

The Application of Zero-Knowledge Proofs: Proof of Solvency

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What is ZKP

Goal: Prove a statement is true without revealing additional information, only the fact itself.

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- Compared to classic proofs
 - **Classic proofs** (pythagorean theorem, Euler's theorem, etc.):
verifier passively reads the proof
 - **ZKP**: two new ingredients, interaction and randomness

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 - **ZKP:** two new ingredients, interaction and randomness

$\mathcal{P} \xrightarrow{m_1} \mathcal{V}$

$\xleftarrow{\$} c_1 \leftarrow \{0, 1\}^t$

$\xrightarrow{m_2}$

$\xleftarrow{\$} c_2 \leftarrow \{0, 1\}^t$

\leftarrow

...

interactive +
probabilistic proof
system

Zk-SNARKs

Succinctness: small proof size and short verifier time

Non-interactive: Fiat-Shamir transformation

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Building a zk-SNARK

commitment scheme + interactive oracle proof \Rightarrow zk-SNARK

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Building a zk-SNARK

commitment scheme + interactive oracle proof \Rightarrow zk-SNARK

- Commitment scheme: commit to a value and later reveal it
 - Binding: cannot open one commitment to two different values
 - Hiding: cannot learn the committed value from the commitment
- Random oracle: a black box that randomly uniformly outputs the same bits with the same input and different bits with different input

Important Commitment Schemes

- Polynomial commitments: univariate polynomial $f(X)$
- Multilinear commitments: multivariate polynomial $f(X_1, X_2, \dots, X_n)$
- Vector commitments: vector $\vec{v} = (v_1, v_2, \dots, v_n)$
- ...

Polynomial Commitment Scheme (PCS)

Given $\text{srs} = \{g, g^\tau, g^{\tau^2}, g^{\tau^3}, \dots\}$, the PCS allows \mathcal{P} to commit to a polynomial $f(X)$; denote the commitment to $f(X)$ by \mathcal{C}_f

$$\mathcal{C}_f = g^{f_0 + f_1\tau + f_2\tau^2 + f_3\tau^3 + f_4\tau^4 \dots}$$

where f_i is the coefficient of X^i in $f(X)$.

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Example

Prove the evaluation of $f(a)$ is b

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Prove the evaluation of $f(a)$ is b

A useful observation:

$$f(a) = b \iff q(X) \text{ exists s.t. } q(X) = \frac{f(X) - b}{X - a}$$

Application of PCS

\mathcal{P}

\mathcal{V}

$$q(X) = \frac{f(X) - b}{X - a}$$

commit(f, q)

$\mathcal{C}_f, \mathcal{C}_q$



check

$$e(\mathcal{C}_f/g^b, [1]_2) \stackrel{?}{=} e(\mathcal{C}_q, [X - a]_2)$$

Application of PCS

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$$e(\mathcal{C}_f / g^b, [1]_2) \stackrel{?}{=} e(\mathcal{C}_q, [X - a]_2)$$

Schwartz-Zippel Lemma

Given a polynomial $f \in \mathbb{F}_{\leq d}[X]$. Let S be a finite subset of \mathbb{F} and $X \in S$ be chosen uniformly at random. Then

$$\Pr[f(X) = 0] \leq \frac{d}{|S|}$$

where d is the degree of f .

Polynomial Interactive Oracle Proof (Poly-IOP)

Polynomial Constraints: a set of polynomial relations among polynomials $f_1(X), f_2(X), \dots, f_n(X)$.

Polynomial Interactive Oracle Proof (Poly-IOP)

Example

Prove $f(X) = g(X)$ when $X = a$

Polynomial Interactive Oracle Proof (Poly-IOP)

Example

Prove $f(X) = g(X)$ when $X = a$

\mathcal{P}

\mathcal{V}

$$q(X) = (f(X) - g(X)) / (X - a)$$

commit(f, g, q)

$\mathcal{C}_f, \mathcal{C}_g, \mathcal{C}_q$

$\gamma \xleftarrow{\$} \mathbb{F}_p$

$$\alpha_1 = f(\gamma), \alpha_2 = g(\gamma), \beta = q(\gamma)$$

check

$$(i) \alpha_1 - \alpha_2 \stackrel{?}{=} \beta \cdot (\gamma - a)$$

$$(ii) \alpha_1 \stackrel{?}{=} f(\gamma), \alpha_2 \stackrel{?}{=} g(\gamma), \\ \beta \stackrel{?}{=} q(\gamma)$$

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What is PoS

Proof of Solvency

How can a centralized exchange prove that it has enough assets to cover all the liabilities of its customers?

