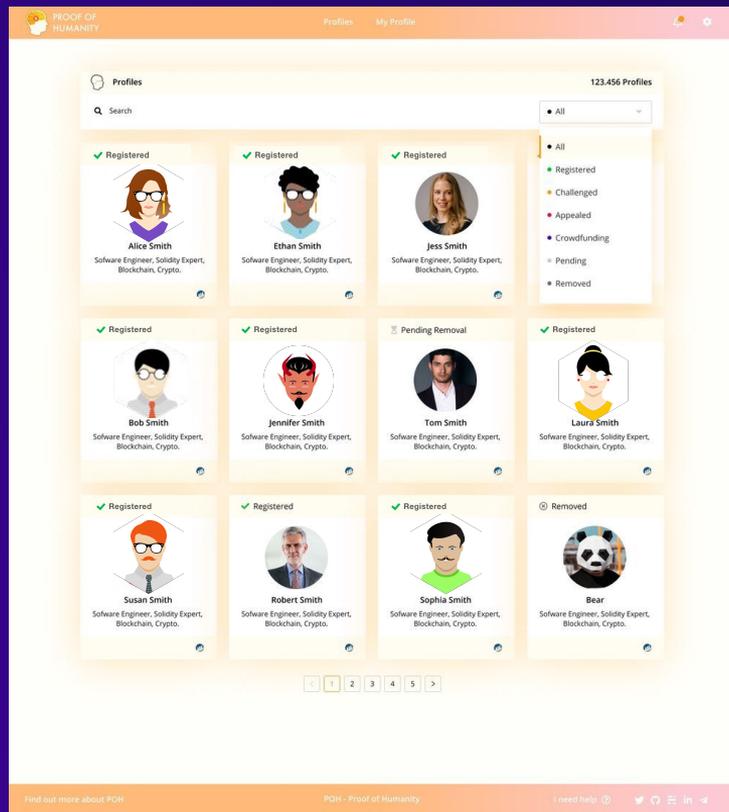
Proposal: Give  a grant

Contribution

	1
	0
	0
	0
	0
	0
	0

Total Subsidy:

$$(\sqrt{1} + 6 \cdot \sqrt{0})^2 - 1 = 0$$



The screenshot shows the 'Proof of Humanity' website interface. At the top, it says 'PROOF OF HUMANITY' and 'Profiles My Profile'. Below that, there's a search bar and a dropdown menu for '123,456 Profiles'. The main content is a grid of 12 user profiles, each with a name, a bio, and a status. The profiles are:

- Alice Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Ethan Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Jess Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Bob Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Jennifer Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Tom Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Pending Removal.
- Laura Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Susan Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Robert Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Sophia Smith: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Registered.
- Bear: Software Engineer, Solidity Expert, Blockchain, Crypto. Status: Removed.

At the bottom, there's a footer with 'Find out more about POH', 'POH - Proof of Humanity', and 'I need help'.

Quadratic Funding without (secure) proof-of-personhood

Proposal: Give  a grant

Contribution



1/N with each of N profiles



0



0



0



0



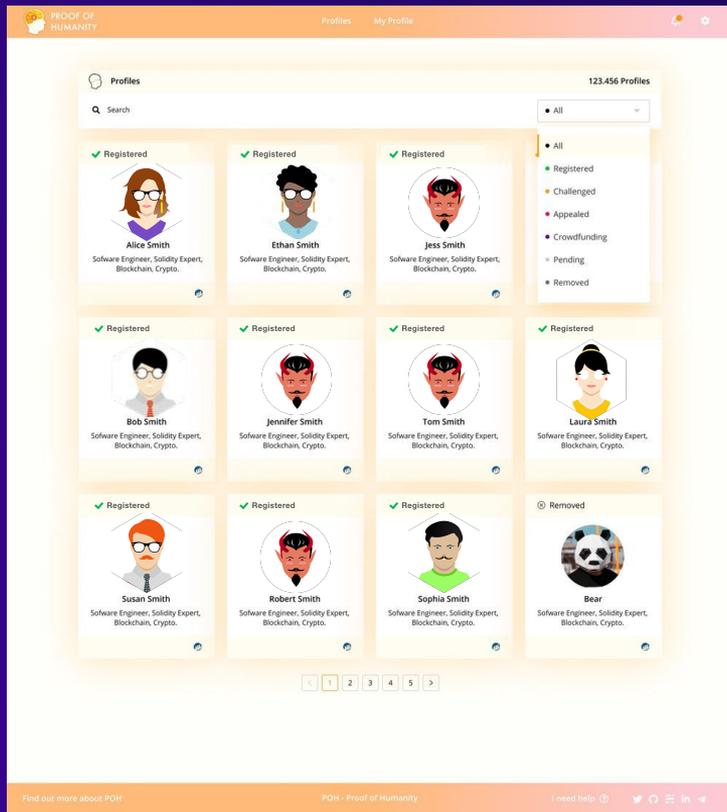
0



0

Total Subsidy:

