

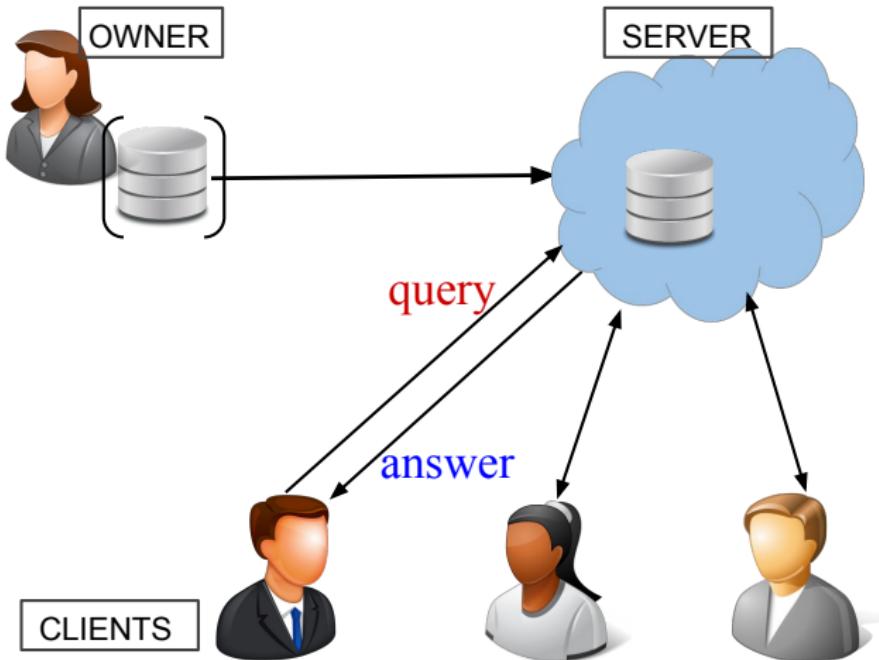
# Zero Knowledge Accumulators and Set Operations

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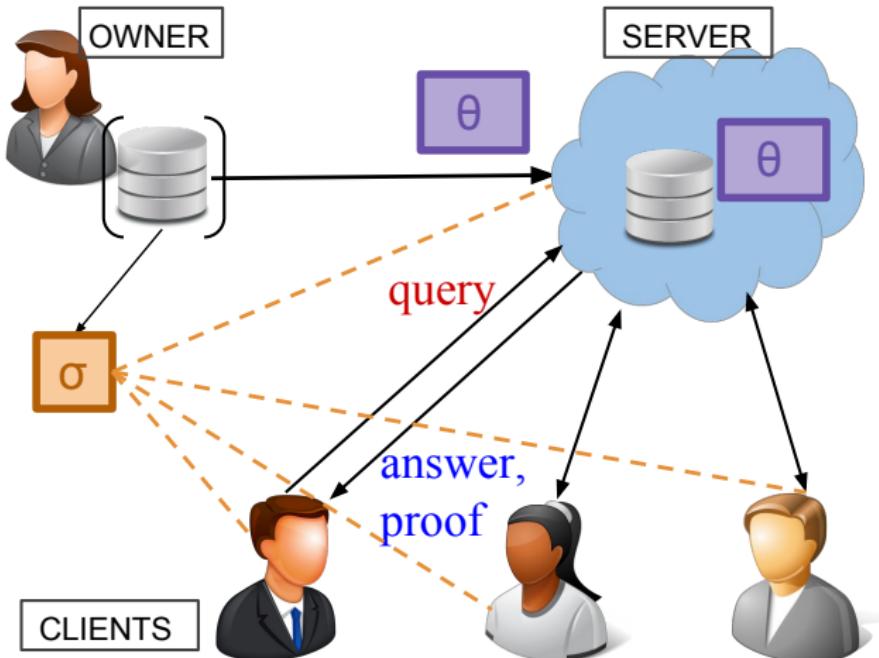
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Research supported in part by the US National Science Foundation

