

# Bulletproof Protocol for Set (Non)membership Proofs

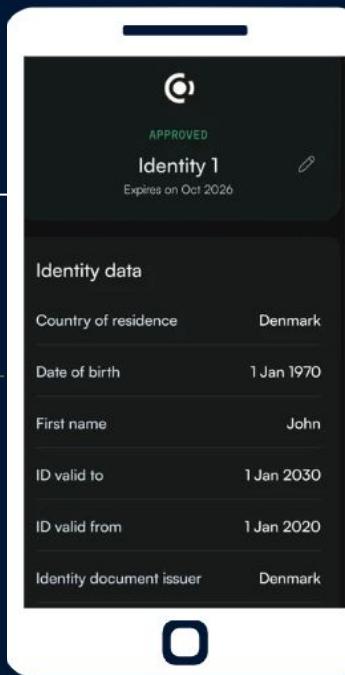
Security and Implementation  
Considerations

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# Background

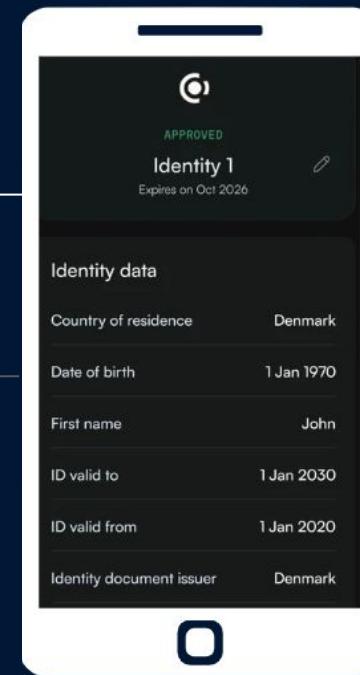
Bulletproof Protocol

Set (Non)membership  
Proofs



Example

# Background



Example

Bulletproof Protocol

Set (Non)membership  
Proofs

Goal:

Range proofs

Goal:

Prove that a public value  $v$  is  
in a public set  $S$

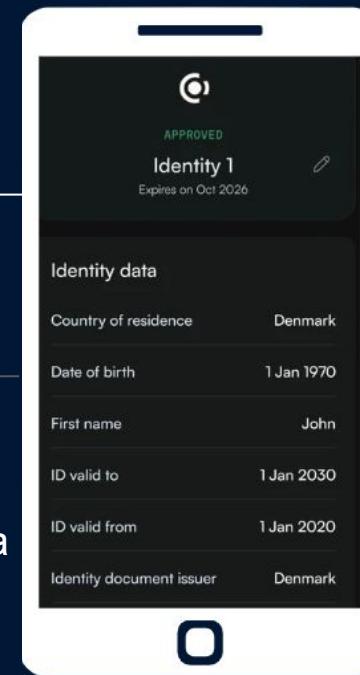
$$v \in S$$

Prove that a value  $v$  is NOT  
in a public set  $S$

$$v \notin S$$

Age check example: Prove  
that you are older than 18  
years.

# Background



Bulletproof Protocol

Goal:

Range proofs

Age check example: Prove that you are older than 18 years.

Set (Non)membership Proofs

Goal:

Prove that a public value  $v$  is in a public set  $S$

$$v \in S$$

Prove that a value  $v$  is NOT in a public set  $S$

$$v \notin S$$

Zero-Knowledge Set/Not-Set Membership Proofs

Goal:

Prove that a secret value  $v$  is or is NOT in a public set  $S$

European election example:

Prove that you are European citizen.

$v = "DK"$  and  $S = \{"DE", "DK", "UK", \dots\}$

Example

# When to Use Which Protocol: A 3-Category Guide

The efficiency of the proof depends on  $|S|$ .

Small S

Sigma Protocol + OR  
adapter

( $v = 1$ ) OR ( $v = 2$ )

Medium S

Bulletproof Protocol

Example:

Citizenship/Nationality  
proofs (with a set of about  
200 possible countries).