- Reveal the assets directly?
- Trust third-party auditors?

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Numerous incidents

- Mt. Gox, 2014
- QuadrigaCX, 2019
- FTX, 2022
- ...

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How can a centralized exchange prove that it has enough assets to cover all the liabilities of its customers?

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Proof of Solvency (PoS)

- Proof of Liabilities (PoL)
- Proof of Assets (PoA)

PoS is not a silver bullet

- It may rely on a trusted setup (depending on the proof system)
- It requires honest verifier and user check
- It is not helpful to prevent hacks, scams, etc

Limitations

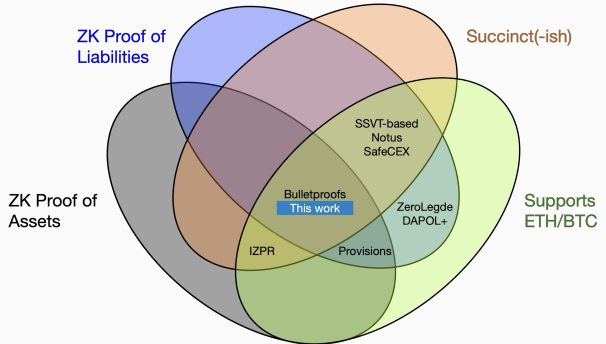
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It raises the bar for exchanges to cheat

Comparison with Previous Works

- Most of the previous works focus on only one side
- This work aims for a full end-to-end solution



Proof of Liabilities

Recall the problem

- Each user's balance is included in the proof
- The summation of all balances (total liability) is correct
- Each balance is in a specified range (range proof)

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$$p(X) : \quad \text{bal}_1 \quad \text{bal}_2 \quad \dots \quad \text{bal}_{n-1} \quad \text{bal}_n$$

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- Construct an accumulative polynomial

$$\begin{array}{llllll} f_{\text{liab}}(X) : & r_1 & r_2 & \dots & r_{n-1} & r_n \\ p(X) : & \text{bal}_1 & \text{bal}_2 & \dots & \text{bal}_{n-1} & \text{bal}_n \end{array}$$

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- Open the evaluation point for each user

Proof of Liabilities Example

User	Alice	Bob	Charlie	David
Balance	10	12	9	7

Table 1: User Balances

Proof of Liabilities Example

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Table 1: User Balances

<div>Poly \ X</div>	0	1	2	3
$f_{\text{liab}}(X)$	38	28	16	7
$p(X)$	10	12	9	7

Table 2: Polynomials

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- $f(X) = p(X), X = n - 1$
- $f(X) = p(X) + f(X + 1), \forall X \in [0, n - 1)$

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Table 2: Polynomials

- $f(X) = p(X), X = n - 1 \Rightarrow \frac{f(X) - p(X)}{X - (n - 1)} = q_1(X)$
- $f(X) = p(X) + f(X + 1), \forall X \in [0, n - 1]$
 $\Rightarrow \frac{f(X) - p(X) - f(X + 1)}{X(X - 1)(X - 2) \cdots [X - (n - 2)]} = q_2(X)$

Range Proof

- Prove a value $x \in [0, 2^k)$
- Prevent attacks by overflowing the liabilities and inserting negative values
- Binary decomposition¹
 - $\bar{z} = \{z_1, z_2, \dots, z_k\}, x = 2^0 \cdot z_1 + 2^1 \cdot z_2 + \dots + 2^{k-1} \cdot z_k$
 - $x = z_1 + 2 \cdot (z_2 + 2 \cdot (z_3 + 2 \cdot (z_4 + \dots)))$

