

Malicious-Secure Structure-Aware Private Set Intersection



Gayathri Garimella



Mike Rosulek

Jaspal Singh

Private Set Intersection (PSI)

PKC [Mea86, CT10], OT_{ext} [PSZ14, PSSZ15, KKRT16, RR17, PRTY19, CM20, PRTY20], VOLE[RS21, RR22]...

Alice



input **A**

{p, r, i, v, a, t, e}

special case of two-party secure computation

Bob

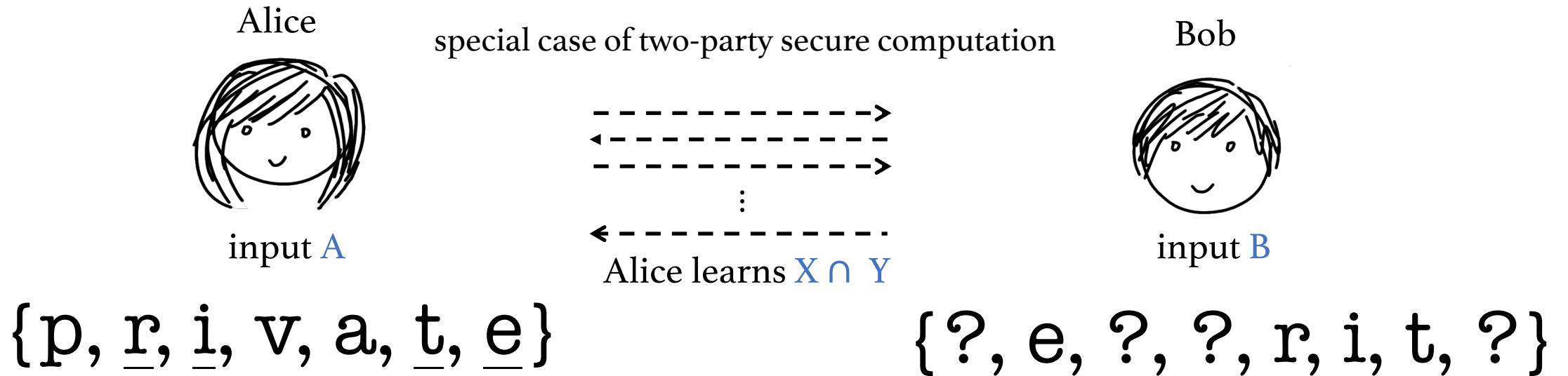


input **B**

{s, e, c, u, r, i, t, y}

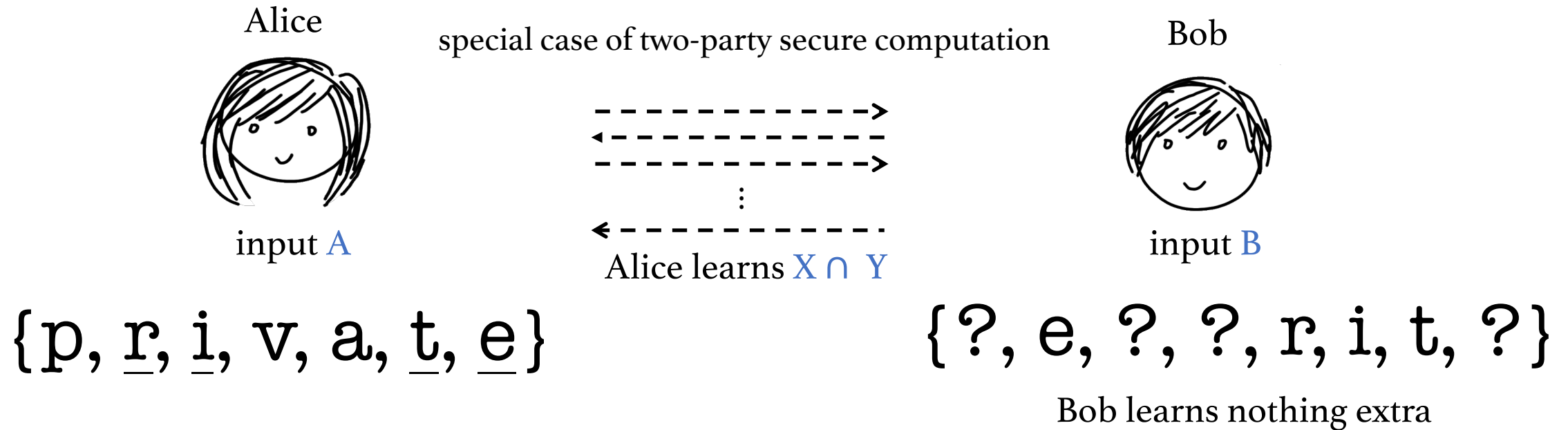
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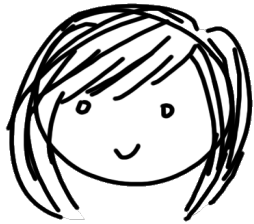
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structure-aware Private Set Intersection (sa-PSI)

a **variant** of PSI where Alice's input has a **publicly known structure**

Examples - interval, ball or union of balls in some metric space, ...



input **A**



input **B**

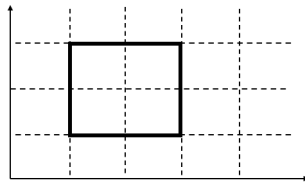
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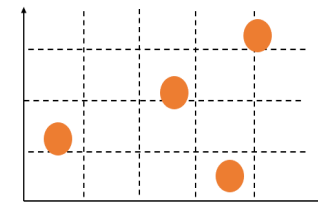
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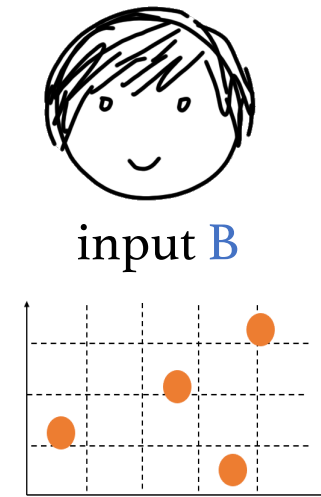
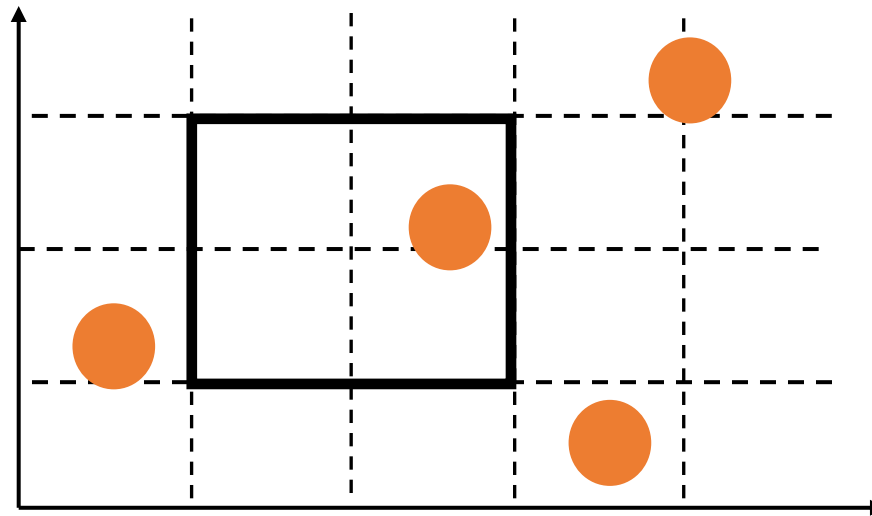
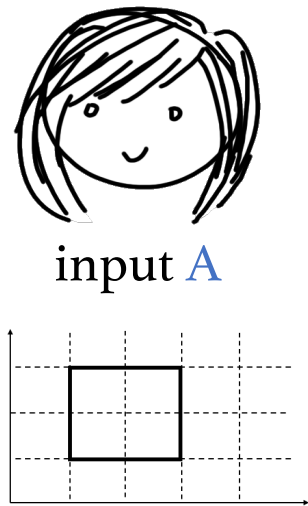
input B



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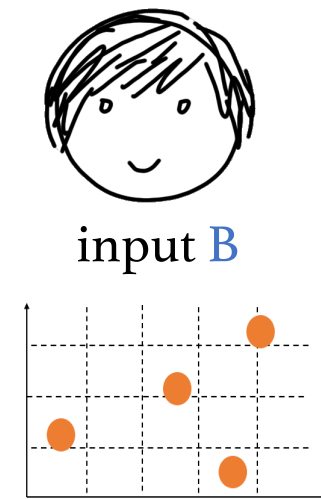
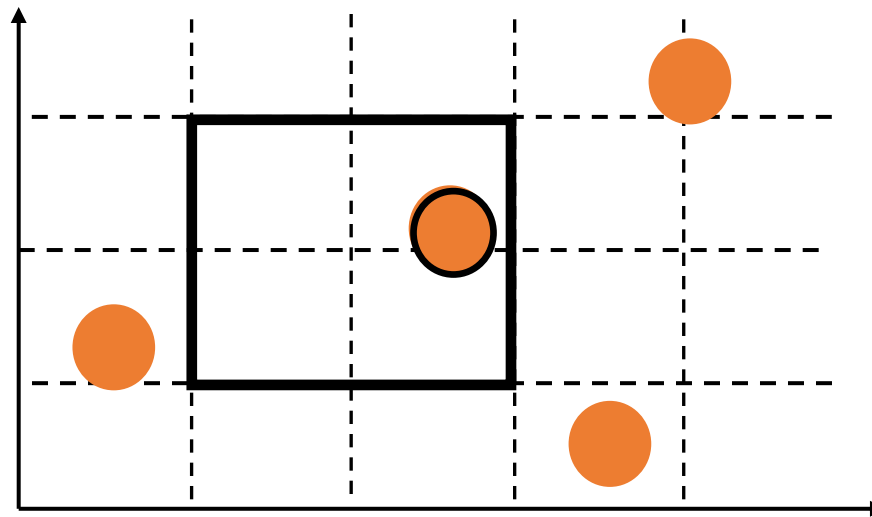
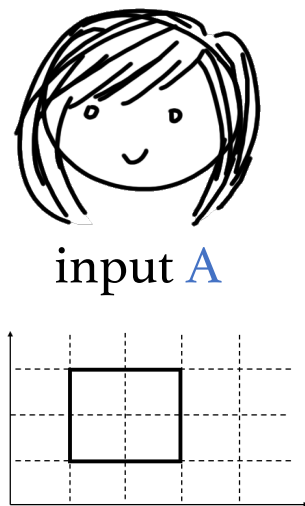
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structure-aware Private Set Intersection (sa-PSI)

a **variant** of PSI where Alice's input has a **publicly known structure**

Examples - interval, ball or union of balls in some metric space, ...