Large S

- Curve trees
- Incremental merkle  
trees (nullifiers) e.g.  
Tornado cash
- Sparse merkle trees  
(for (non)membership  
proofs)

Example

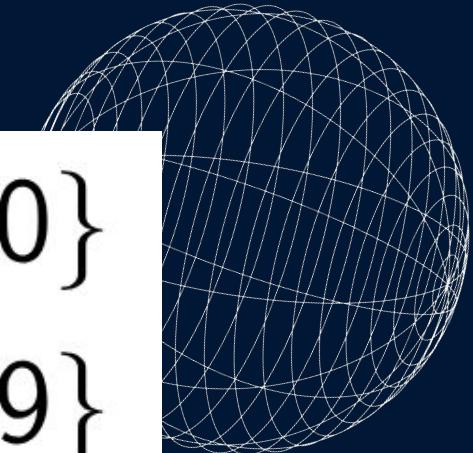


# Set (Non)membership Proof

Everything is a number going forward  
("DK" becomes "0x444b")

$$11 \in \{1, 2, \dots, 20\}$$

$$5 \notin \{1, 42, 9999\}$$



# Hadamard Product : Math Notation I

The diagram illustrates the Hadamard product of two vectors  $\mathbf{a}$  and  $\mathbf{b}$ . Two orange arrows point from the text "Vectors" to the vectors  $\mathbf{a}$  and  $\mathbf{b}$  respectively. Below them, another orange arrow points to the expression  $\mathbf{a} \circ \mathbf{b}$ , which is highlighted with a yellow rectangular box.

$$\mathbf{a} \circ \mathbf{b} = \begin{pmatrix} a_1 b_1 \\ a_2 b_2 \\ \vdots \\ a_n b_n \end{pmatrix} \in \mathbb{F}_q^n$$
$$\begin{pmatrix} 2 \\ 5 \\ 7 \end{pmatrix} \circ \begin{pmatrix} 3 \\ 4 \\ 6 \end{pmatrix} = \begin{pmatrix} 2 \cdot 3 \\ 5 \cdot 4 \\ 7 \cdot 6 \end{pmatrix} = \begin{pmatrix} 6 \\ 20 \\ 42 \end{pmatrix}$$

## Inner Product : Math Notation II

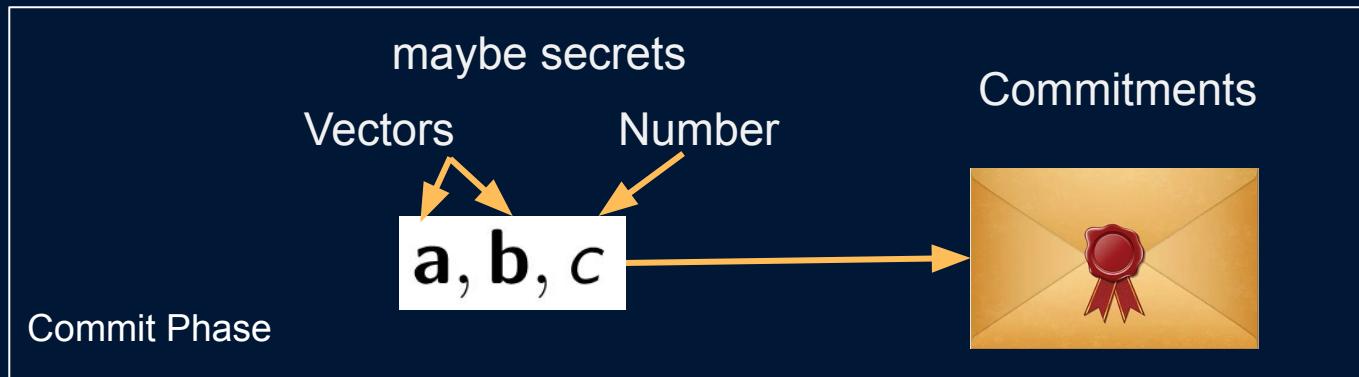
Vectors      Sum      Number

$$\langle \mathbf{a}, \mathbf{b} \rangle = \sum_{i=1}^n a_i b_i = c \in \mathbb{F}_q^n$$

$$\left\langle \begin{pmatrix} 2 \\ 5 \\ 7 \end{pmatrix}, \begin{pmatrix} 3 \\ 4 \\ 6 \end{pmatrix} \right\rangle = 2 \cdot 3 + 5 \cdot 4 + 7 \cdot 6 = 68 \pmod{q}$$