	2^0	2^1	2^2	2^3	...	2^{k-2}	2^{k-1}
\bar{z}	z_1	z_2	z_3	z_4	...	z_{k-1}	z_k
λ	$z_1 + 2(z_2 + \dots)$	$z_2 + 2(z_3 + \dots)$	$z_3 + 2(z_4 + \dots)$	$z_4 + 2(z_5 + \dots)$...	$z_{k-1} + 2z_k$	z_k

¹<https://hackmd.io/@dabo/B1U4kx8XI>

Range Proof

- Prove a value $x \in [0, 2^k)$
- Prevent attacks by overflowing the liabilities and inserting negative values
- Binary decomposition¹

Example

	2^0	2^1	2^2	2^3
$x = 13$	$\lambda_0 = 1$	$\lambda_1 = 0$	$\lambda_2 = 1$	$\lambda_3 = 1$
$f_{\text{range}}(X)$	13	6	3	1
	$f_{\text{range}}(0)$	$f_{\text{range}}(1)$	$f_{\text{range}}(2)$	$f_{\text{range}}(3)$

- $f_{\text{range}}(X) \in \{0, 1\}, X = k - 1$
- $f_{\text{range}}(X) - 2 \cdot f_{\text{range}}(X + 1) \in \{0, 1\}, X \in [0, k)$

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Proof of Liability + Range Proof

<div>Poly \ X</div>	0	1	2	3
$f_{\text{liab}}(X)$	38	28	16	7
$p(X)$	10 5 2 1	12 6 3 1	9 4 2 1	7 3 1 0

Proof of Liability + Range Proof

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	5	6	4	3
	2	3	2	1
	1	1	1	0

The degree of $p(X)$ is proportional to the size of the range proof

- The largest set of the roots we can use is 2^{32}
- One million $\approx 2^{20}$
- We can only prove values in $[0, 2^{12})$

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Solution

- Break the range polynomial

Proof of Liability + Range Proof

$\begin{array}{c} \text{Poly} \backslash X \\ \hline \end{array}$	0	1	2	3
$f_{\text{iab}}(X)$	38	28	16	7
$p_1(X)$	10	12	9	7
$p_2(X)$	5	6	4	3
$p_3(X)$	2	3	2	1
$p_4(X)$	1	1	1	0

- $f_{\text{iab}}(n-1) = p_1(n-1)$
- $f_{\text{iab}}(X) = f_{\text{iab}}(X+1) + p_1(X), X \in [0, n-1]$
- $p_k(X) \in \{0, 1\}$
- $p_i(X) - 2p_{i+1}(X) \in \{0, 1\}$

Proof of Liability + Range Proof

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Clash attack: count the same amount only once

Clash Attack

$\begin{array}{c} \diagdown \\ \text{Poly} \end{array} \quad X$	0	1	2	3
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$p_1(X)$	10	12	9	7
$p_2(X)$	5	6	4	3
$p_3(X)$	2	3	2	1
$p_4(X)$	1	1	1	0
$u(X)$	A	B	C	D

- $p_k(X) \in \{0, 1\}$
- $p_i(X) - 2p_{i+1}(X) \in \{0, 1\}$
- $f_{\text{iab}}(n-1) = p_1(n-1)$
- $f_{\text{iab}}(X) = f_{\text{iab}}(X+1) + p_1(X), X \in [0, n-1]$
- For each user t , $p_1(t) = \text{bal}_t$, $u(t) = \text{uid}_t$

Proof of Assets

Recall the problem

- The exchange proves the ownership of some wallet accounts
- The total asset is the sum of these accounts

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Preliminaries

- Wallet address = Hash(pk)
- $pk = g^{sk}$, where g is a generator of an elliptic curve group (for Bitcoin and Ethereum, the curve is secp256k1; for the PCS, the curve is b1s12-381)
- Secured by the discrete logarithm assumption