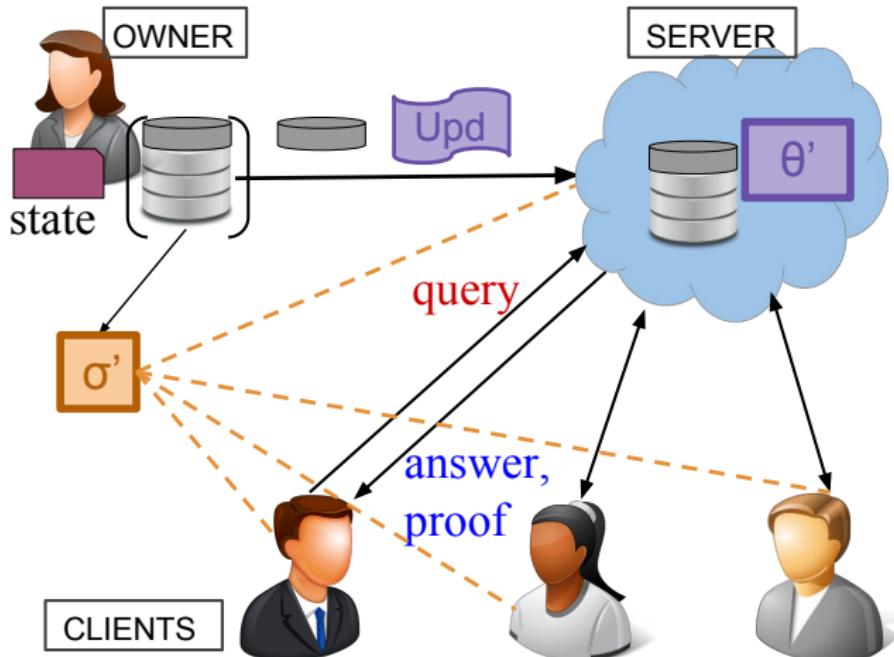
# Data Outsourcing



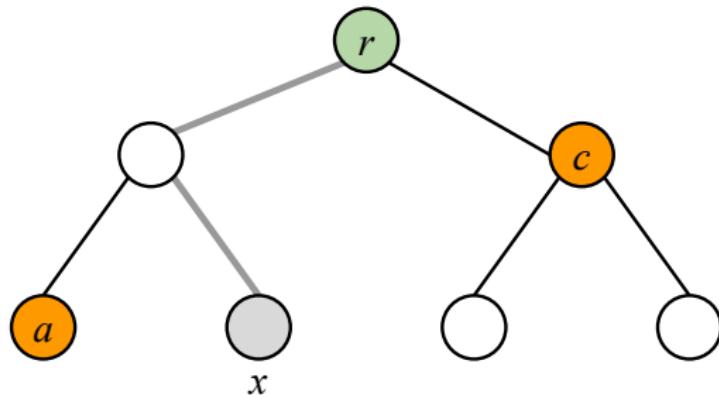
## Verifiable data outsourcing (static)



# Verifiable data outsourcing (dynamic)



## Challenge: Proof Leaking Information



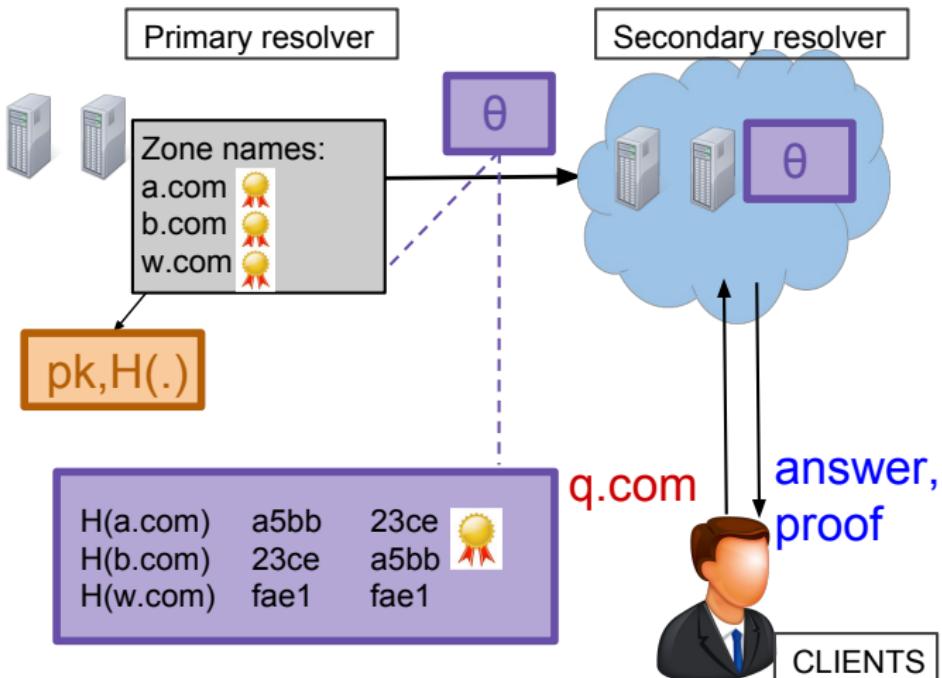
Merkle tree with items stored in sorted order at the leaves.