Alice learns $X \cap Y = \{\text{all points inside square}\}$



Motivating example

privacy-preserving ride hailing service



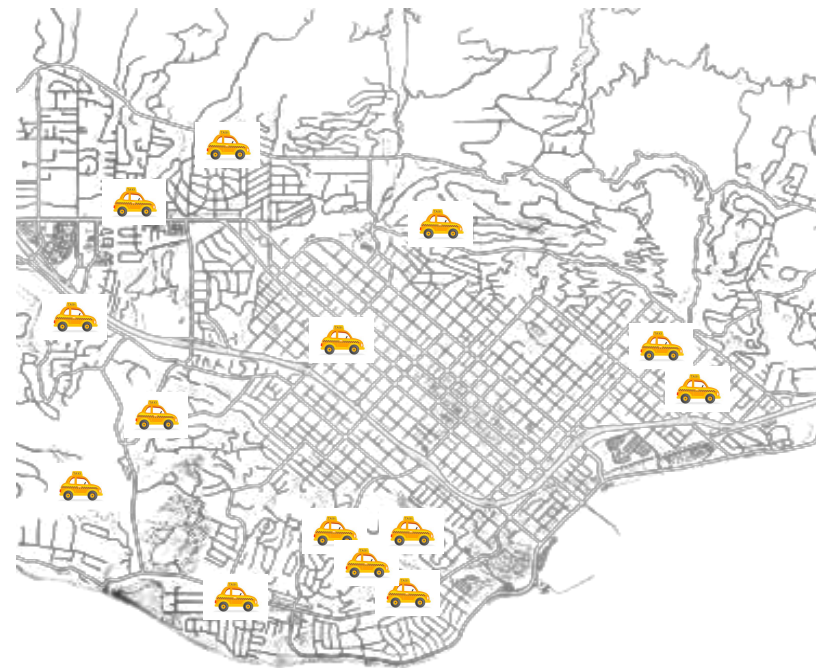
SANTA BARBARA

Motivating example

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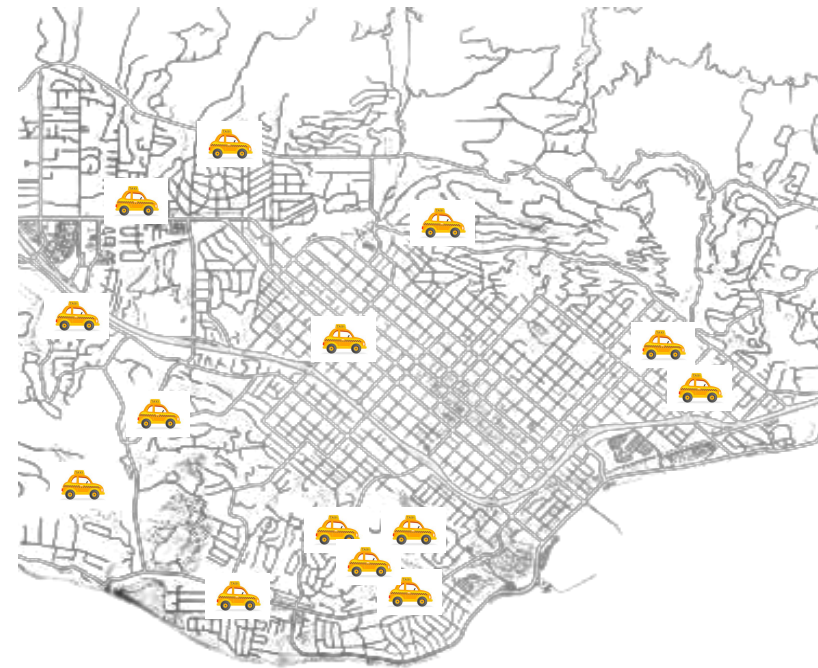
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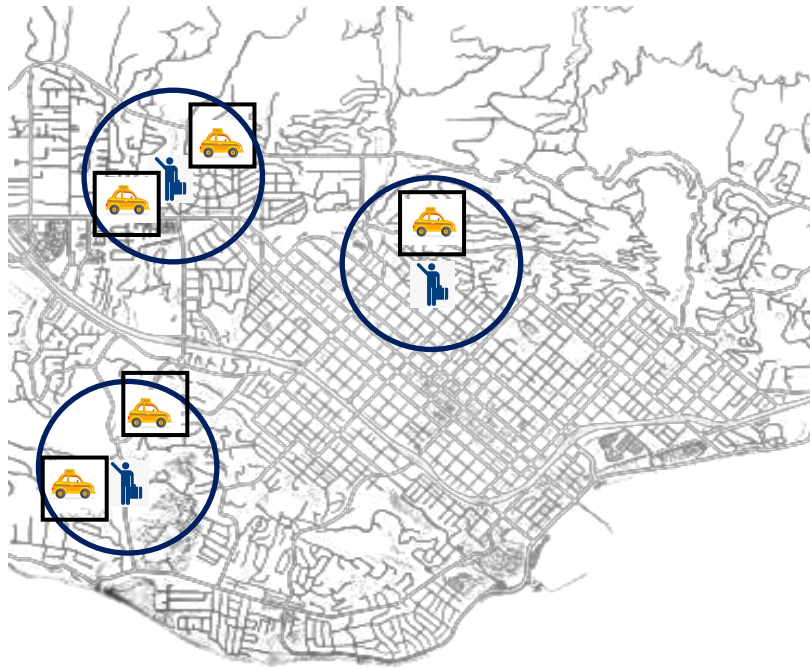
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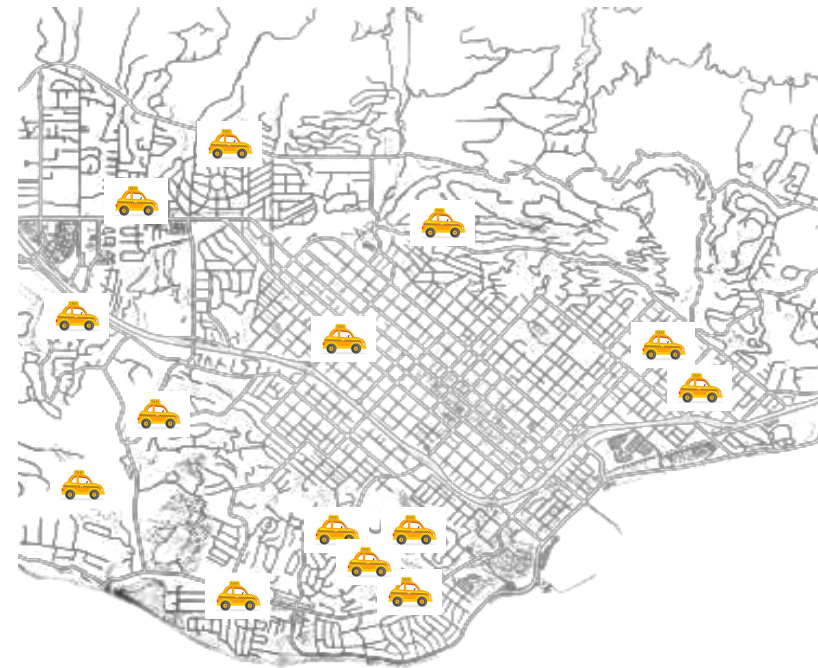
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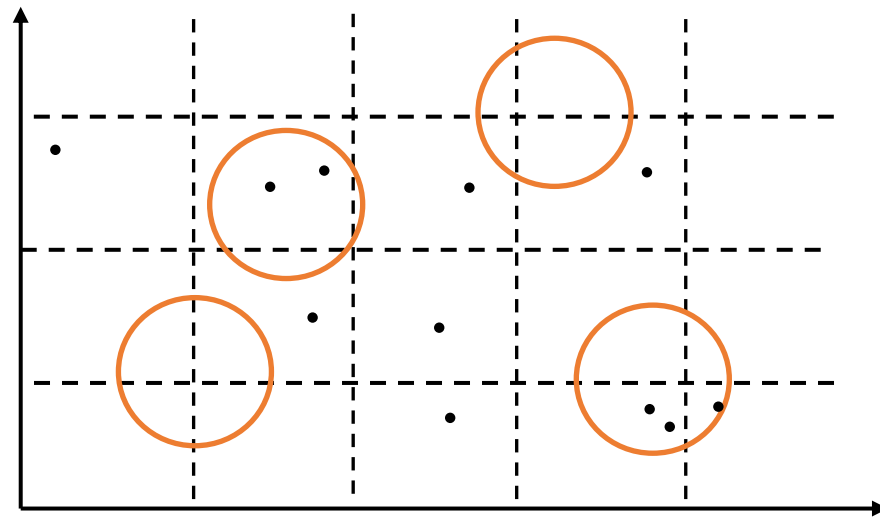
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Previous work

- Naïve solution: Alice's enumerates her structured input A and runs plain PSI
communication cost $O((|A| + |B|) \cdot \kappa)$

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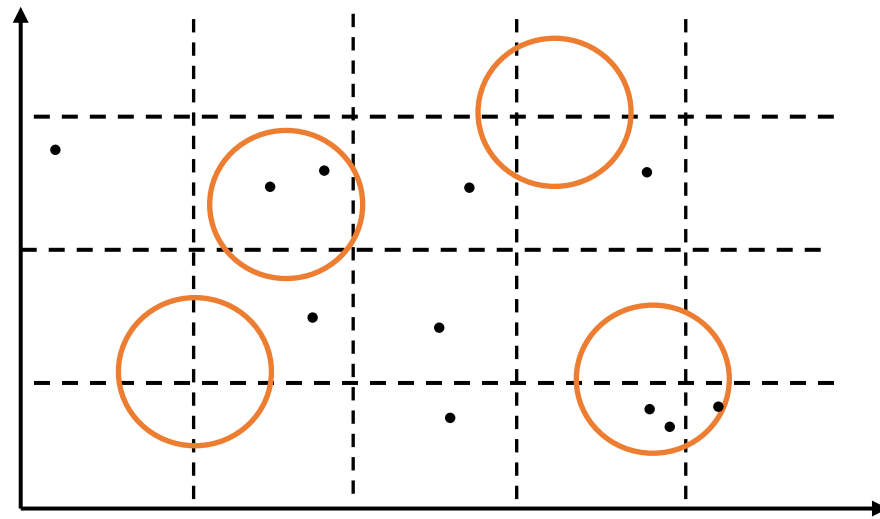
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communication scales with **total volume** $|A|$ of balls in Alice's input

Previous work

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instead, can communication scale with **# of balls** (description size) of Alice's input?

Previous work

- Naïve solution: Alice's enumerates her structured input A and runs plain PSI

communication cost $O((|A| + |B|) \cdot \kappa)$

- [GarimellaRosulekSingh'22]: If Alice's input A can be compactly represented by **boolean Function Secret Sharing** with share size σ , we get **semi-honest** structure-aware PSI

communication cost $O((\sigma + |B|) \cdot \kappa)$

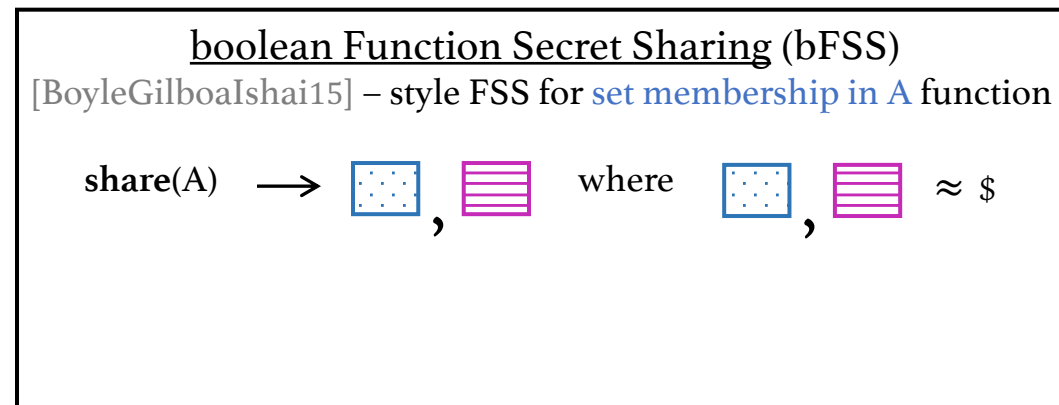
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boolean Function Secret Sharing (bFSS)
[BoyleGilboaIshai15] – style FSS for **set membership in A** function

share(A) \rightarrow   where   \approx $\$$

$x \in A \Rightarrow \text{ev}(\text{blue dotted square}, x) \oplus \text{ev}(\text{pink striped square}, x) = 0$

$x \notin A \Rightarrow \text{ev}(\text{blue dotted square}, x) \oplus \text{ev}(\text{pink striped square}, x) = 1$

Research Question

Can we design malicious-secure structure-aware PSI?

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Why is [GRS'22] not malicious-secure?

How can we fix this?

How does [GRS'22] work?

assumptions: OT-hybrid (Oblivious Transfer[Rabin81]), random oracle model

input **A**



1. generates κ instances of bFSS shares

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How does [GRS'22] work?