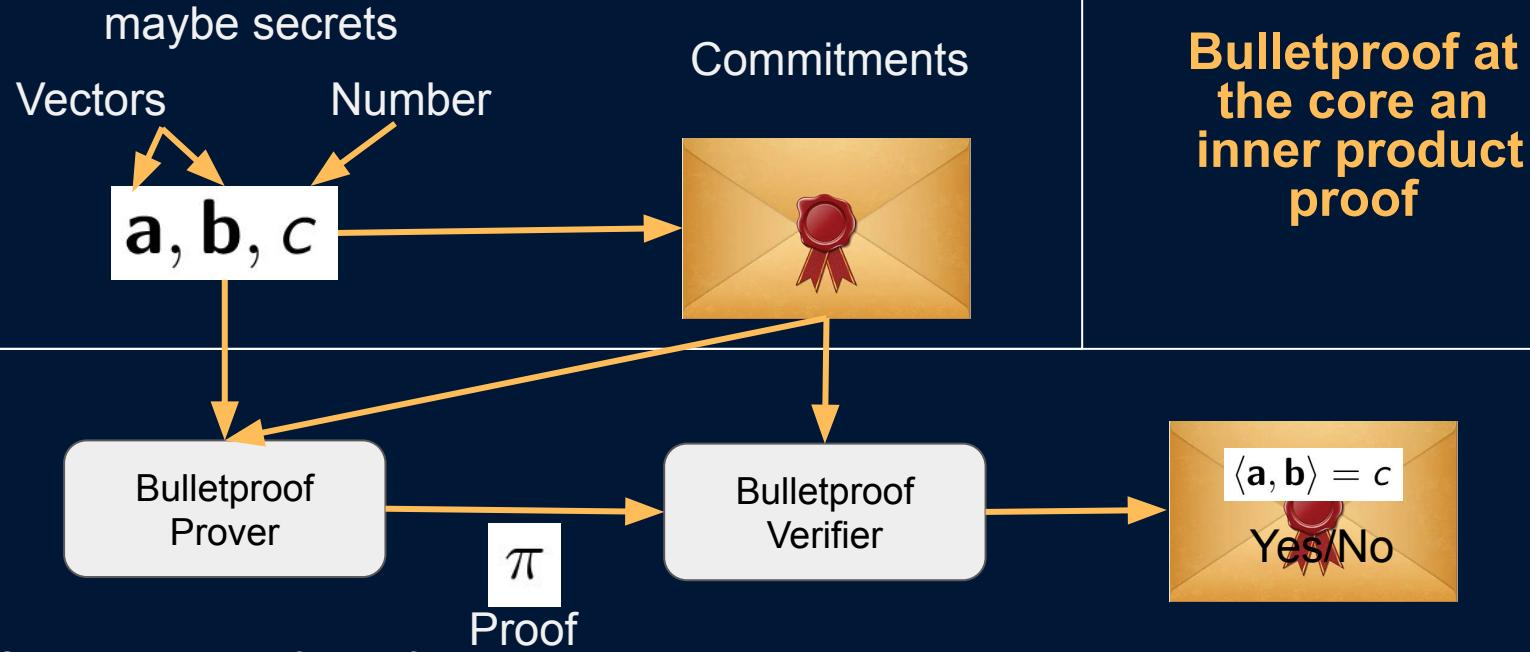


# Core Bulletproof Protocol





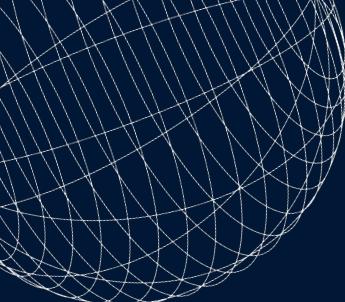
# Core Bulletproof Protocol



# Plan

- 1) Express the set (non)membership constraints with the inner product equation
- 2) Keep the input vectors secret (adding blinding factors to the commitments)
- 3) Plug into the Bulletproof protocol
- 4) Implement non-interactive version of protocol (applying Fiat-Shamir transformation)