Proof of  $x$ :  $((a, L), (b, R))$ .

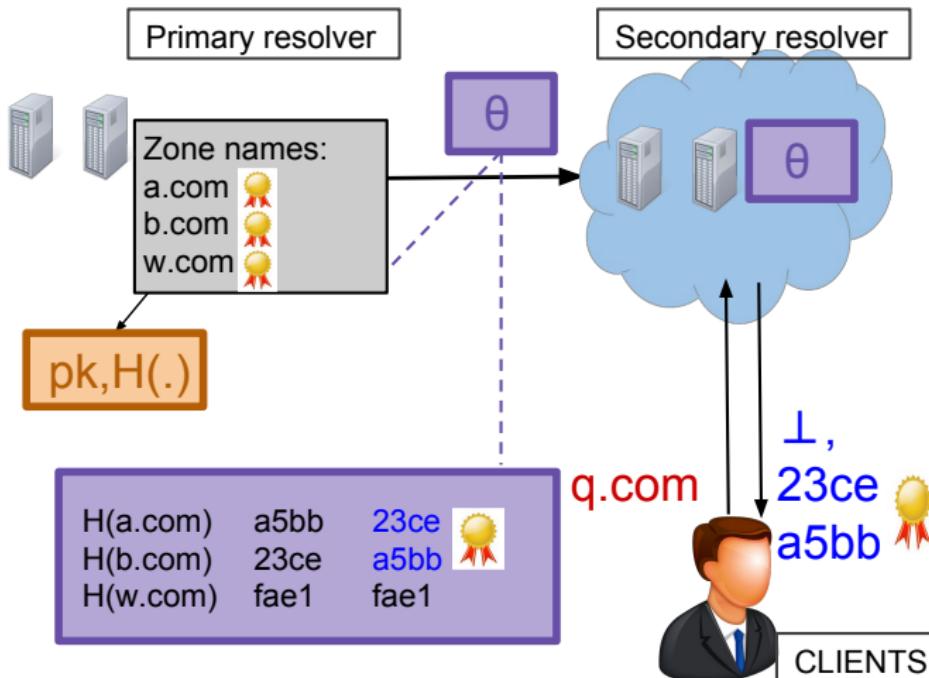
Verification:  $h(h(a, h(x), c) = r$

Proof leaks rank of item.

# Zone enumeration attack



# Zone enumeration attack



## Cryptographic accumulator [Benaloh and del Mare93]

$\sigma \leftarrow \text{acc}(\text{Set}\mathcal{X})$ .

Efficient and succinct proof for  $x \in \mathcal{X}, x \notin \mathcal{X}$ .

Proofs are publicly computable and verifiable.

Soundness: Forging proof for an element is infeasible.

Traditional proofs are leaky.