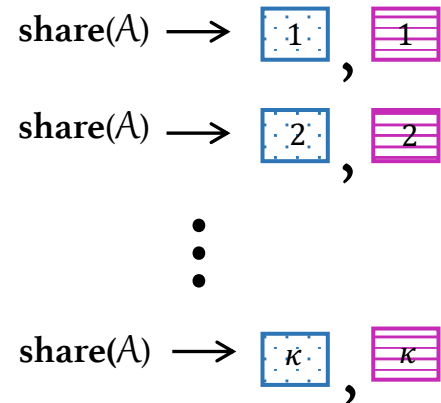
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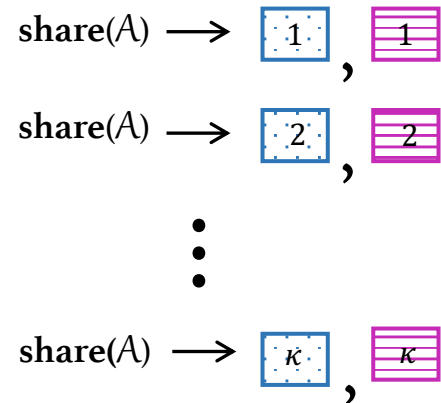


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2. picks κ choice bits to learn  or 



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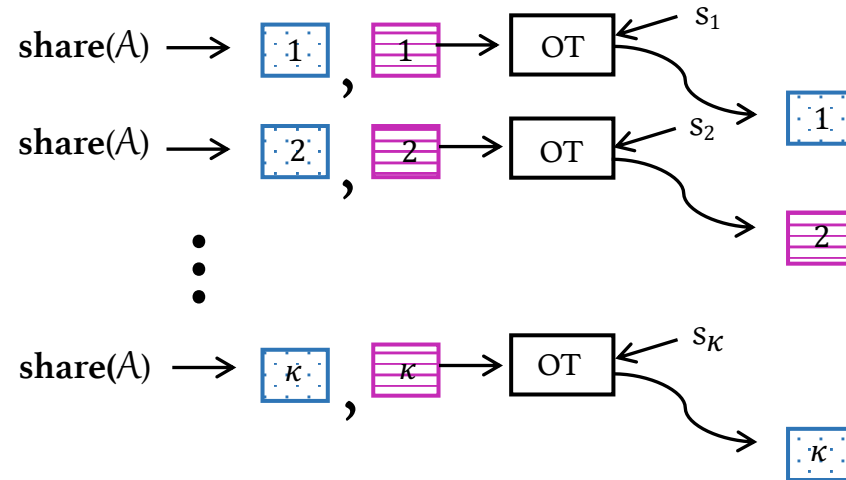


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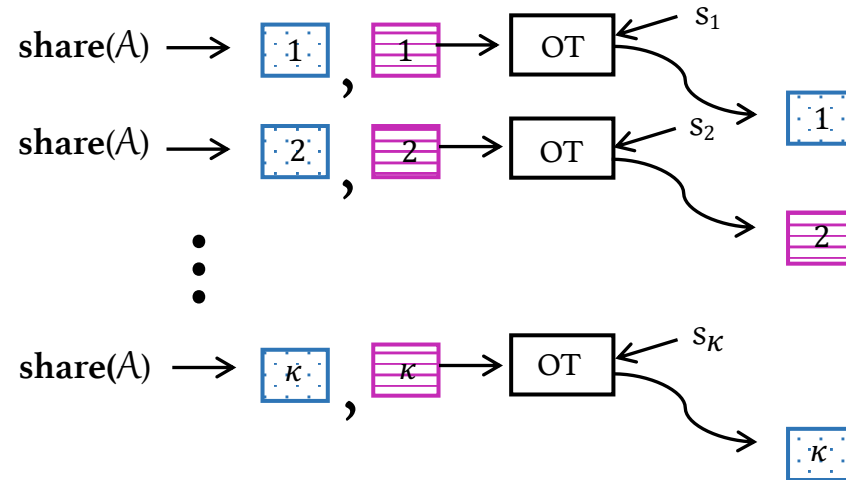


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$$F(x) = H(\text{ev}(\text{blue dotted box } 1, x) \parallel \text{ev}(\text{pink striped box } 2, x) \parallel \dots \parallel \text{ev}(\text{blue dotted box } \kappa, x))$$

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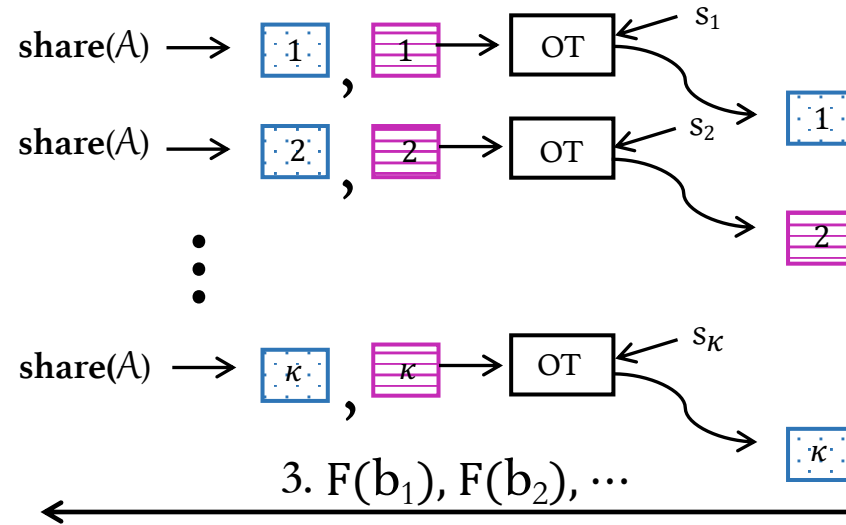


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Bob computes $F(x)$ on all his inputs

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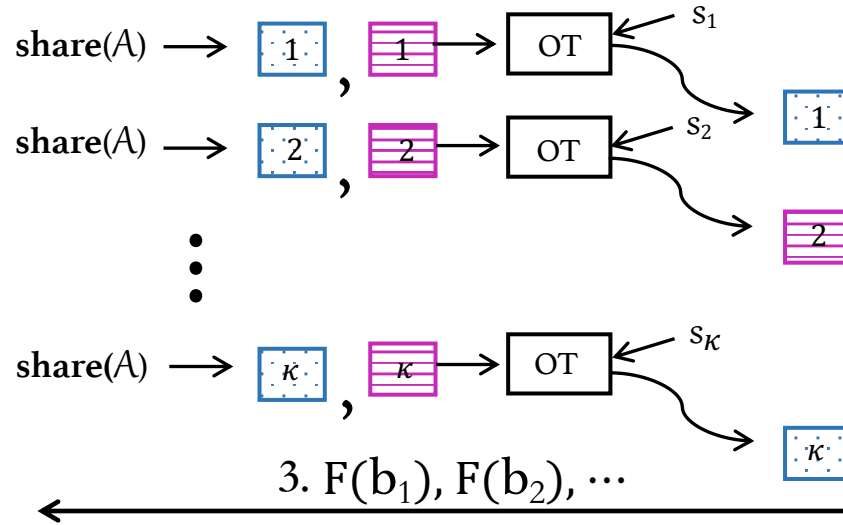


1. generates κ instances of bFSS shares

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2. picks κ choice bits to learn  or 



if $(x \in A) \Rightarrow$ Alice can compute $F(x)$

if $(x \notin A) \Rightarrow F(x) \approx \$\$$

$$x \in A \Rightarrow \text{ev}(\text{blue dotted box}, x) = \text{ev}(\text{pink striped box}, x)$$

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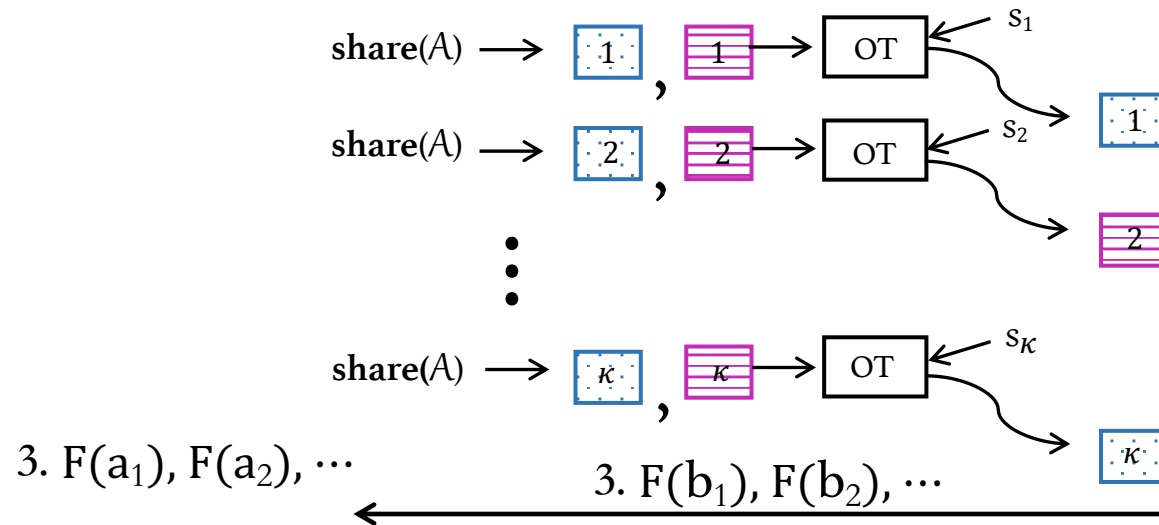


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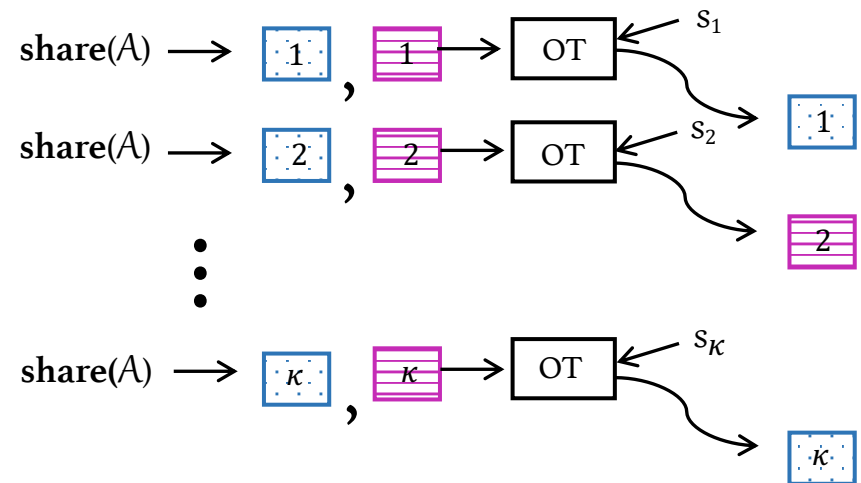
Why is [GRS'22] not malicious-secure?