$$\left(N \cdot \sqrt{\frac{1}{N}} + 6 \cdot \sqrt{0}\right)^2 - 1 = N - 1$$



Quadratic Funding

**Security
Model**



**Proof-of-
personhood
protocol
secure**

Jury selection with secure proof-of-personhood



45%

20%

10%

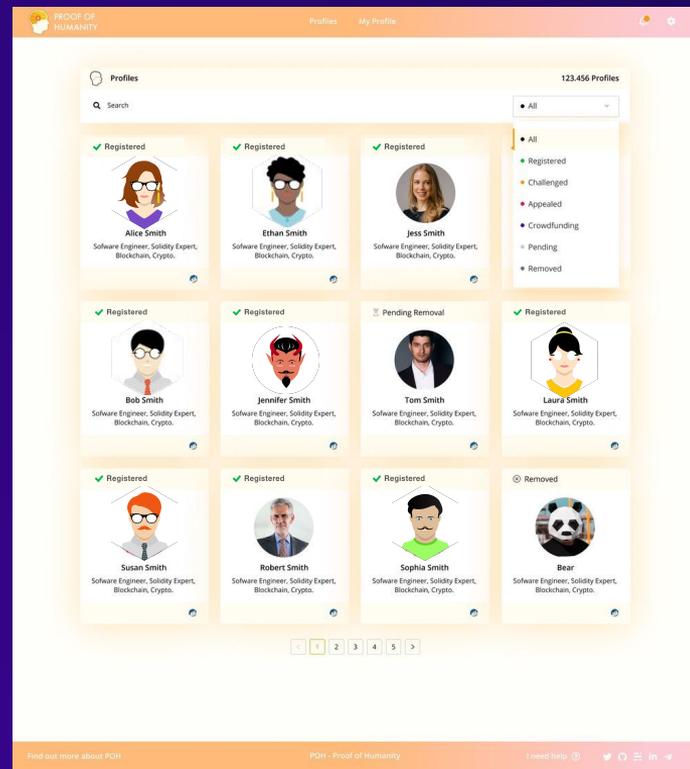
10%

5%

5%

5%

Jury:



Jury selection with secure proof-of-personhood



45%

20%

10%

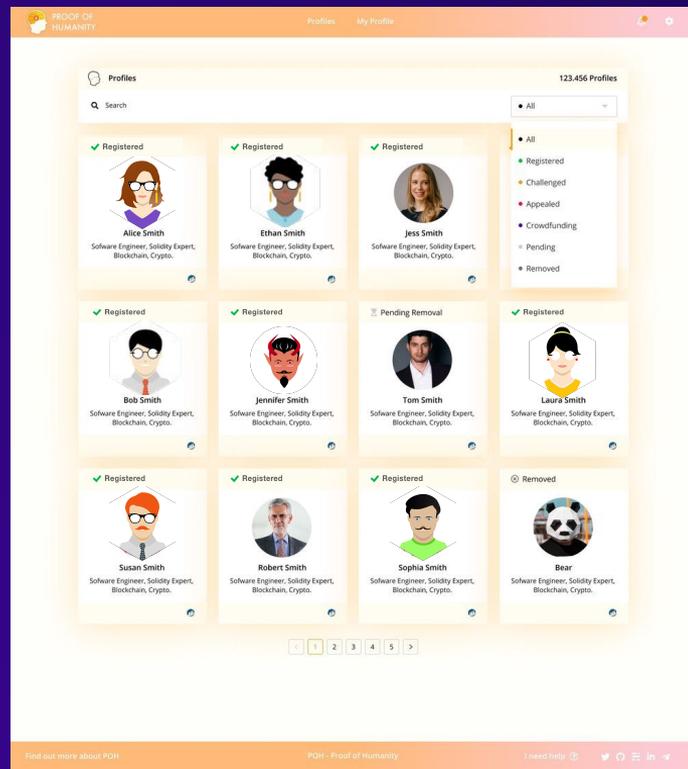
10%

5%

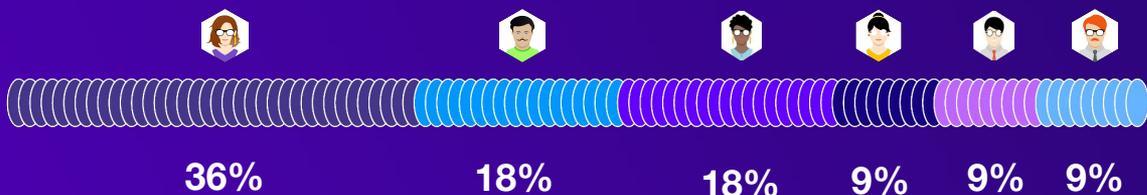
5%

5%

Jury:



Jury selection with secure proof-of-personhood



Jury:



PROOF OF HUMANITY

Profiles My Profile

123,456 Profiles

Search

- All
- Registered
- Challenged
- Appealed
- Crowdfunding
- Pending
- Removed

<p>Registered</p> <p>Alice Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Ethan Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Jess Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	
<p>Registered</p> <p>Bob Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Jennifer Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Pending Removal</p> <p>Tom Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Laura Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>
<p>Registered</p> <p>Susan Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Robert Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Registered</p> <p>Sophia Smith Software Engineer, Solidity Expert, Blockchain, Crypto.</p>	<p>Removed</p> <p>Bear Software Engineer, Solidity Expert, Blockchain, Crypto.</p>

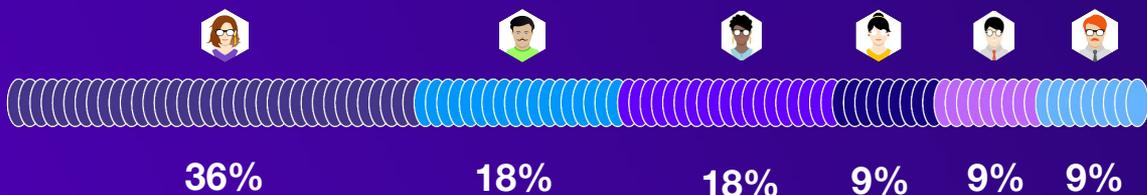
1 2 3 4 5

Find out more about POH

POH - Proof of Humanity

I need help

Jury selection with secure proof-of-personhood



Jury:



PROOF OF HUMANITY

Profiles My Profile

123,456 Profiles

Search

All

- All
- Registered
- Challenged
- Appealed
- Crowdfunding
- Pending
- Removed

Registered Alice Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Ethan Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Jess Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	
Registered Bob Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Jennifer Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Pending Removal Tom Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Laura Smith Software Engineer, Solidity Expert, Blockchain, Crypto.
Registered Susan Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Robert Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Registered Sophia Smith Software Engineer, Solidity Expert, Blockchain, Crypto.	Removed Bear Software Engineer, Solidity Expert, Blockchain, Crypto.

Find out more about POH

POH - Proof of Humanity

I need help

Jury selection with secure proof-of-personhood



29%

29%

14%

14%

14%

Jury:



The screenshot shows the 'PROOF OF HUMANITY' web application interface. At the top, there are navigation links for 'Profiles' and 'My Profile'. The main content area displays a grid of 12 user profiles, each with a profile picture, name, and a list of skills. The profiles are categorized by status: Registered (green checkmark), Pending Removal (red X), and Removed (grey circle). A search bar is located at the top left, and a filter dropdown is at the top right. The bottom of the page features a footer with 'Find out more about POH', 'POH - Proof of Humanity', and 'I need help' with social media icons.

Profile	Status	Skills
Alice Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Ethan Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Jess Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Bob Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Jennifer Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Tom Smith	Pending Removal	Software Engineer, Solidity Expert, Blockchain, Crypto.
Laura Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Susan Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Robert Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Sophia Smith	Registered	Software Engineer, Solidity Expert, Blockchain, Crypto.
Rear	Removed	Software Engineer, Solidity Expert, Blockchain, Crypto.