## In this work

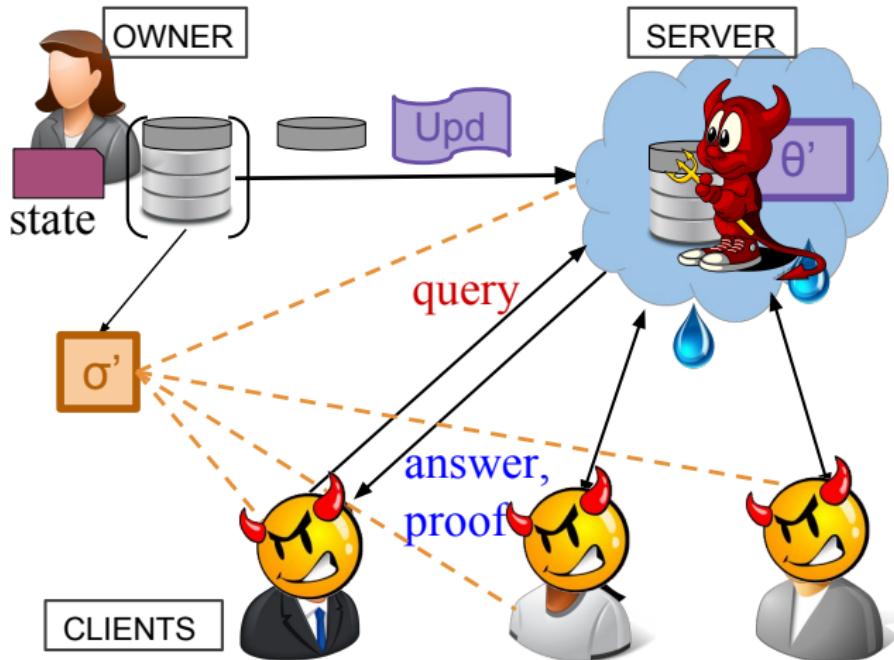
Formal model for zero-knowledge universal dynamic accumulators.

Efficient construction for zero-knowledge accumulators.

Efficient construction for :

1. is-subset
2. difference
3. union
4. intersection

# Our Model



# Soundness

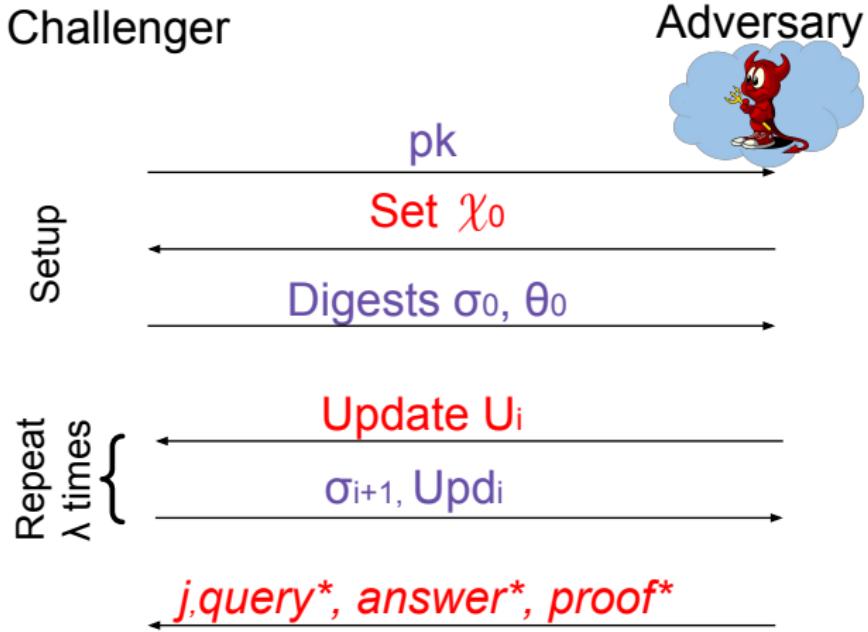


Figure: Probability that Verify accepts but  $answer^*$  is not correct wrt  $query^*$  on  $\mathcal{X}_j$  is negligible