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3. $F(a_1), F(a_2), \dots$

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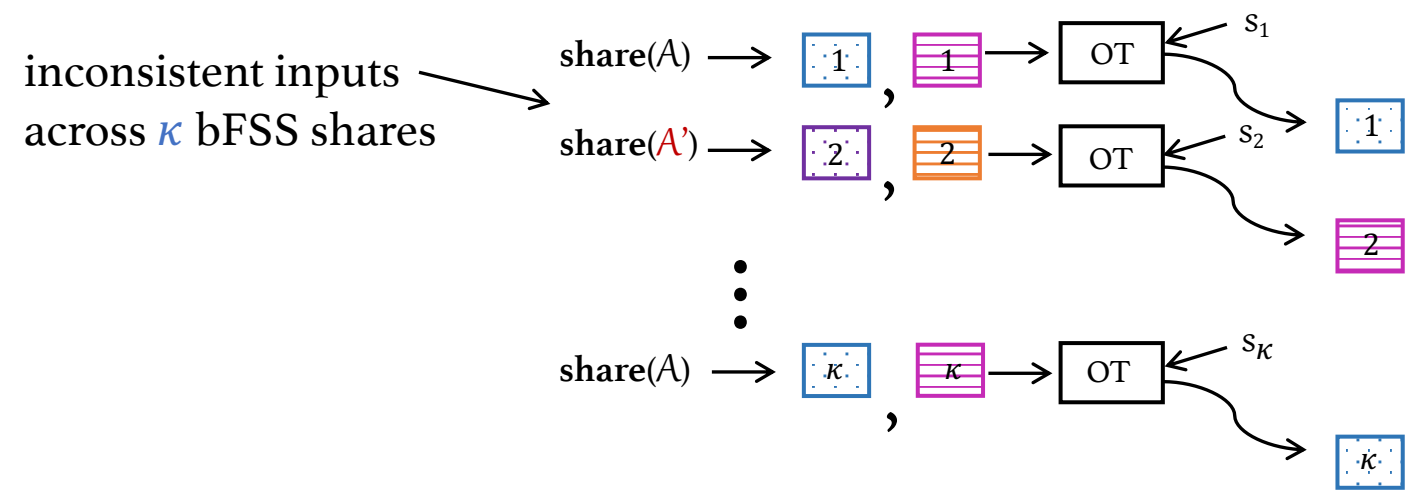
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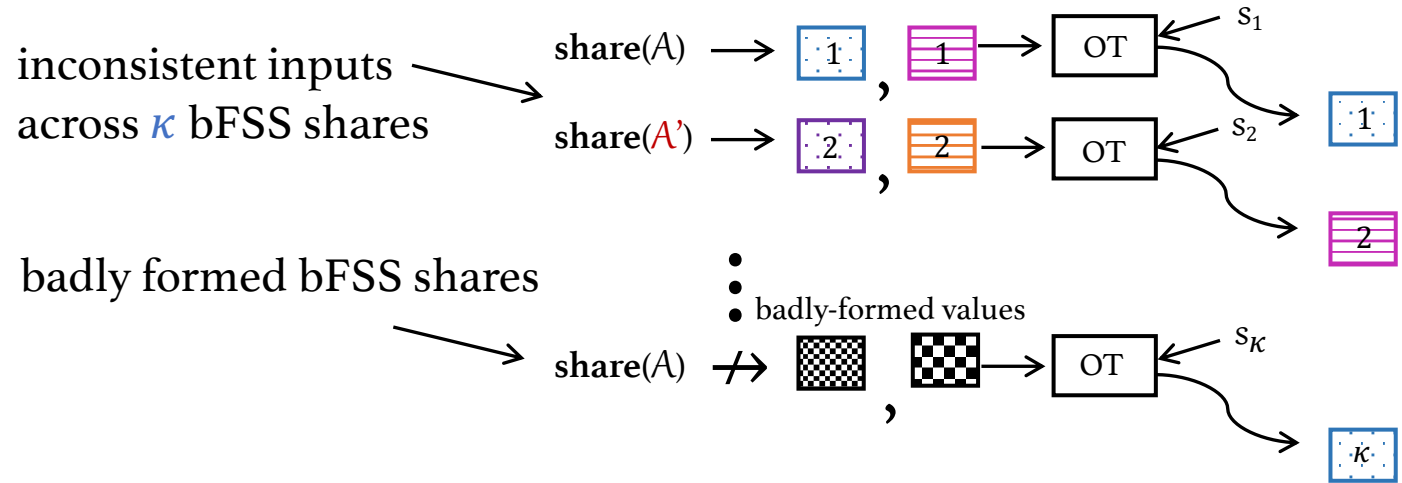
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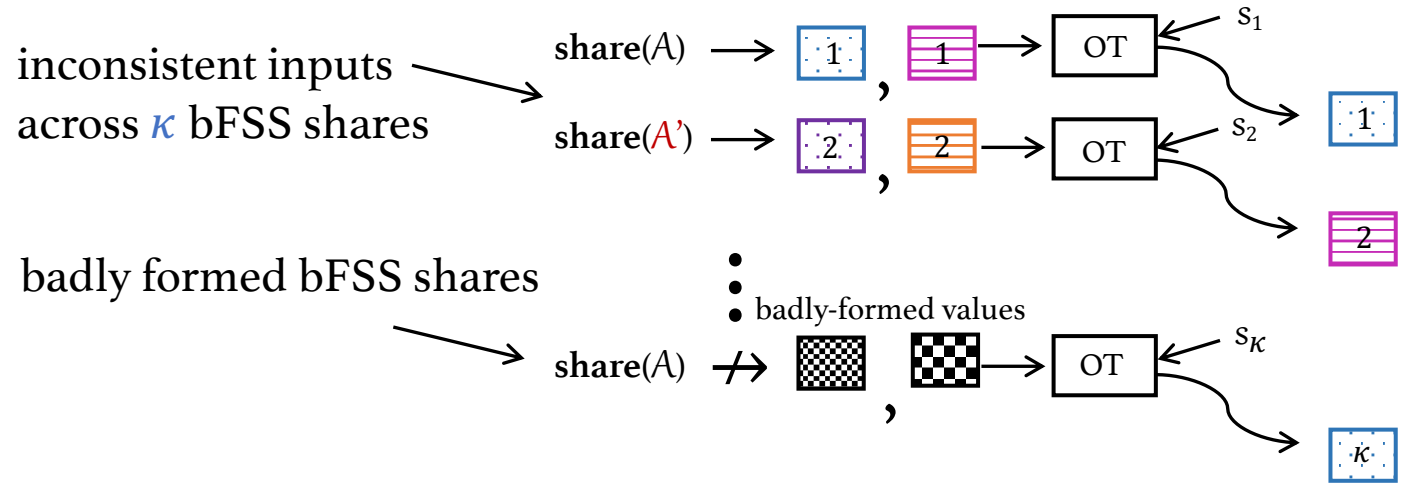
malicious-secure sa-PSI reduces to **consistency-of-bFSS** problem



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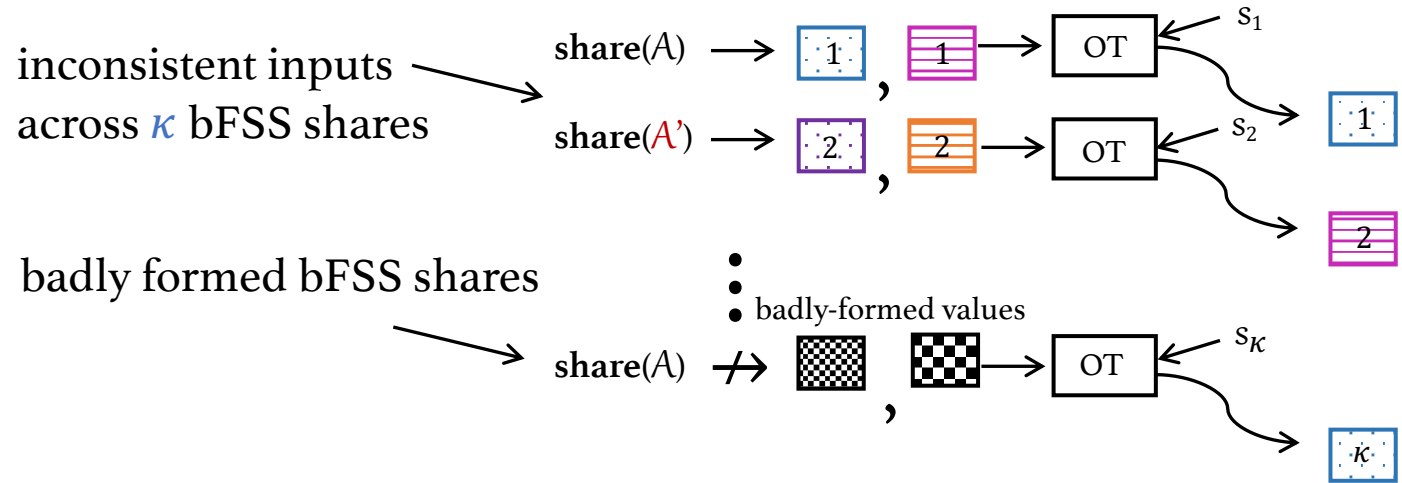
Challenge: enforce that Alice encodes **same valid set across all κ bFSS shares**



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2. picks κ choice bits to learn  or 



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Attempt 1: Let's Cut-and-Choose

Cut-and-choose: allow Bob to open and verify both bFSS shares for some subset of 't' instances

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1. pick subset **check** \subset [t]

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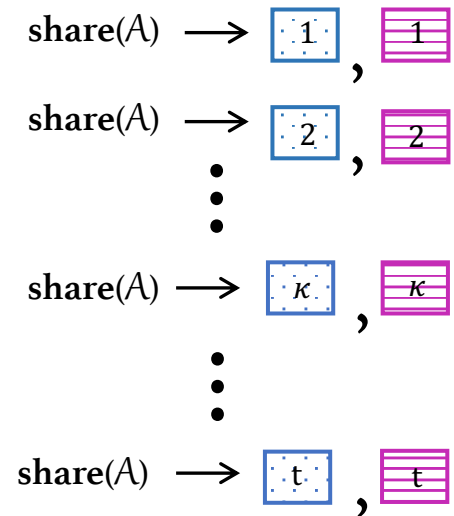
Cut-and-choose: allow Bob to open and verify both bFSS shares for some subset of 't' instances



2. generates t bFSS shares



1. pick subset $\text{check} \subset [t]$



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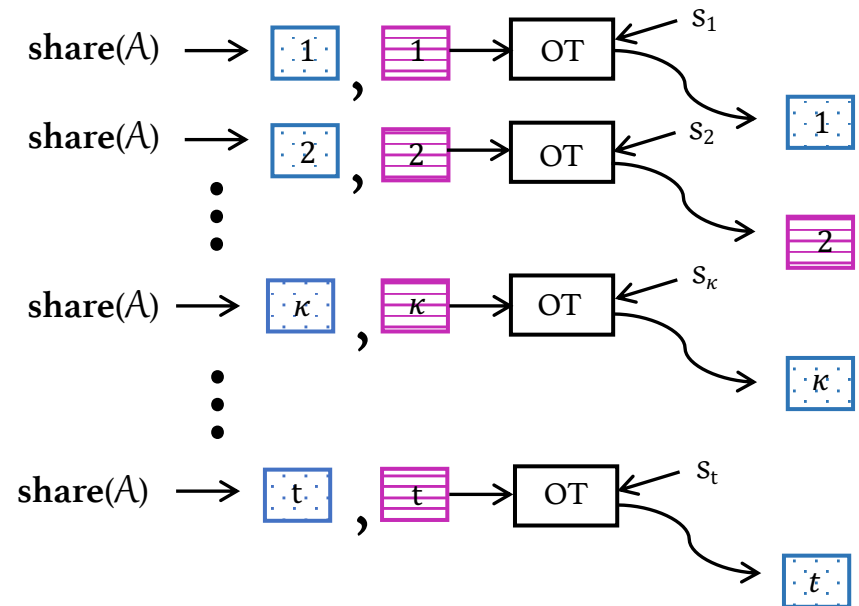
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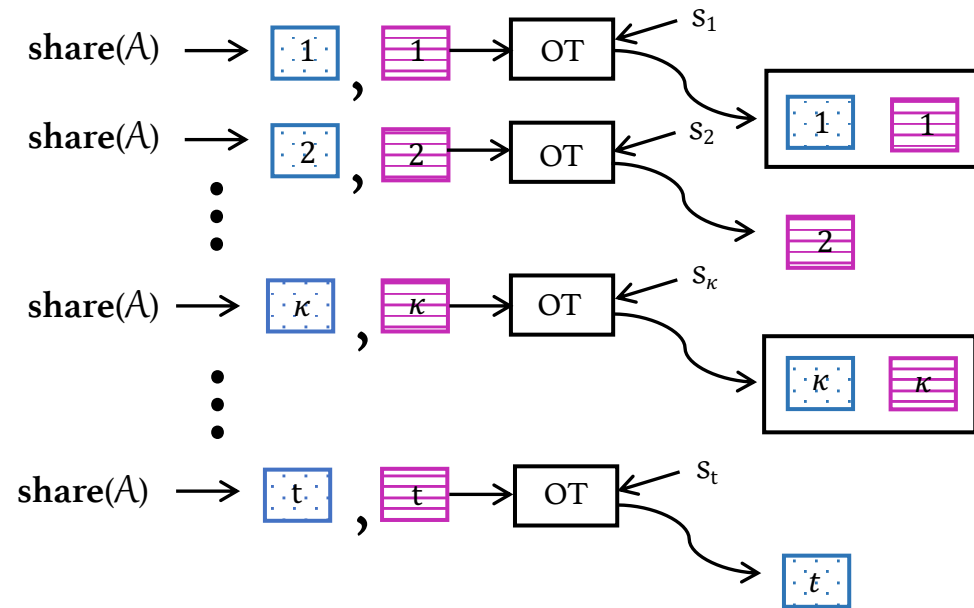
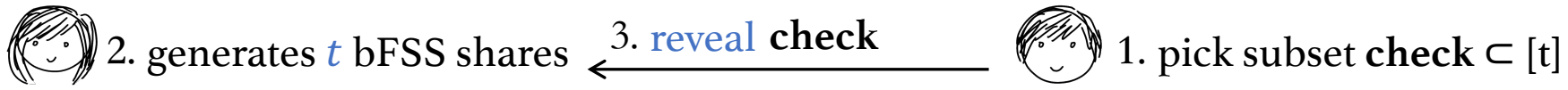