Proof of Assets

Intuition

- Publish some public keys as an anonymity set $\{pk_i\}$

	pk_1	pk_2	pk_3	\dots	pk_{n-1}	pk_n
$b(X) :$	bal_1	bal_2	bal_3	\dots	bal_{n-1}	bal_n

Proof of Assets

Intuition

- Publish some public keys as an anonymity set $\{pk_i\}$
- Construct a selector polynomial $s(X)$ where each evaluation is in $\{0, 1\}$

	pk_1	pk_2	pk_3	\dots	pk_{n-1}	pk_n
$b(X) :$	bal_1	bal_2	bal_3	\dots	bal_{n-1}	bal_n
$s(X) :$	s_1	s_2	s_3	\dots	s_{n-1}	s_n

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	pk_1	pk_2	pk_3	\dots	pk_{n-1}	pk_n
$b(X) :$	bal_1	bal_2	bal_3	\dots	bal_{n-1}	bal_n
$s(X) :$	s_1	s_2	s_3	\dots	s_{n-1}	s_n
$f_{\text{assets}}(X) :$	r_1	r_2	r_3	\dots	r_{n-1}	r_n
	$s_1 \cdot bal_1 + r_2$	$s_2 \cdot bal_2 + r_3$	$s_3 \cdot bal_3 + r_4$	\dots	$s_{n-1} \cdot bal_{n-1} + r_n$	$s_n \cdot bal_n$

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- Publish some public keys as an anonymity set $\{pk_i\}$
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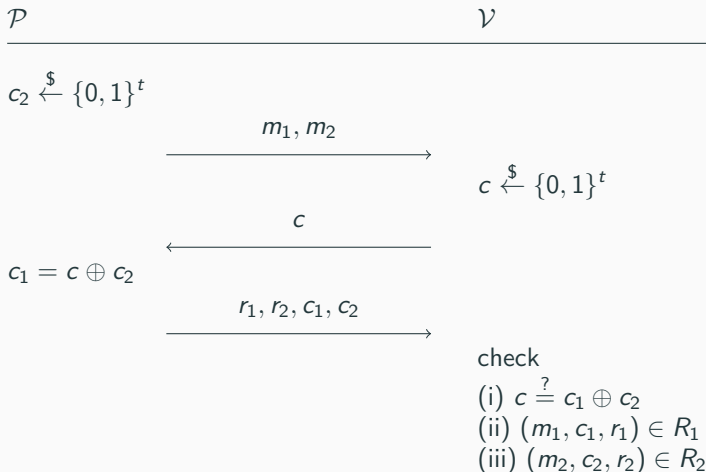
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$s(X) :$	s_1	s_2	s_3	\dots	s_{n-1}	s_n
$f_{\text{assets}}(X) :$	r_1	r_2	r_3	\dots	r_{n-1}	r_n
	$s_1 \cdot bal_1 + r_2$	$s_2 \cdot bal_2 + r_3$	$s_3 \cdot bal_3 + r_4$	\dots	$s_{n-1} \cdot bal_{n-1} + r_n$	$s_n \cdot bal_n$

How to construct such a selector polynomial in ZK?

Disjunctive Σ -Protocol (OR Proof)

OR Proof

Prove the claiming statement is R_1 or R_2 without telling which case it is.



Proof of Assets + OR Proof

A useful observation: the previous proof of assets has composite statements:

1. The selector s_i is 1 and prove the knowledge of the corresponding private key
 - $g_{\text{bls}}^{s_i} = g_{\text{bls}}^1$ (in bls12-381)
 - the knowledge of sk_i (in secp256k1)
2. the selector s_i is 0
 - $g_{\text{bls}}^{s_i} = g_{\text{bls}}^0$ (in bls12-381)

²See Section B of the paper.

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2. the selector s_i is 0
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Can we open the commitment to the evaluation without revealing the evaluation itself?

²See Section B of the paper.