# Set Membership Converter

Goal:

$$v \in S \iff \langle \mathbf{a}, \mathbf{b} \rangle = c$$

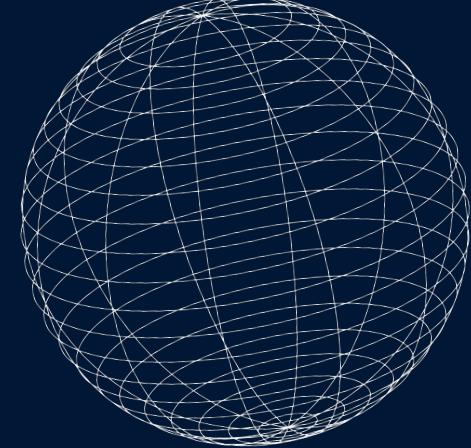
Express the set (non)membership problem using two vectors and a scalar number such that they satisfy a inner-product relation.

# Set Membership Converter

Start:

$$v \in S = \{s_1, s_2, \dots, s_n\} \quad v = s_i$$

I know that  $v \in S$



Vectorize:

$$\mathbf{s} = \begin{pmatrix} s_1 \\ s_2 \\ \vdots \\ s_n \end{pmatrix} \quad \mathbf{a}_L = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$$

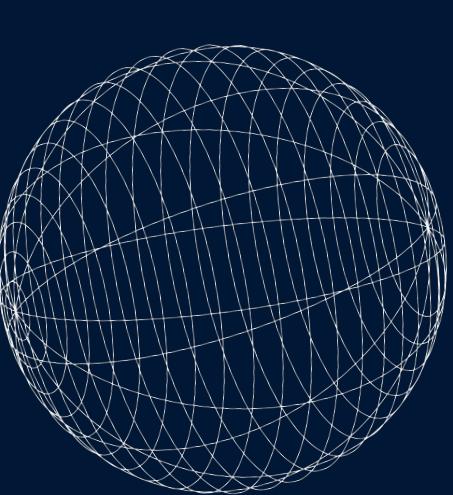
at position i

secret

public

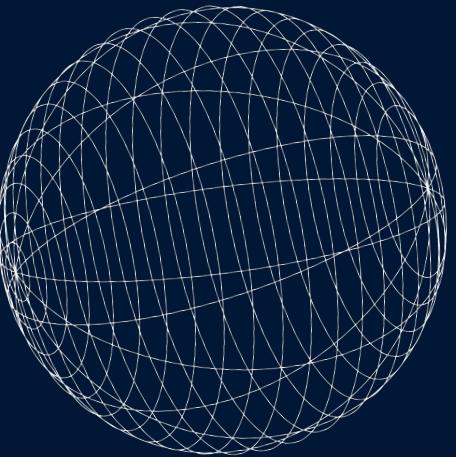
$$\langle \mathbf{s}, \mathbf{a}_L \rangle = v$$