# Zero-Knowledge

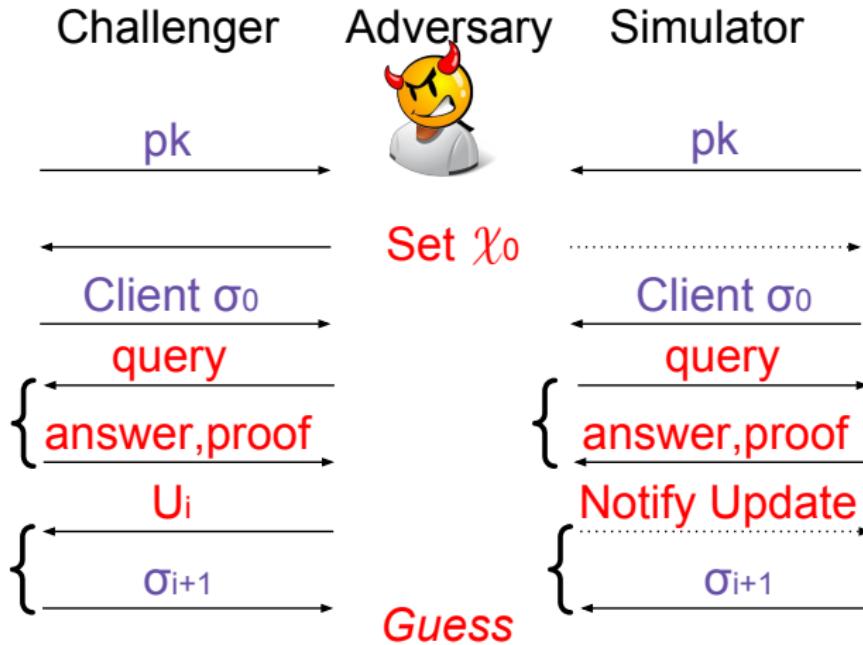


Figure: Probability that Adversary guesses correctly if it is talking to a challenger or a simulator is negligible

# Zero Knowledge Accumulator

# Query

$\mathcal{X} = \{x_1, \dots, x_N\}$  = set of elements

*Client Query:* Is element  $x \in \mathcal{X}$ ?

*Server Response:* answer = 1 indication yes and answer = 0 indicating no + proof

# Set Representation

A set  $\mathcal{X} = \{x_1, \dots, x_N\}$  represented using its **characteristic polynomial**  $\text{Ch}_{\mathcal{X}}[z] = \prod_{i=1}^N (z + x_i)$

Bilinear Map:

- $\lambda \in \mathbb{N}$  is the security parameter of the scheme
- $G, G_1$  multiplicative cyclic groups of prime order  $p$
- $p$  is a large  $k$ -bit prime
- $g$  is a random generator of  $G$
- $e : G \times G \rightarrow G_1$  is computable bilinear nondegenerate map
- $e(g^a, g^b) = e(g, g)^{ab}.$

## Keygen and Setup (Owner)

$$(\text{sk}, \text{pk}) \leftarrow \text{KeyGen}(1^\lambda)$$

- Generate bilinear parameters  $\text{pub} = (p, G, G_1, e, g)$ .  
 $O(\text{poly}(\lambda))$
- Choose  $s \xleftarrow{\$} \mathbb{Z}_p^*$ .
- Set  $\text{sk} = s$  and  $\text{pk} = (g^s, \text{pub})$ .

$$(\sigma_0, \theta_0, \text{state}_0) \leftarrow \text{Setup}(\text{sk}, \mathcal{X}_0)$$

- Choose  $r \xleftarrow{\$} \mathbb{Z}_p^*$ .
- Set  $\sigma_0 = g^{r \cdot \text{Ch}_{\mathcal{X}}(s)}$ .  $O(N)$
- Set  $\theta_0 = (g, g^s, g^{s^2}, \dots, g^{s^N}, r)$ .  $O(N)$
- Set  $\text{state}_0 = \mathcal{X}$ .

## Query (Server)

$$(\text{answer}, \text{proof}) \leftarrow \text{PerformQuery}(\mathcal{X}_j, \theta_j, \text{query})$$

- if  $\text{query} = x \in \mathcal{X}$ :

set  $\text{answer} = 1$  and  $\text{proof} = (\sigma_j)^{\frac{1}{s+x}} = g^{\frac{r \cdot \text{Ch}_{\mathcal{X}}(s)}{(s+x)}}$ .  $O(N \log N)$