Jury selection with secure proof-of-personhood



29%

29%

14%

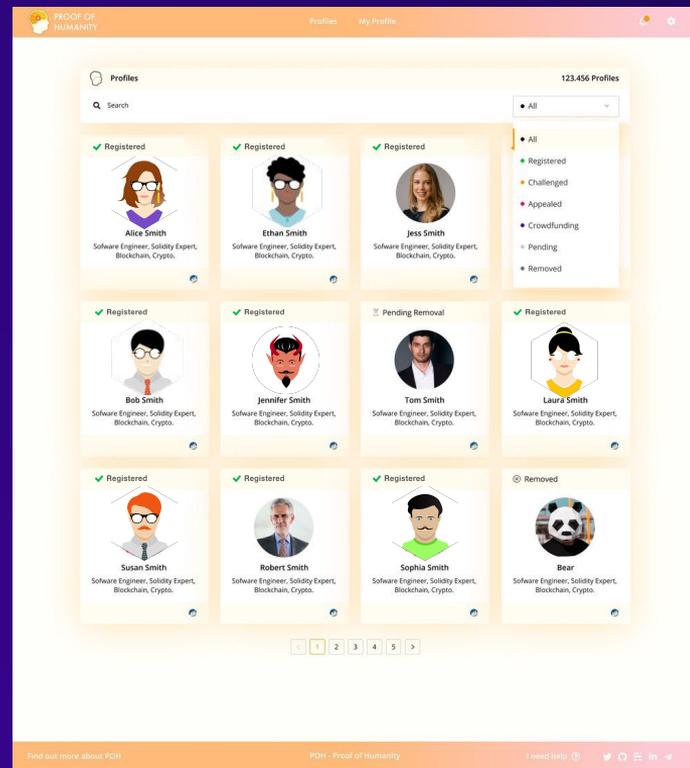
14%

14%

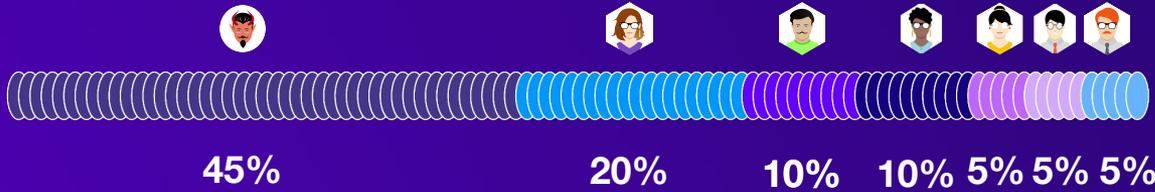
Jury:



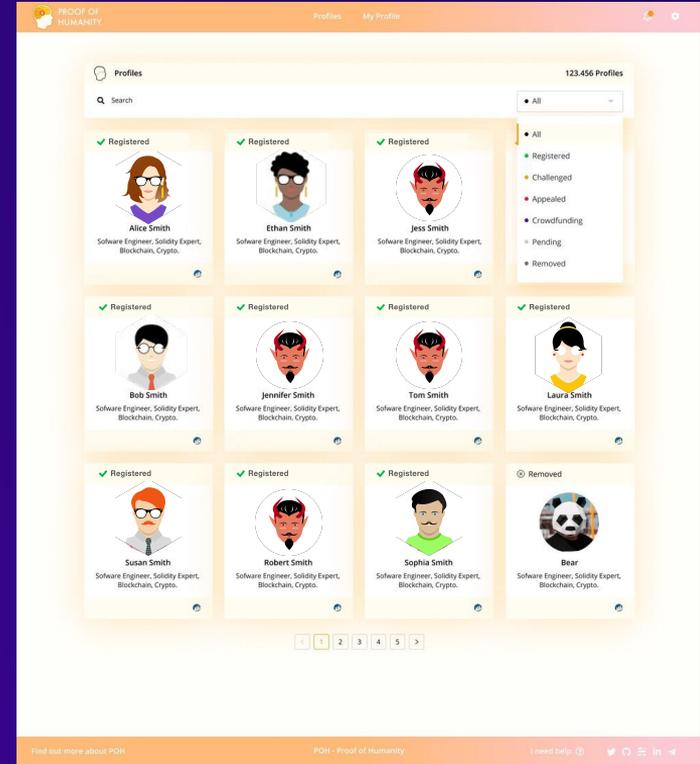
0% overall chance of getting ≥ 2 's



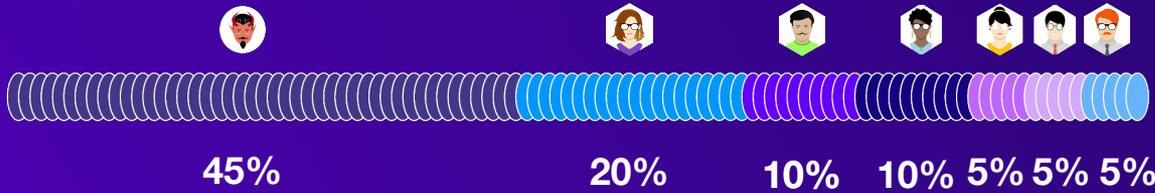
Jury selection with insecure proof-of-personhood



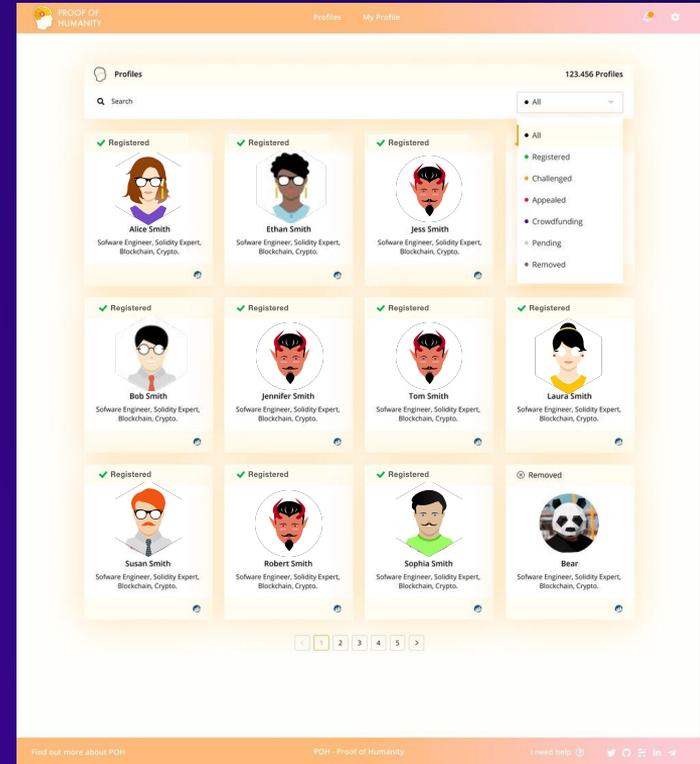
Jury:



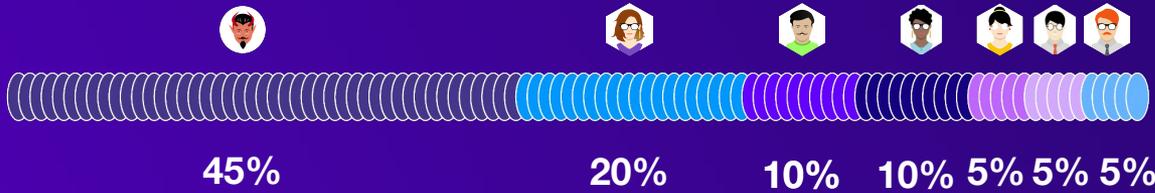
Jury selection with insecure proof-of-personhood



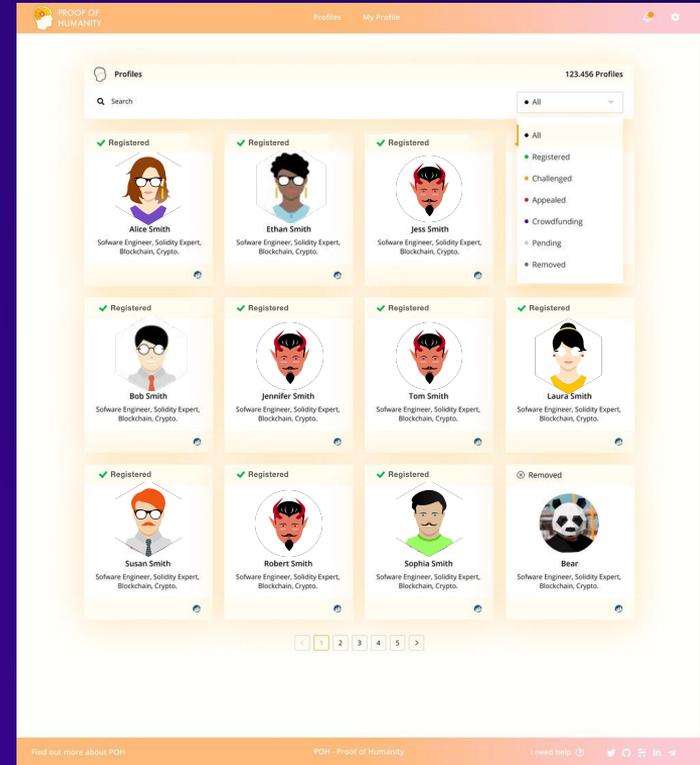
Jury:



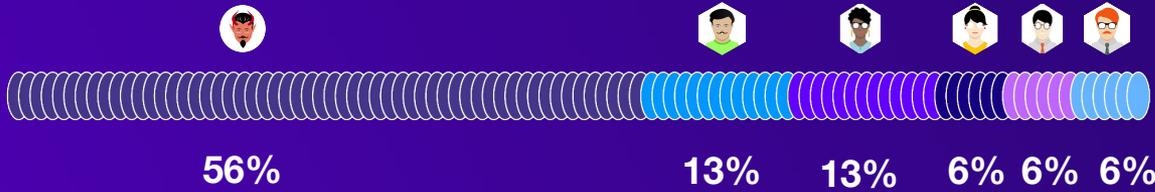
Jury selection with insecure proof-of-personhood



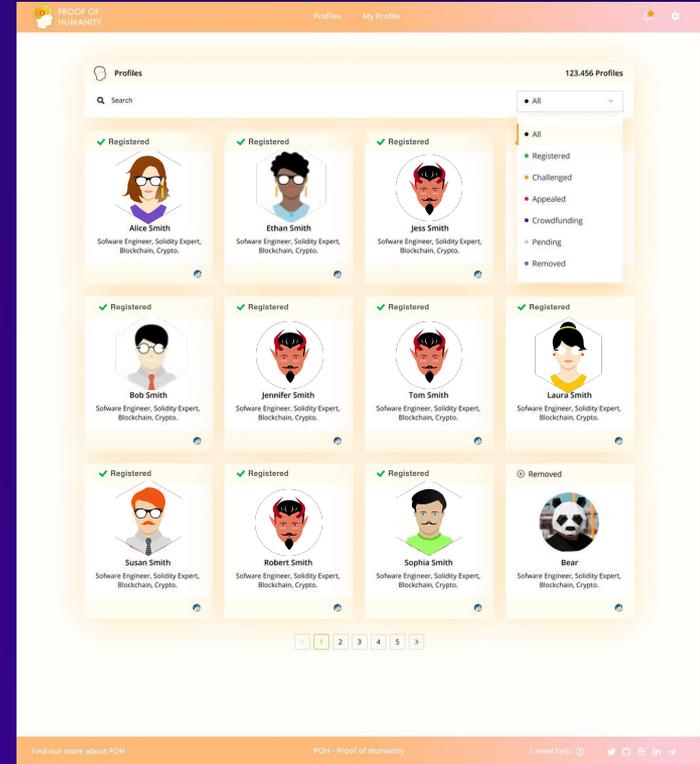
Jury:



Jury selection with insecure proof-of-personhood



Jury:



Jury selection with insecure proof-of-personhood



56%



13%



13%



6%



6%



6%

Jury:

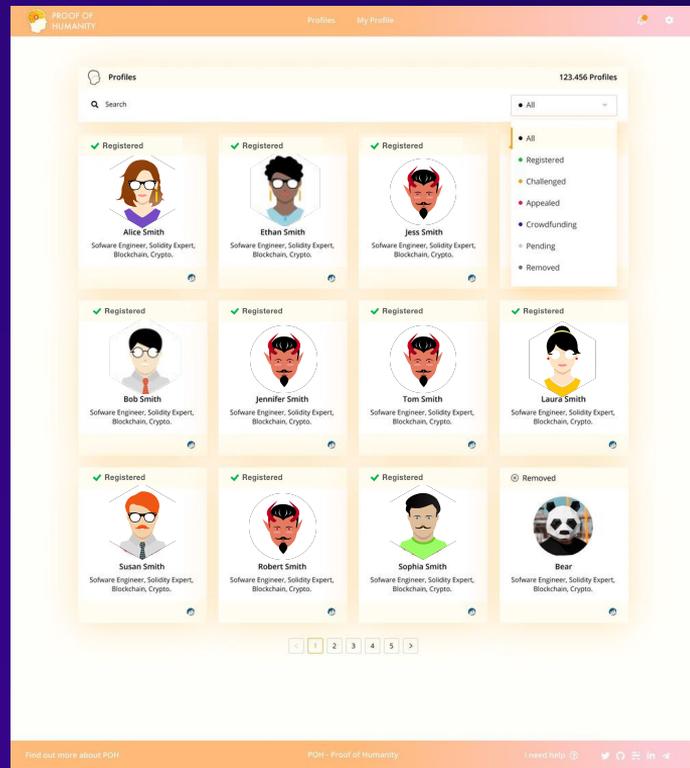


56% chance
of another



44% chance
of someone else

< 52% overall chance
of getting ≥ 2 's



Jury selection with proof-of-personhood

**Security
Model**

**Proof-of-personhood
protocol secure**

OR

**No participant controls
more $x\%$ of stake***

*x depends on number of jury spots, distribution of other stakers - in example threshold for  having 50% chance of getting 2 pots is $x=44\%$

Weighting by SBTs



POAP!



Offset Match

(from Decentralized Society: Finding Web3's Soul. Weyl, Ohlhaber, Buterin)



POAP!



For each pair of participants i, k define:

$$s_{i,k} = \frac{\text{\#SBTs } i, k \text{ share}}{\text{\#SBTs } i \text{ has}}$$

Then solve for
such that

α_i

$$\alpha_i + \sum_{k \neq i} \alpha_k s_{k,i} = 1$$

Offset Weighting



POAP!



Example:

$$s_{\text{Avatar 2}, \text{Avatar 3}} = 1/2$$

$$a_{\text{Avatar 1}} = 1/4$$

$$a_{\text{Avatar 4}} = 1/4$$

$$a_{\text{Avatar 2}} = 1$$

$$a_{\text{Avatar 5}} = 1/4$$

$$a_{\text{Avatar 6}} = 0$$

$$a_{\text{Avatar 7}} = 1/4$$

Offset Weighting - philosophy

$$A = (\alpha_1 \dots \alpha_K)$$

$$S = (s_{k,j})_{k,j=1, \dots, K}$$

$$1 = (1 \dots 1)$$

GOAL: Solve for A such that

$$A \cdot S = 1$$

Offset Weighting - philosophy

$$A \cdot S = 1$$



$$\left(\begin{array}{l} \sum_{j=1}^{K_1} \alpha_j = 1 \\ \sum_{j=K_1+1}^{K_2} \alpha_j = 1 \\ \sum_{j=K_2+1}^K \alpha_j = 1 \end{array} \right)$$