I know the index  $i$  such that  $v = s_i$



# Set Membership Converter

$$\mathbf{a}_L = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$$



## Set Membership Converter

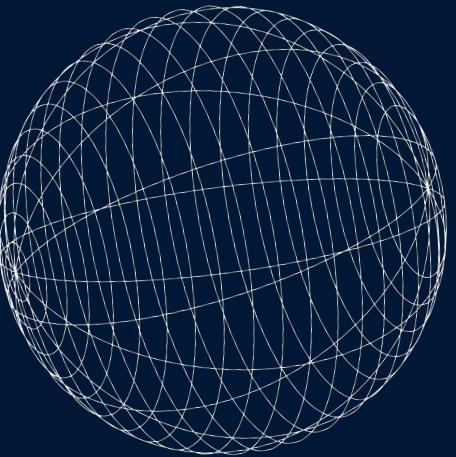
For the consistency checks of  $a_L$ ,

define  $a_R$  ( $a_L$  shifted by 1)

$$\mathbf{a}_R := \mathbf{a}_L - 1$$

$$\mathbf{a}_L = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$$

$$\mathbf{a}_R = \begin{pmatrix} -1 \\ \vdots \\ 0 \\ \vdots \\ -1 \end{pmatrix}$$



## Set Membership Converter

For the consistency checks of  $a_L$ ,

define  $a_R$  ( $a_L$  shifted by 1)

$$\mathbf{a}_R := \mathbf{a}_L - 1$$

Constrain:  $a_L$  (Zero vector with exactly one 1)

$$(\mathbf{a}_L - 1) - \mathbf{a}_R = \mathbf{0} \quad (a_R \text{ is really } a_L - 1)$$

$$\mathbf{a}_R \circ \mathbf{a}_L = \mathbf{0} \quad (\text{one of the vector elements must be zero for each position})$$

$$\langle \mathbf{a}_L, \mathbf{1} \rangle = 1 \quad (a_L \text{ has exactly one 1})$$

$$\mathbf{a}_L = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$$

$$\mathbf{a}_R = \begin{pmatrix} -1 \\ \vdots \\ 0 \\ \vdots \\ -1 \end{pmatrix}$$

# Nonmembership Converter

$v \notin S = \{s_1, \dots, s_n\}$  (I know  $v$  is not in  $S$ )



$\forall i \quad v \neq s_i$  (I know  $v$  is not equal to any  $s_i$ )



$\forall i \quad v - s_i \neq 0$  (I know each difference  $v - s_i$  is not zero)



property of a finite field

$\forall i \exists a_i \quad a_i(v - s_i) = 1$  (I know the multiplicative inverse of  $v - s_i$ )



Public Set

## Nonmembership Converter

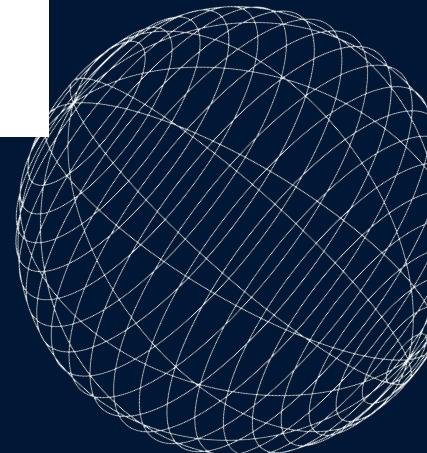
Secret v

Multiplicative  
inverse  
elements

$$\mathbf{s} = \begin{pmatrix} s_1 \\ s_2 \\ \vdots \\ s_n \end{pmatrix}$$

$$\mathbf{a}_L = \begin{pmatrix} a_1 \\ a_2 \\ \vdots \\ a_n \end{pmatrix}$$

$$\mathbf{a}_R = \begin{pmatrix} v \\ \vdots \\ v \\ \vdots \\ v \end{pmatrix}$$



Public Set

## Nonmembership Converter

Secret v

Multiplicative  
inverse  
elements

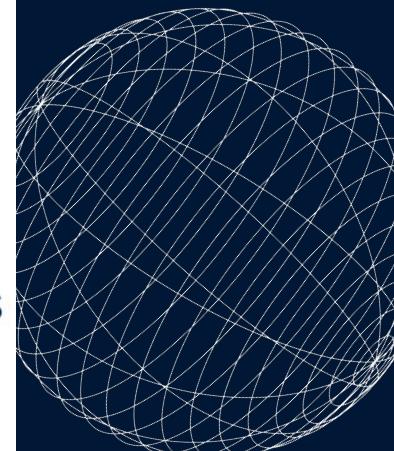
$$\mathbf{s} = \begin{pmatrix} s_1 \\ s_2 \\ \vdots \\ s_n \end{pmatrix}$$