## Query (Server)

```
(answer, proof) ← PerformQuery( $\mathcal{X}_j, \theta_j, \text{query}$ )
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- if  $\text{query} = x \notin \mathcal{X}$ :

1. Using the Extended Euclidean algorithm, compute polynomials  $q_1[z], q_2[z]$  such that  $q_1[z]\text{Ch}_{\mathcal{X}}[z] + q_2[z](z + x) = 1$ .

$O(N \log^2 N \log \log N)$

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4. Set  $q'_2[z] = q_2[z] - \gamma \cdot \text{Ch}_{\mathcal{X}}[z]$ .
5. Set  $W_1 := g^{q'_1(s)r^{-1}}, W_2 = g^{q'_2(s)}$ .

## Query (Server)

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5. Set  $W_1 := g^{q'_1(s)r^{-1}}, W_2 = g^{q'_2(s)}$ .
6. Set proof :=  $(W_1, W_2)$  and answer = 0.

## Verification (Client)

```
(accept/reject) ← Verify(pk, σj, query, answer, proof)
```

- Let  $\text{query} = x$ .
- If  $\text{answer} = 1$ , return accept if  $e(\sigma_j, g) = e(\text{proof}, g^x \cdot \text{pk})$ .  
 $O(1)$
- if  $\text{answer} = 0$ , return accept if  
 $e(W_1, \sigma_j)e(W_2, g^x \cdot \text{pk}) = e(g, g)$ .  
 $O(1)$
- Return reject otherwise.

# Update

$$(\mathcal{X}_{i+1}, \sigma_{i+1}, \text{upd}_i, \text{state}_{i+1}) \leftarrow \text{Update}(\text{sk}, \text{state}_i, \sigma_i, \theta_i, \mathcal{X}_i, u_i)$$

Owner:

- Choose  $r' \xleftarrow{\$} \mathbb{Z}_p^*$ .
- If  $x$  is to be inserted:
  1. Compute  $\sigma_{i+1} = \sigma_i^{(s+x)r'}.$   $O(1)$
- If  $x$  is to be deleted:
  1. Compute  $\sigma_{i+1} = \sigma_i^{\frac{r'}{s+x}}.$   $O(1)$
- Set  $\text{upd}_i = (r')$  and  $\text{state}_{i+1} = \mathcal{X}_{i+1}.$

Server:

Store the inserted/deleted element and  $\text{upd}_i = (r').$   $O(1)$

# Privacy comes almost for free

	[Nguyen05 – No Privacy]	This work
Setup	NMUL	NMUL
Update	1MUL	2MUL
Witness (Member)	NMUL + ( $N - 1$ )ADD	NMUL + ( $N - 1$ )ADD
Witness (Non-Member)	NMUL + ( $N - 1$ )ADD	( $N + 1$ )MUL + ( $N - 1$ )ADD
Verify (Member)	1(MUL + ADD + PAIR)	1(MUL + ADD + PAIR)
Verify (Non-Member)	2(MUL + ADD + PAIR)	1(MUL + ADD + ADD <sub>1</sub> ) + 2PAIR
Witness Update (Member)	1(MUL + ADD)	2MUL + 1ADD
Witness Update (Non-Member)	2MUL + 1ADD	( $N + 1$ )MUL + ( $N - 1$ )ADD

Figure: ADD = point addition MUL = scalar multiplication in the elliptic curve group  $G$ , ADD<sub>1</sub> = point addition in  $G_1$  and PAIR a pairing computation, whereas  $N$  is the size of the set.

# Set Algebra : Union

# Query

$\{\mathcal{X}_1, \dots, \mathcal{X}_m\}$  = set collection