$$(\alpha_1 \dots \alpha_K) \cdot \left(\begin{array}{ccc|cc|ccc} 1 & \dots & \dots & 1 & & & & & \\ \vdots & \ddots & & \vdots & & & & & \\ \vdots & & \ddots & \vdots & & & & & \\ \vdots & & & \vdots & & & & & \\ 1 & \dots & \dots & 1 & & & & & \\ \hline & & & 0 & & & & & \\ & & & 0 & & & & & \\ \hline & & & 0 & 1 & 1 & & & \\ & & & 0 & 1 & 1 & & & \\ \hline & & & & & & & & \\ & & & & & & 1 & \dots & \dots & \dots & 1 \\ & & & & & & \vdots & \ddots & & & \vdots \\ & & & & & & \vdots & & \ddots & & \vdots \\ & & & & & & \vdots & & & \ddots & \vdots \\ & & & & & & \vdots & & & & \vdots \\ & & & & & & 1 & \dots & \dots & \dots & 1 \end{array} \right) = (1 \dots 1)$$

1 to K_1 K_1+1 to K_2 K_2+1 to K

Offset Weighting - calculation issues

- solution for α_i doesn't always exist, if exists may not be unique
- May produce negative α_i 's
- Handles how much weight given to group reasonably well... but not necessarily naturally distributed to individuals. Tendency of offset match to give participants with a superset of SBTs zero weight

Quadratic Funding with Offset Match

Suppose participants $1, \dots, K$ contribute c_1^p, \dots, c_K^p respectively to project p

Then project p receives a grant of :

$$\left(\sum_i \sqrt{\alpha_i c_i^p} \right)^2 - \sum_i c_i^p$$

Juror selection with Offset Weighting



$$a_{\text{Juror 1}} = 1/4$$



$$a_{\text{Juror 2}} = 1$$



$$a_{\text{Juror 3}} = 0$$



$$a_{\text{Juror 4}} = 1/4$$



$$a_{\text{Juror 5}} = 1/4$$



$$a_{\text{Juror 6}} = 1/4$$



Unweighted
Stakes



40% 10% 20% 20% 5% 5%

Weighted
Stakes

$$\frac{\alpha_i \cdot \text{stake}_i}{\sum_j \alpha_j \cdot \text{stake}_j}$$

36% 36% 0% 18% 5% 5%

Juror selection with Offset Weighting



Expert in X



Expert in Y



Expert in X



Expert in X

PNAS PNAS PNAS

Groups of diverse problem solvers can outperform groups of high-ability problem solvers

Lu Hong^{†‡§} and Scott E. Page[¶]

[†]Michigan Business School and [‡]Complex Systems, University of Michigan, Ann Arbor, MI 48109-1234; and [§]Department of Finance, Loyola University, Chicago, IL 60611

Edited by William J. Baumol, New York University, New York, NY, and approved September 17, 2004 (received for review May 25, 2004)

We introduce a general framework for modeling functionally diverse problem-solving agents. In this framework, problem-solving agents possess representations of problems and algorithms that they use to locate solutions. We use this framework to establish a result relevant to group composition. We find that when selecting a problem-solving team from a diverse population of intelligent agents, a team of randomly selected agents outperforms a team comprised of the best-performing agents. This result relies on the intuition that, as the initial pool of problem solvers becomes large, the best-performing agents necessarily become similar in the space of problem solvers. Their relatively greater ability is more than offset by their lack of problem-solving diversity.

A diverse society creates problems and opportunities. In the past, much of the public interest in diversity has focused on issues of fairness and representation. More recently, however, there has been a rising interest in the benefits of diversity. In the legal cases surrounding the University of Michigan's admissions

equal ability, functionally diverse groups outperform homogeneous groups. It has also been shown that functionally diverse groups tend to outperform the best individual agents, provided that agents in the group are nearly as good (1). These results still leave open an important question: Can a functionally diverse group whose members have less ability outperform a group of people with high ability who may themselves be diverse? The main result of our paper addresses exactly this question.

Consider the following scenario: An organization wants to hire people to solve a hard problem. To make a more informed decision, the organization administers a test to 1,000 applicants that is designed to reflect their individual abilities in solving such a problem. Suppose the applicants receive scores ranging from 60% to 90%, so that they are all individually capable. Should the organization hire (i) the person with the highest score, (ii) 20 people with the next 20 highest scores, or (iii) 20 people randomly selected from the applicant pool? Ignoring possible problems of communication within a group, the existing litera-

Weighting by SBTs

Security Model - Questions to Ask

- What happens if attacker breaks distribution of an SBT?
- Are participants incentivized to keep SBTs on same address or split them up?

Weighting by SBTs - is broken



POAP!