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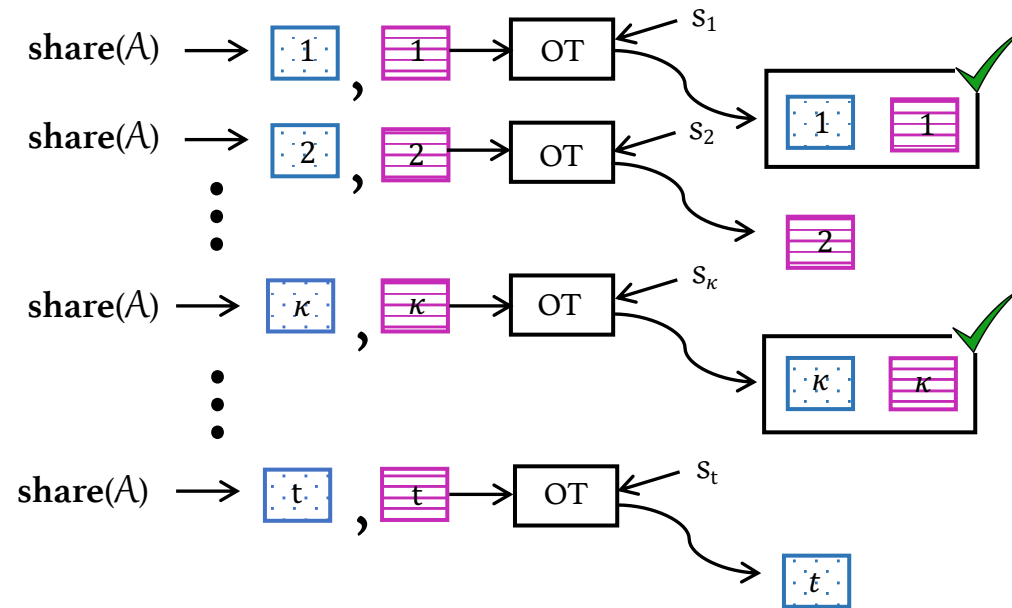
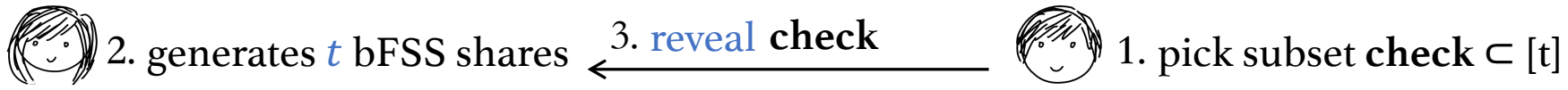
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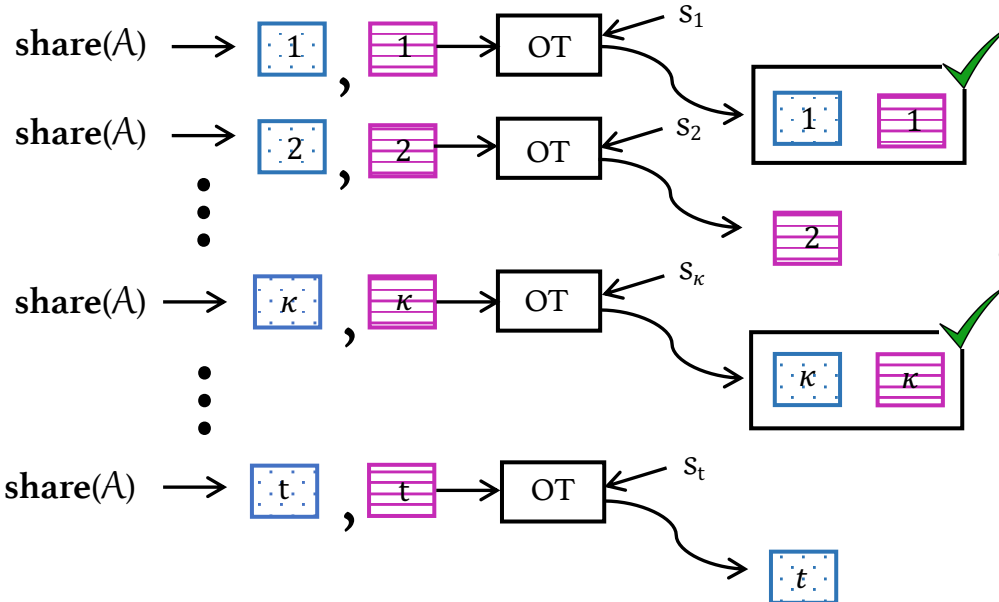
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-  2. generates t bFSS shares $\xleftarrow{3. \text{reveal check}}$  1. pick subset $\text{check} \subset [t]$

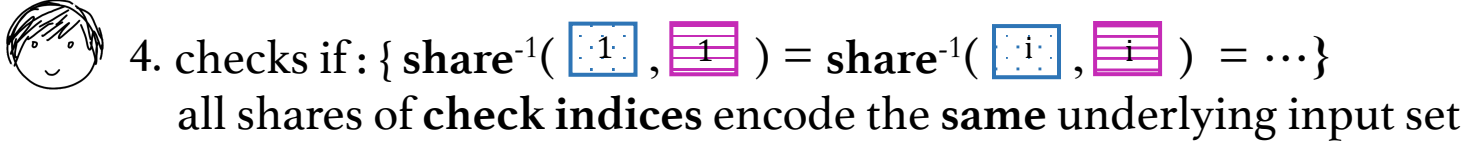
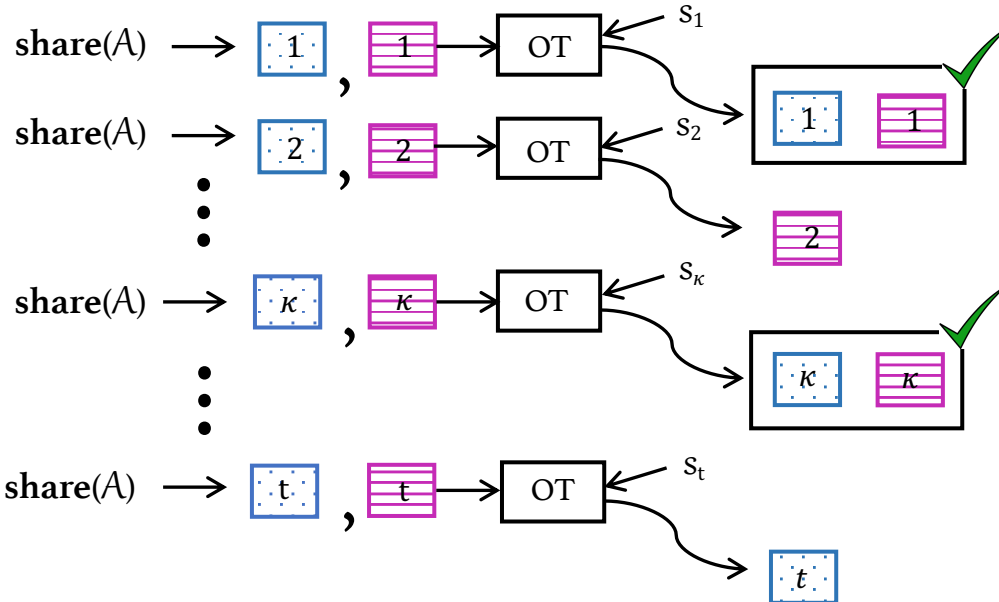


cut-and-choose parameters:
at least κ unopened shares are valid

-  4. checks if: $\{ \text{share}^{-1}(\text{[1]}, \text{[1]}) = \text{share}^{-1}(\text{[i]}, \text{[i]}) = \dots \}$
 all shares of **check** indices encode the **same** underlying input set

Attempt 1: Let's Cut-and-Choose

Cut-and-choose: allow Bob to open and verify both bFSS shares for some subset of 't' instances



1. How does Bob verify that a **single** bFSS is **valid**; without revealing Alice's input?

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derandomizable bFSS
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homomorphic commitments

Derandomizable bFSS

we formalize a new primitives [derandomizable Function Secret Sharing](#) with following properties

[BoyleGilboaIshai19]: FSS with derandomizability for “offset” families

Derandomizable bFSS

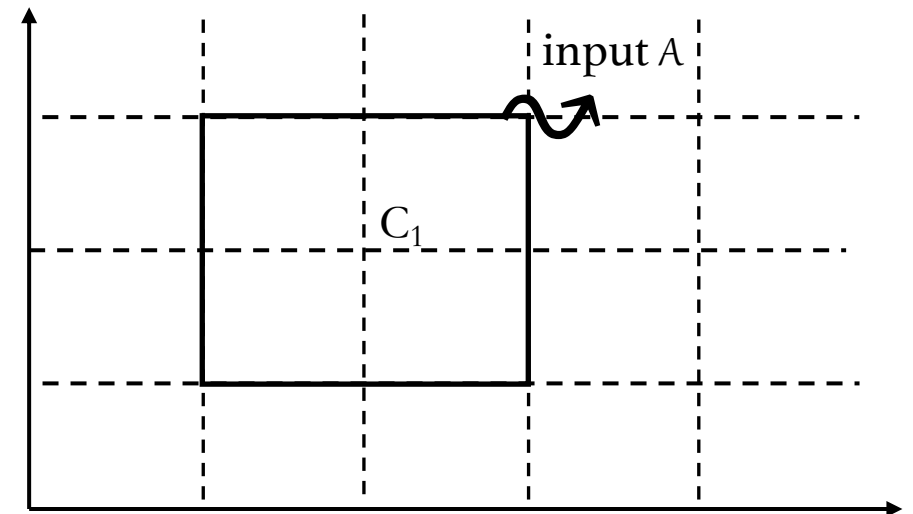
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derandomizable Function Secret Sharing (drFSS)

given input $A \in \mathcal{S}$ from a class of structured sets

structured input example: square







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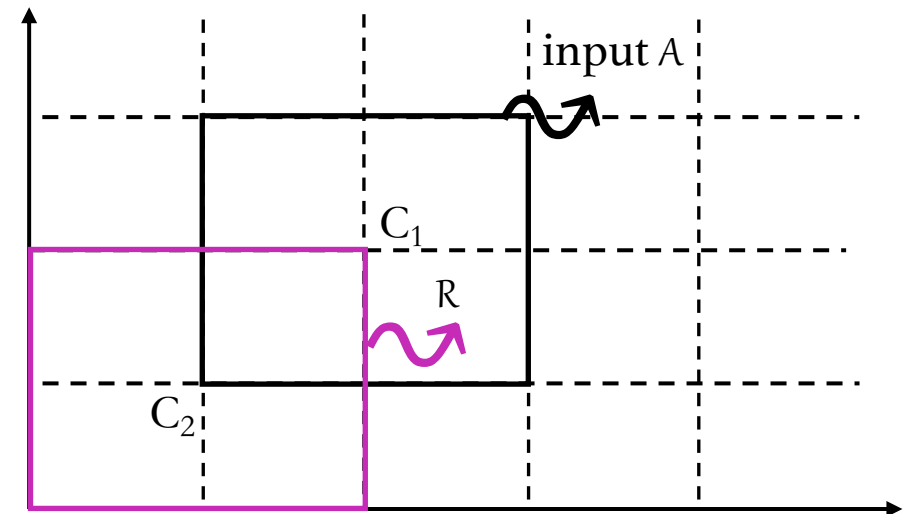
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$R_{\text{share}}() \rightarrow$  ,  , R where  ,  $\approx \$$