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PCS Extension

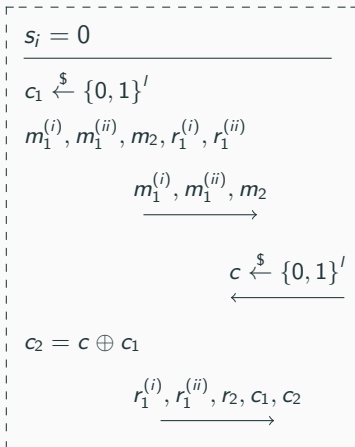
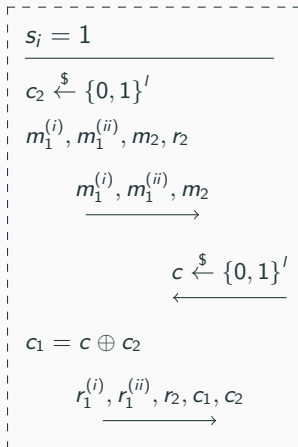
Open the committed evaluation g_{bls}^x ².

²See Section B of the paper.

Proof of Assets + OR Proof

\mathcal{P}

\mathcal{V}



check $(m_1^{(i)}, r_1^{(i)}, c_1), (m_1^{(ii)}, r_1^{(ii)}, c_1),$
 (m_2, r_2, c_2)

Full Protocol of Proof of Assets

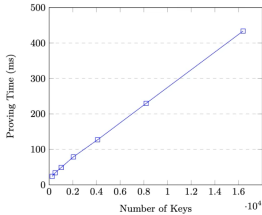
1. Bootstrapping (pre-computing)
 - 1.1 Interpolate selector polynomial $s(X)$
 - 1.2 Open the evaluations of $s(X)$
 - 1.3 Prove each evaluation is valid (the OR proof)
2. Interpolate the balance polynomial $b(X)$
3. Construct the accumulative polynomial $f_{\text{assets}}(X)$
4. Prove the polynomial constraints (accumulate assets) are correct

Proof of Solvency

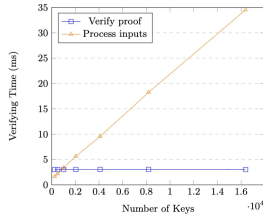
- Run the Proof of Liabilities to output $f_{\text{liab}}(X)$
- Run the Proof of Assets to output $f_{\text{assets}}(X)$
- Open the evaluations of $f_{\text{liab}}(0)$ and $f_{\text{assets}}(0)$ and compute $\Delta = f_{\text{assets}}(0) - f_{\text{liab}}(0)$
- Prove $\Delta \geq 0$ using the range proof

Benchmark Performance

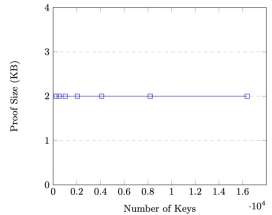
Proof of assets



(a)

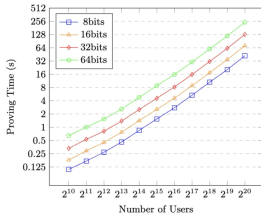


(b)

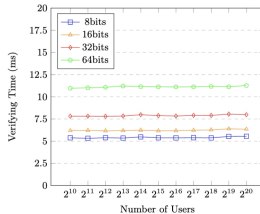


(c)

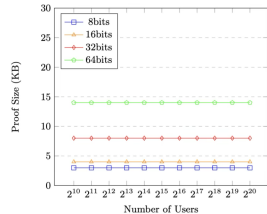
Proof of liability



(a)



(b)



(c)

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Conclusion

- This work is an almost succinct proof of solvency
- It is practical to be deployed for the real-world exchanges, implemented in Rust
(<https://github.com/Shvier/proof-of-solvency>)
- Future work
 - Multivariate polynomial for better performance
 - Incremental update (folding schemes)
 - Shorter range proof (lookup arguments)

State of the Art in ZKP

- Applications
 - In blockchain: zkRollup, zkBridge, zkEVM
 - In other fields: fight disinformation ³
- Limitations
 - Cost
 - Performance
 - Complexity
- Further reading
 - ZK MOOC
 - Vitalik's Blog
 - A Graduate Course in Applied Cryptography

³<https://rdi.berkeley.edu/zk-learning/assets/Lecture2-2023.pdf>