$$\mathbf{a}_L = \begin{pmatrix} a_1 \\ a_2 \\ \vdots \\ a_n \end{pmatrix}$$

$$\mathbf{a}_R = \begin{pmatrix} v \\ \vdots \\ v \\ \vdots \\ v \end{pmatrix}$$

$$\mathbf{a}_R = v \cdot \mathbf{1} \quad (\mathbf{a}_R \text{ encodes the value } v)$$

$$\mathbf{a}_L \circ (\mathbf{a}_R - \mathbf{s}) = \mathbf{1} \quad (\text{a multiplicative inverse exists})$$
$$\iff v - s_i \neq 0$$
$$\iff v \notin S)$$



# Must-Have Security Checks

- Vector constraints (especially checking ‘special’ zero-one vectors)
- All “secret” vectors are blinded.
- All serializable types (commitments, proofs, context, audit records, ...) include explicit version fields (e.g., V1, V2).
  - Avoids replay across protocol upgrades
- Randomness/ blinding factors:
  - Generate fresh, uniformly random values (Merlin transcript randomness)
  - No-reuse of blinding factors
- Fiat-Shamir Transformation (Merlin transcript):
  - Add all values that until this point have been part of the transcript
  - Add public/contextual inputs (generators, keys, ... )
  - Add variable-length data with its length prefixed
  - Add domain separation

$$\mathbf{a}_L = \begin{pmatrix} 0 \\ \vdots \\ 1 \\ \vdots \\ 0 \end{pmatrix}$$



# Security Considerations & Pitfalls in ZK Proof Systems

Most academic descriptions define the ZK protocol **interactively**.



Fiat-Shamir  
Transformation/Heuristic

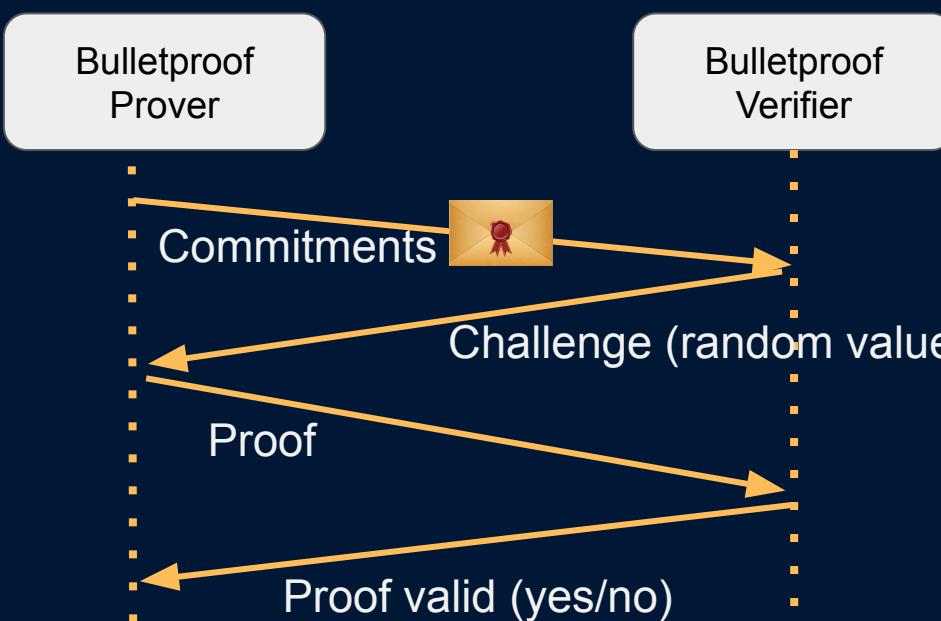
Engineers must transform it into a secure **non-interactive** proof,  
typically via Fiat–Shamir.