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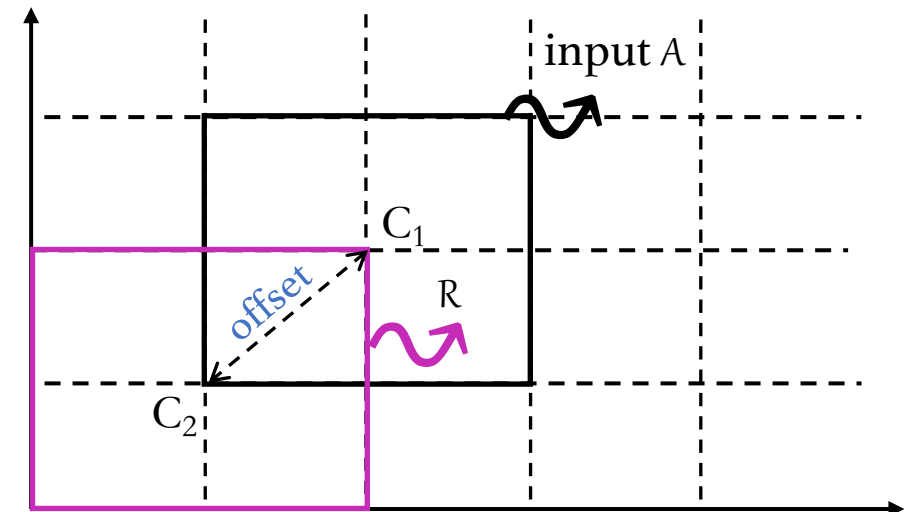
$R_{\text{share}}() \rightarrow$  ,  , R where  ,  \approx $\$$

$\text{offset} = A - R$

structured input example: square

$\text{encode}(A) \rightarrow$ center of square C_1

$\text{offset} = C_1 - C_2$



Derandomizable bFSS

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derandomizable Function Secret Sharing (drFSS)

given input $A \in \mathcal{S}$ from a class of structured sets

$\text{Rshare}() \rightarrow \text{[purple dotted]}, \text{[orange striped]}, R$ where $\text{[purple dotted]}, \text{[orange striped]} \approx \$$

$\text{offset} = A - R$

$x \in A \Rightarrow \text{Deval}(\text{[purple dotted]}, \text{offset}, x) \oplus \text{Deval}(\text{[orange striped]}, \text{offset}, x) = 0$

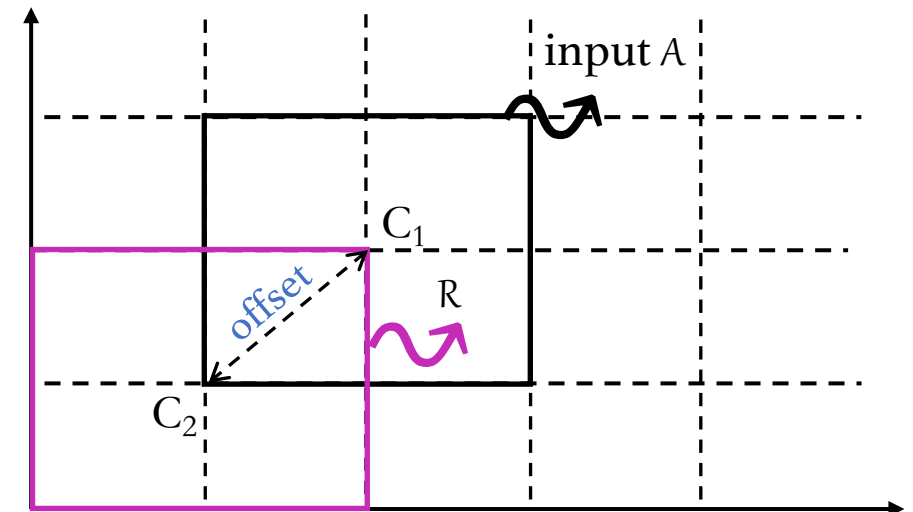
$x \notin A \Rightarrow \text{Deval}(\text{[purple dotted]}, \text{offset}, x) \oplus \text{Deval}(\text{[orange striped]}, \text{offset}, x) = 1$

Privacy guarantee: $\text{[purple dotted]}, \text{offset} \approx \$$ and $\text{[orange striped]}, \text{offset} \approx \$$

structured input example: square

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$\text{offset} = C_1 - C_2$

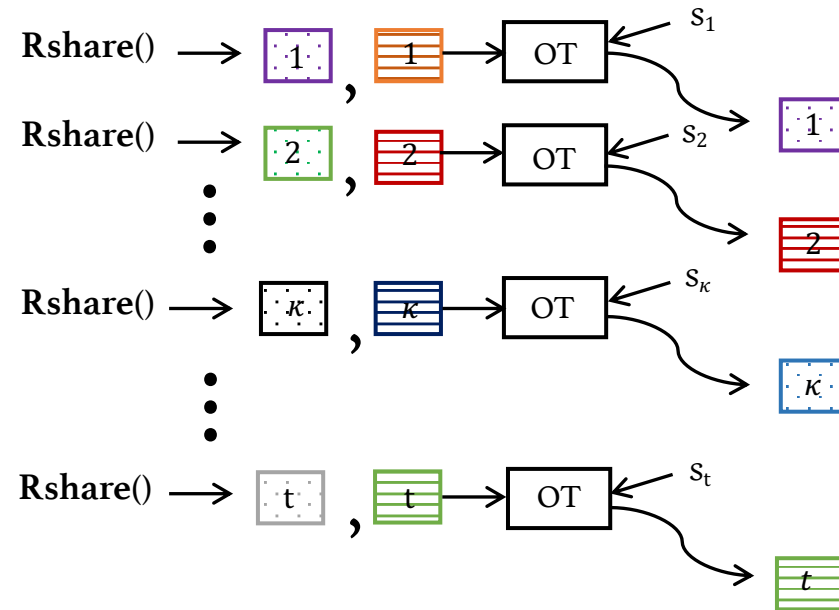
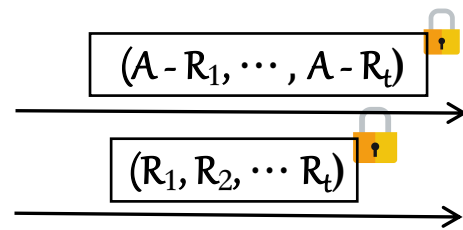


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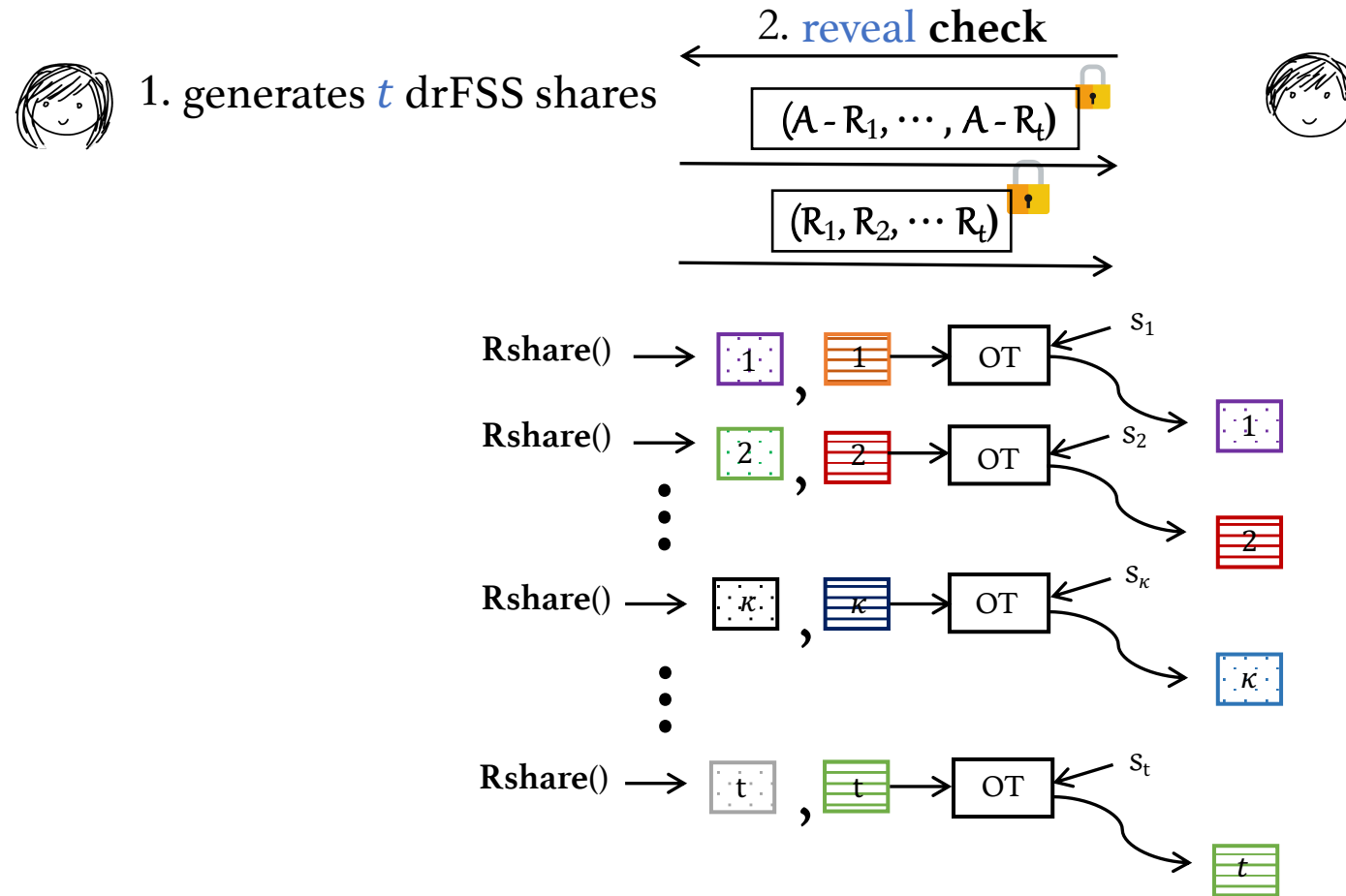
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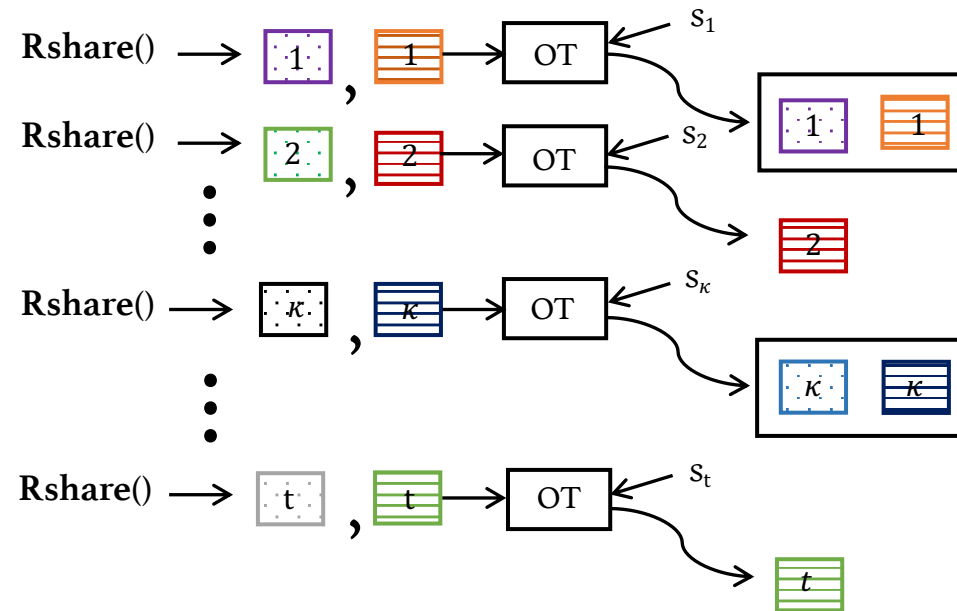
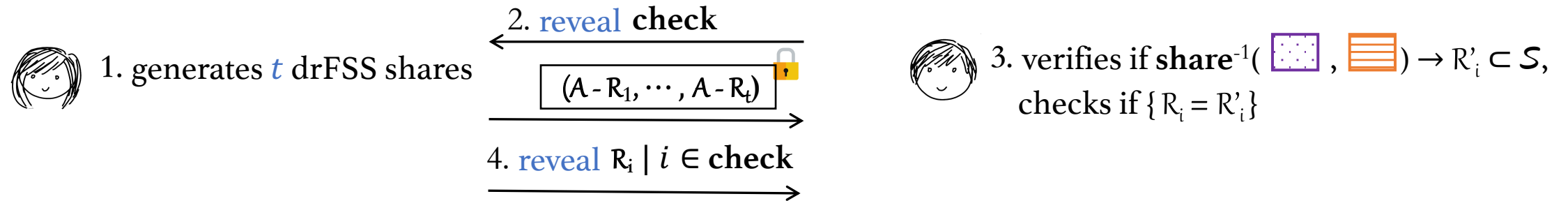
1. generates t drFSS shares