N profiles
each with



only SBT that
defines group



Result:
takes almost all
weight from
 group

Weighting by SBTs - is broken



one of K SBTs
that characterizes
a cluster



makes N
profiles with 
can't copy others

$$(\alpha_1 \dots \alpha_K) \cdot \begin{pmatrix} 1 & \dots & 1 & 1 & 1 & \dots & 0 \\ \vdots & \ddots & \vdots & \vdots & \vdots & \ddots & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ 1 & \dots & 1 & 1 & 1 & \dots & 0 \\ \hline \frac{1}{K} & \dots & \frac{1}{K} & 1 & \frac{K-1}{K} & \dots & 0 \\ \frac{1}{K} & \dots & \frac{1}{K} & \frac{K-1}{K} & 1 & \dots & 0 \\ \hline 0 & \dots & 0 & \dots & \dots & \dots & 1 & \dots & \dots & \dots & 1 \\ \vdots & \ddots & \vdots & \vdots & \vdots & \ddots & \vdots & \ddots & \vdots & \vdots & \vdots \\ \vdots & \vdots \\ 1 & \dots & \dots & \dots & \dots & \dots & 1 & \dots & \dots & \dots & 1 \end{pmatrix} = (1 \dots 1)$$

Weighting by SBTs - is broken



one of K SBTs
that characterizes
a cluster



makes N
profiles with 
can't copy others

Result (under
offset match): 
still takes almost
all weight from



group

Other weighting schemes?

Other idea?:

Find

$\alpha_1, \dots, \alpha_K$

with

$$\alpha_i = \frac{1}{\lambda} \sum_j \frac{1}{s_{i,j}} \alpha_j$$

Related to eigenvector
centrality/PageRank
algorithm

Conclusions

- Proof-of-personhood protocols natural substrate for types of social recovery, in some cases distribution of SBTs
- Ideas developed around weighting QF contributions by SBTs also relevant in juror selection, maybe other applications

Conclusions

- Moving from:
 - purely economic
 - ◆ economic + proof-of-personhood
 - ◆ economic + proof-of-personhood + SBTscan have subtle effects on security model
- Questions relevant to security models of systems using SBTs - what happens if a single SBT broken? Do users have an incentive to split SBTs over different wallets?

Economic Incentives and Souls in Schelling-point Based Oracles

WILLIAM GEORGE

Research Lead, Kleros

kleros.io



K L E R O S



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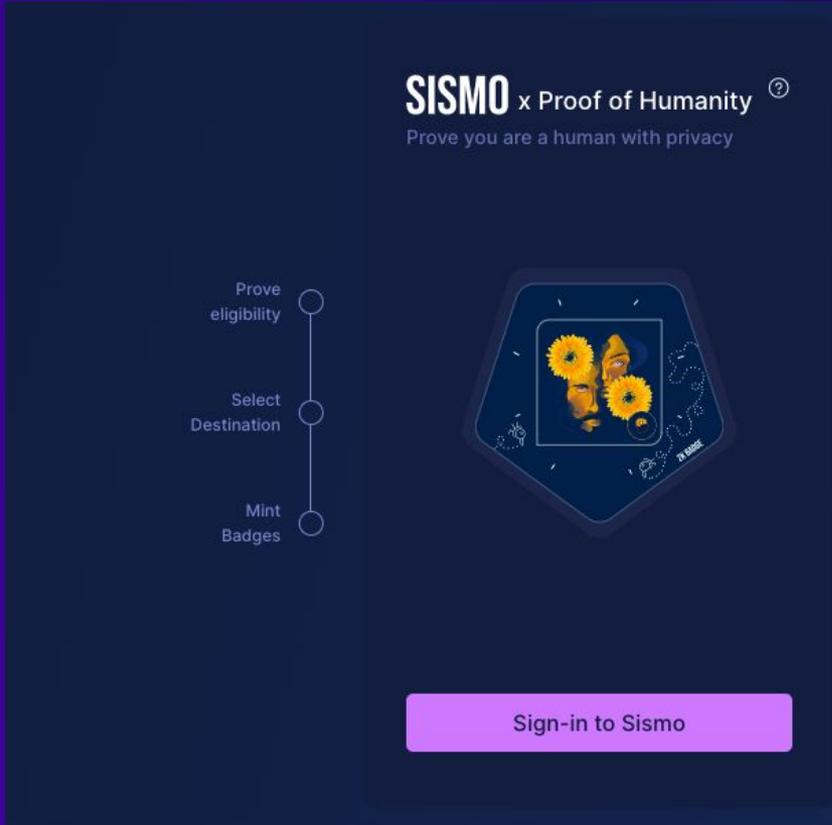
Winner of the Blockchains for Social Good
Prize from the European Union's Horizon
2020 research and innovation programme

bpifrance



addr 1

SISMO x Proof of Humanity [®]
Prove you are a human with privacy



The interface features a vertical flowchart on the left with three steps: 'Prove eligibility', 'Select Destination', and 'Mint Badges'. To the right is a hexagonal badge with a person's face, sunflowers, and a DNA helix. At the bottom is a purple 'Sign-in to Sismo' button.

Prove eligibility

Select Destination

Mint Badges

Sign-in to Sismo