This transformation is subtle and frequently a source of mistakes.



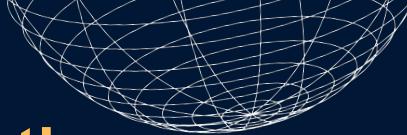
# Fiat-Shamir Transformation/Heuristic

interactive



non-interactive

```
// Initialize hash function/transcript  
// with a domain separator  
T = Transcript("Domain")  
  
// All public/contextual information  
// (keys, curve generator points, ...) and  
// all messages in the proof transcript  
// until this point.  
T.append("Label1", exchanged_value1)  
T.append("Label2", exchanged_value2)  
  
// Fiat–Shamir challenge =  
// hash of the entire transcript  
Challenge = Hash(T)
```



# Fiat-Shamir Transformation/Heuristic

non-interactive

```
// Initialize hash function/transcript  
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Challenge = Hash(T)
```

What can go wrong:

“Failed to include all values exchanged between the prover and verifier up to this point.”



# Fiat-Shamir Transformation/Heuristic

What can go wrong:

“Appending variable-length types such as `String`, `Vectors`, `Sets`, `Maps`, or other collections.

Naively appending the bytes (without including the length of the collection) can produce collisions

Example:

$\text{Hash}(\text{"AA"}, \text{"BB"}) = \text{Hash}(\text{"AABB"}) = \text{Hash}(\text{"A"}, \text{"ABB"})$

Better:

$\text{Hash}(\text{"2"}, \text{"AA"}, \text{"2"}, \text{"BB"}) \neq \text{Hash}(\text{"1"}, \text{"A"}, \text{"3"}, \text{"ABB"})$

non-interactive

```
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# Fiat-Shamir Transformation/Heuristic

non-interactive

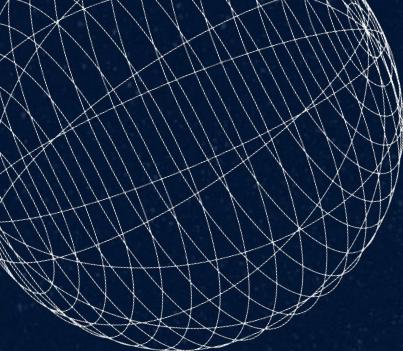
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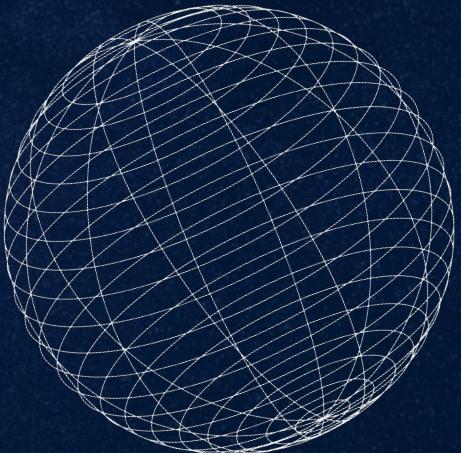
// Fiat–Shamir challenge =
// hash of the entire transcript
Challenge = Hash(T)
```

What can go wrong:

“Missing domains or labels”



# Thank you for listening



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# Fiat-Shamir Transformation/Heuristic

What can go wrong:

“Appending variable-length types such as `String`, `Vectors`, `Sets`, `Maps`, or other collections. Naively appending the bytes (without including the length of the collection) can produce collisions

```
let items = vec!["AA", "BB", "CC"];
T.append_u64("items_len", items.len() as u64);
for (i, item) in items.iter().enumerate() {
    T.append(format!("{}"), item.as_bytes());
}
```

non-interactive

```
// Initialize hash function/transcript
// with a domain separator
T = Transcript("Domain")

// Add all prover→verifier and
// verifier→prover messages
T.append("Label1", exchanged_value1)
T.append("Label2", exchanged_value2)

// Fiat–Shamir challenge =
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Challenge = Hash(T)
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