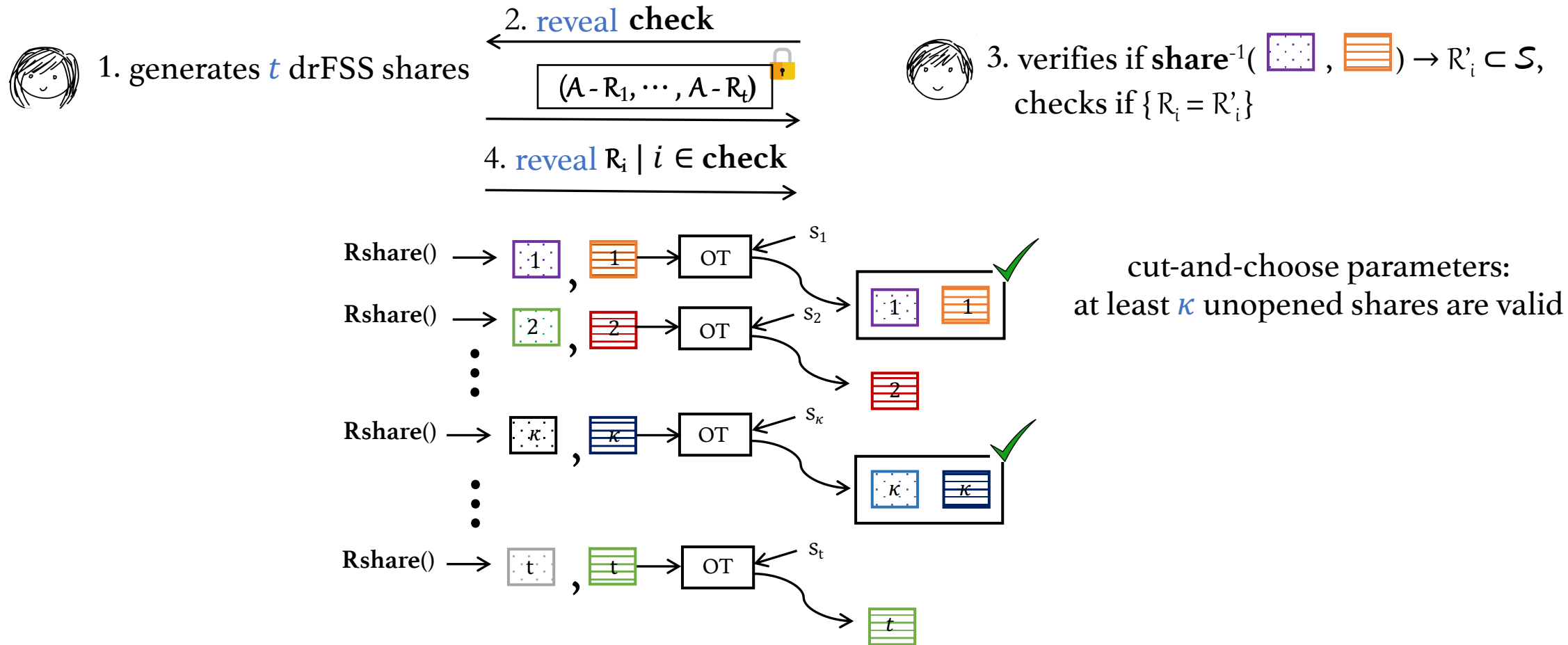
How can Bob check for valid encodings?