*Client Query:* Return union of sets 2, 5, 9

*Server Response:* answer =  $\mathcal{X}_2 \cup \mathcal{X}_5 \cup \mathcal{X}_9 + \text{proof}$

Let  $\mathcal{X}_2 = \{a, b, d\}$ ,  $\mathcal{X}_5 = \{d, f\}$ ,  $\mathcal{X}_9 = \{a, c\}$

answer =  $\{a, c, b, d, f\}$

## Completeness Conditions

**Superset condition:**  $\mathcal{X}_2 \subseteq \text{answer} \wedge \mathcal{X}_5 \subseteq \text{answer} \wedge \mathcal{X}_9 \subseteq \text{answer}$ .

*Technique:* Generalization of set membership.

**Membership condition:**  $\text{answer} \subseteq \tilde{U}$  where  $\tilde{U} = \mathcal{X}_2 \uplus \mathcal{X}_5 \uplus \mathcal{X}_9$ .

# Proving membership

Multiset union:  $\tilde{U} = \{a, a, c, c, b, d, d, f\}$

1. Compute

$$\sigma_{\tilde{U}} \leftarrow g^{(r_2 r_5 r_9) \text{Ch}_{\tilde{U}}(s)} = g^{(r_2 r_5 r_9)(s+a)^2(s+c)(s+b)(s+d)^2(s+f)}$$

## Proving membership

Multiset union:  $\tilde{U} = \{a, a, c, c, b, d, d, f\}$

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2. Prove  $\sigma_{\tilde{U}}$  is correctly computed

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2. Prove  $\sigma_{\tilde{U}}$  is correctly computed
3. Prove answer  $\subseteq \tilde{U}$  using  $\sigma_{\tilde{U}}$

## Step 2: Server

$$\sigma_9 = g^{r_9(s+a)(s+c)}$$

$$\sigma_2 = g^{r_2(s+a)(s+b)(s+d)}$$

$$\sigma_5 = g^{r_5(s+d)(s+f)}$$

## Step 2: Server

$$\sigma_{\tilde{U}} = g^{(r_2 r_5 r_9)(s+a)^2(s+c)(s+b)(s+d)^2(s+f)}$$

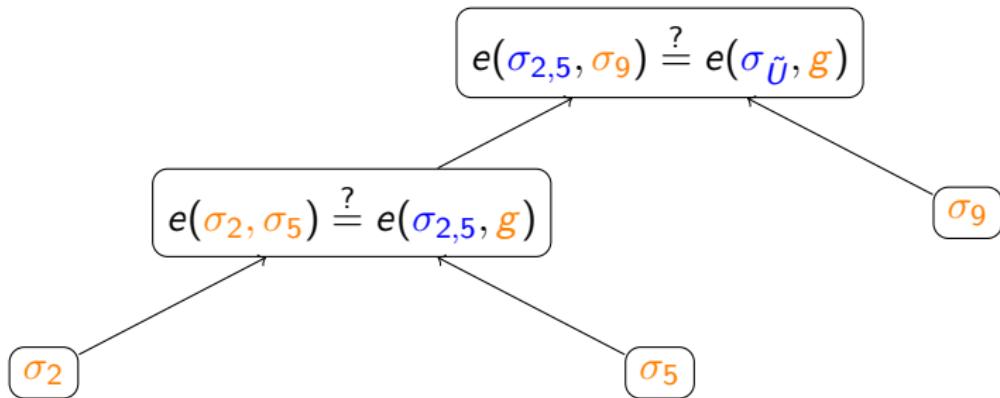
$$\sigma_{2,5} = g^{r_2 r_5 (s+a)(s+b)(s+d)^2(s+f)}$$

$$\sigma_9 = g^{r_9 (s+a)(s+c)}$$

$$\sigma_2 = g^{r_2 (s+a)(s+b)(s+d)}$$

$$\sigma_5 = g^{r_5 (s+d)(s+f)}$$

## Step 2: Client



## Step 3

**Server:**  $W_{(\text{answer}, \tilde{U})} \leftarrow g^{\frac{r_2 r_5 r_9 \text{Ch}_{\tilde{U}}(s)}{\text{Ch}_{\text{answer}}(s)}} = g^{r_2 r_5 r_9 (s+a)(s+d)}$

**Client:**  $e(W_{(\text{answer}, \tilde{U})}, g^{\text{Ch}_{\text{answer}}(s)}) \stackrel{?}{=} e(\sigma_{\tilde{U}}, g)$

## More in the paper:

1. Relation of Zero Knowledge Accumulator with the existing primitives (ZKS, PSR, Trapdoorless Acc).
2. Formal proof that Zero knowledge is stronger than indistinguishably notion [MLPP12, DHS15] of privacy.
3. First efficient construction for zero-knowledge verifiable set algebra queries (Is-subset, Intersection, Union, Difference) with no additional cost over the state-of-the art non-private construction [PTT11].

# Thank you!