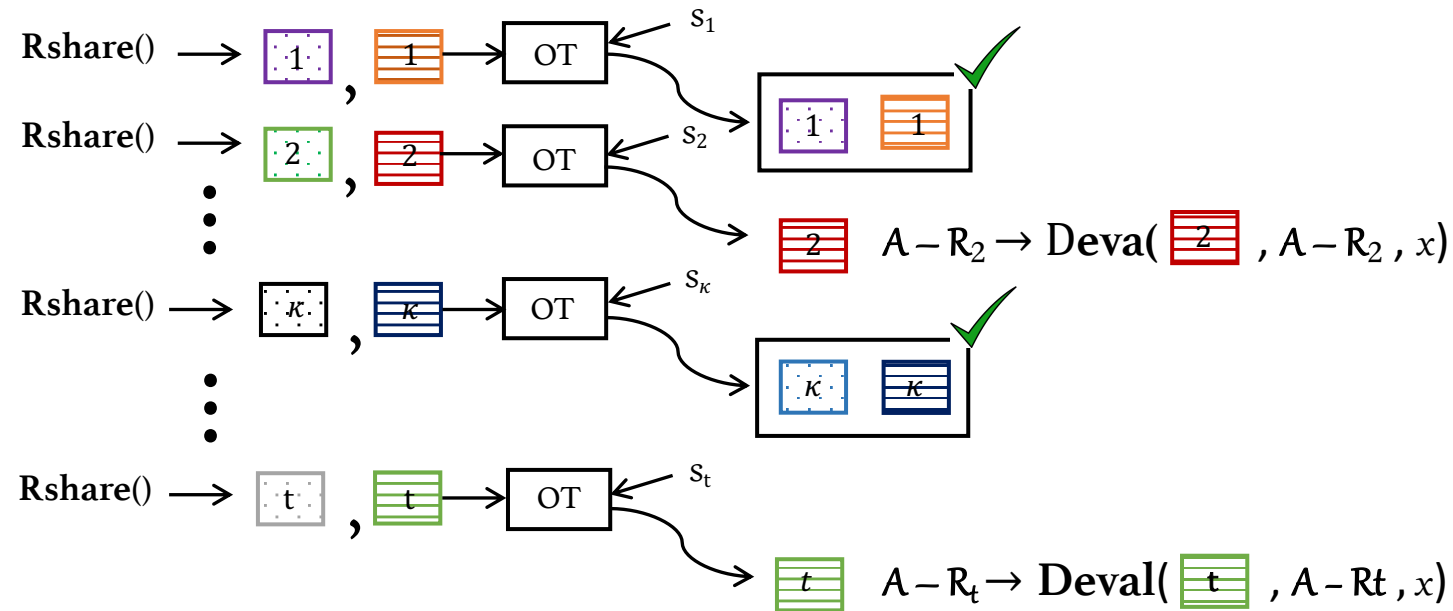
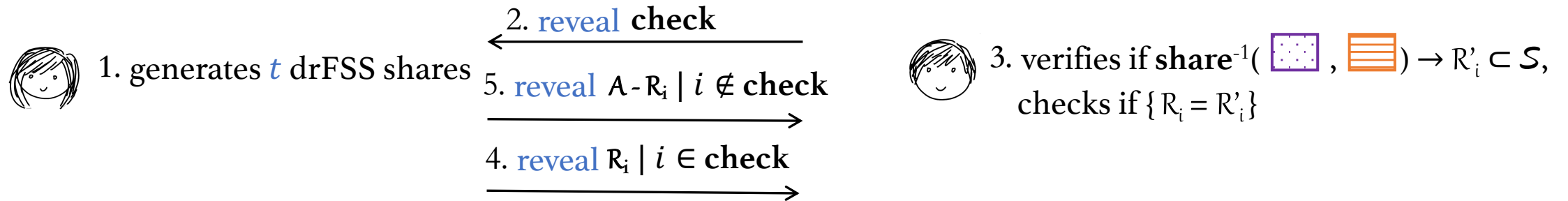
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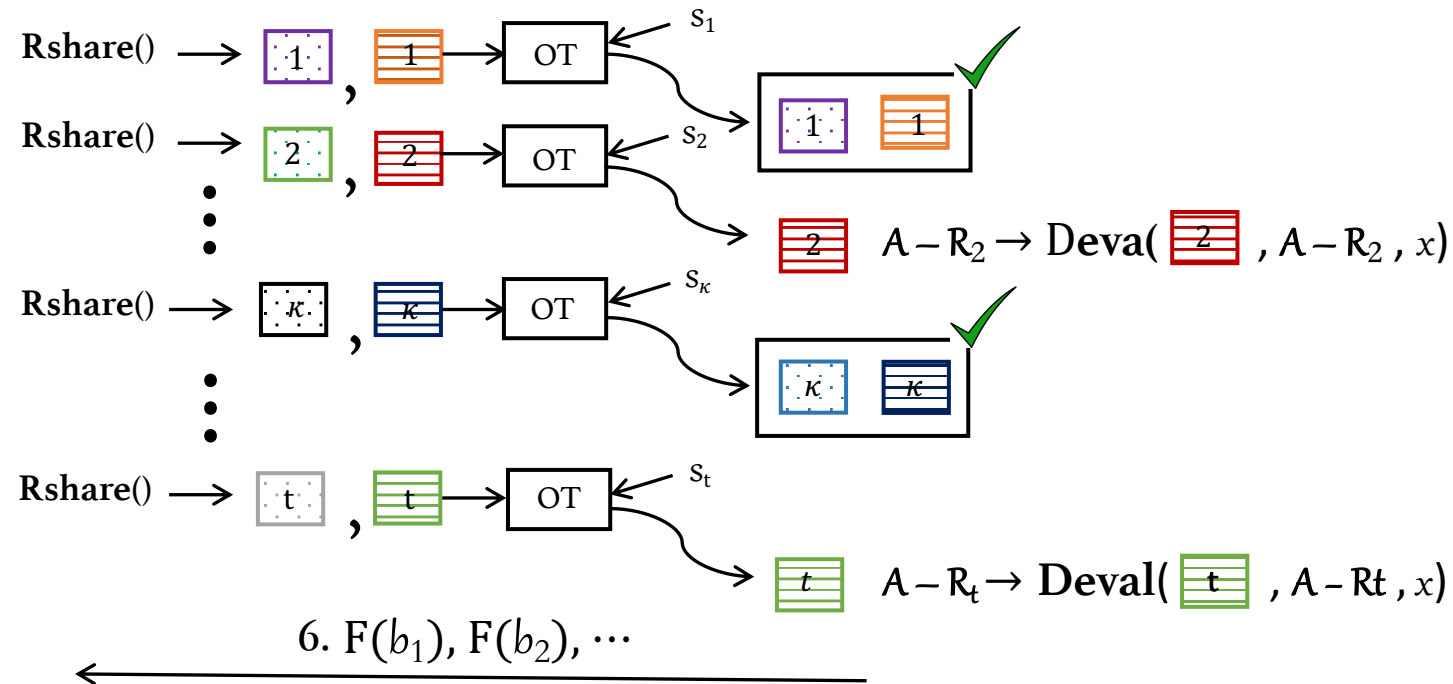
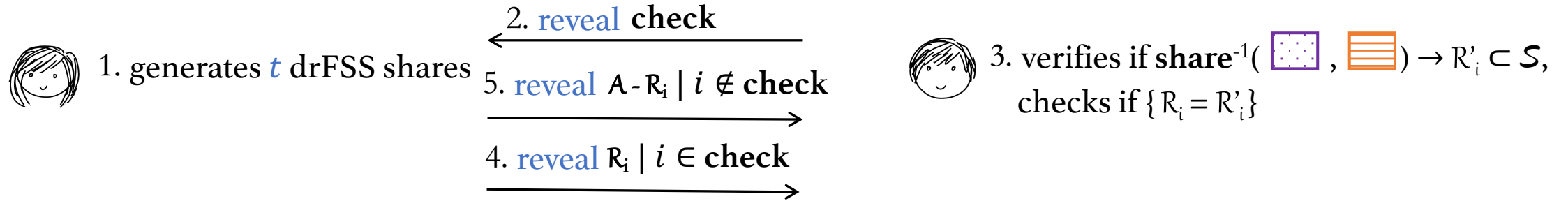
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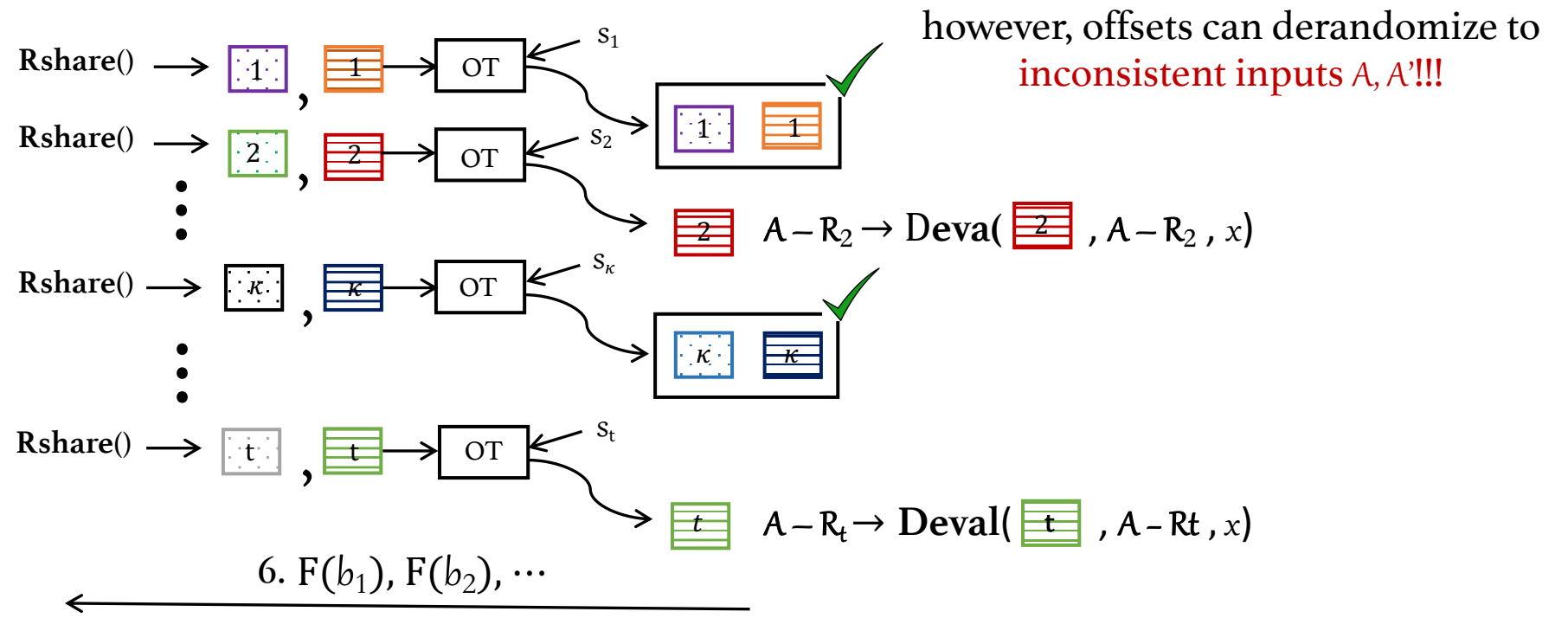
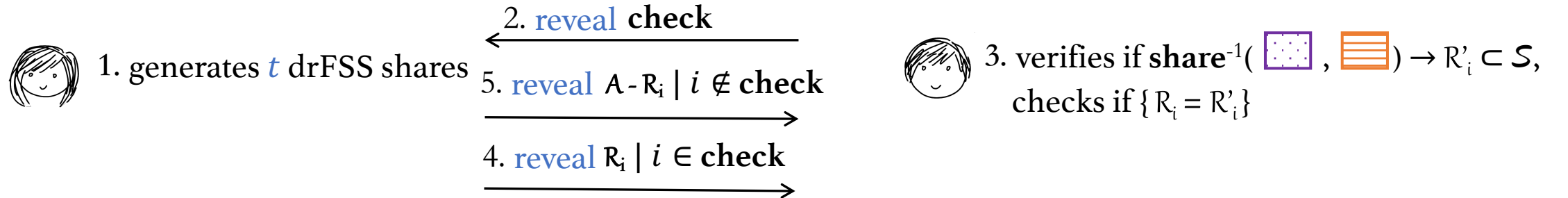
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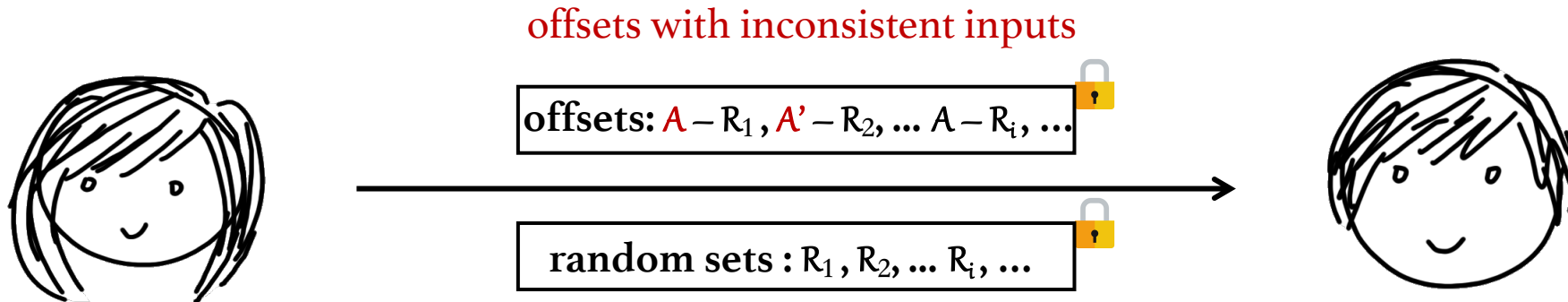


How can Bob check for valid encodings?



How can Bob check for consistent input set?

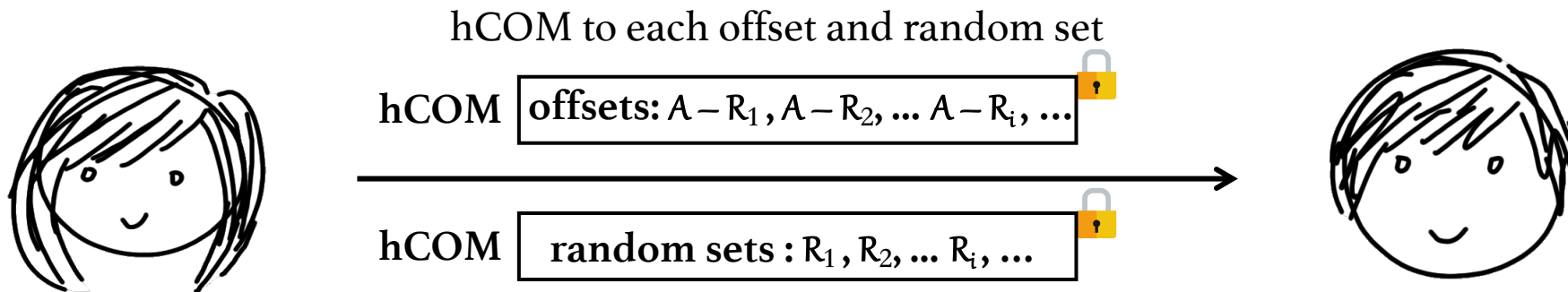
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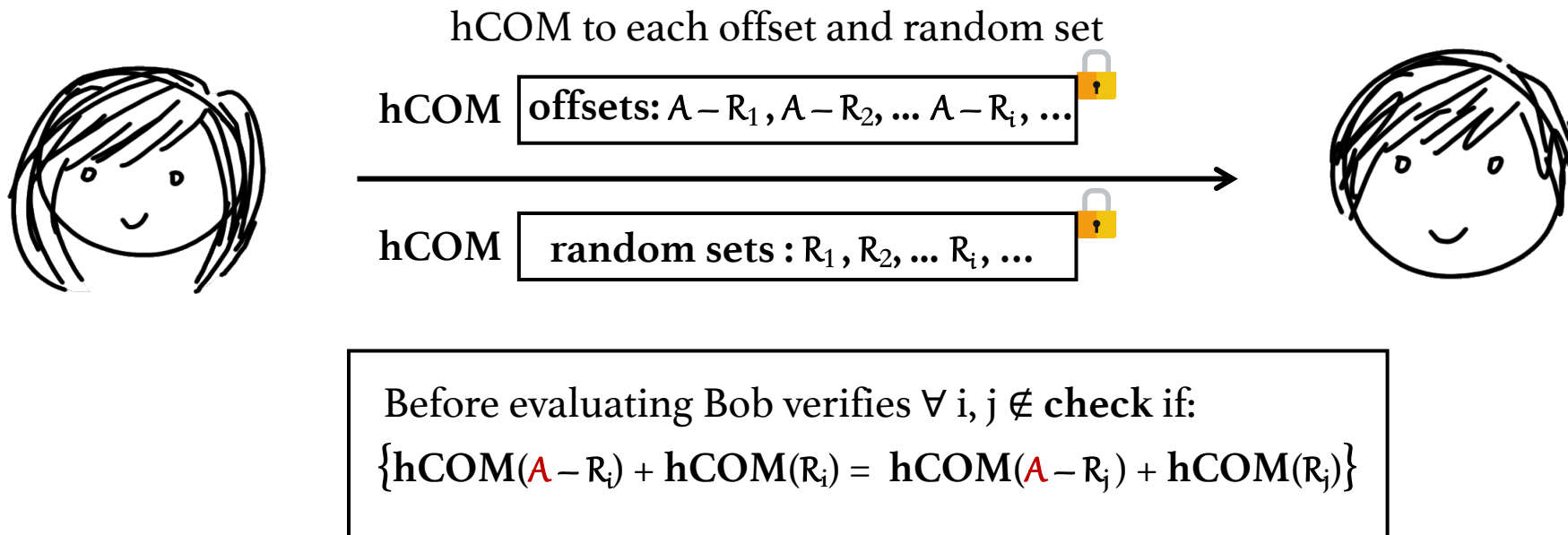
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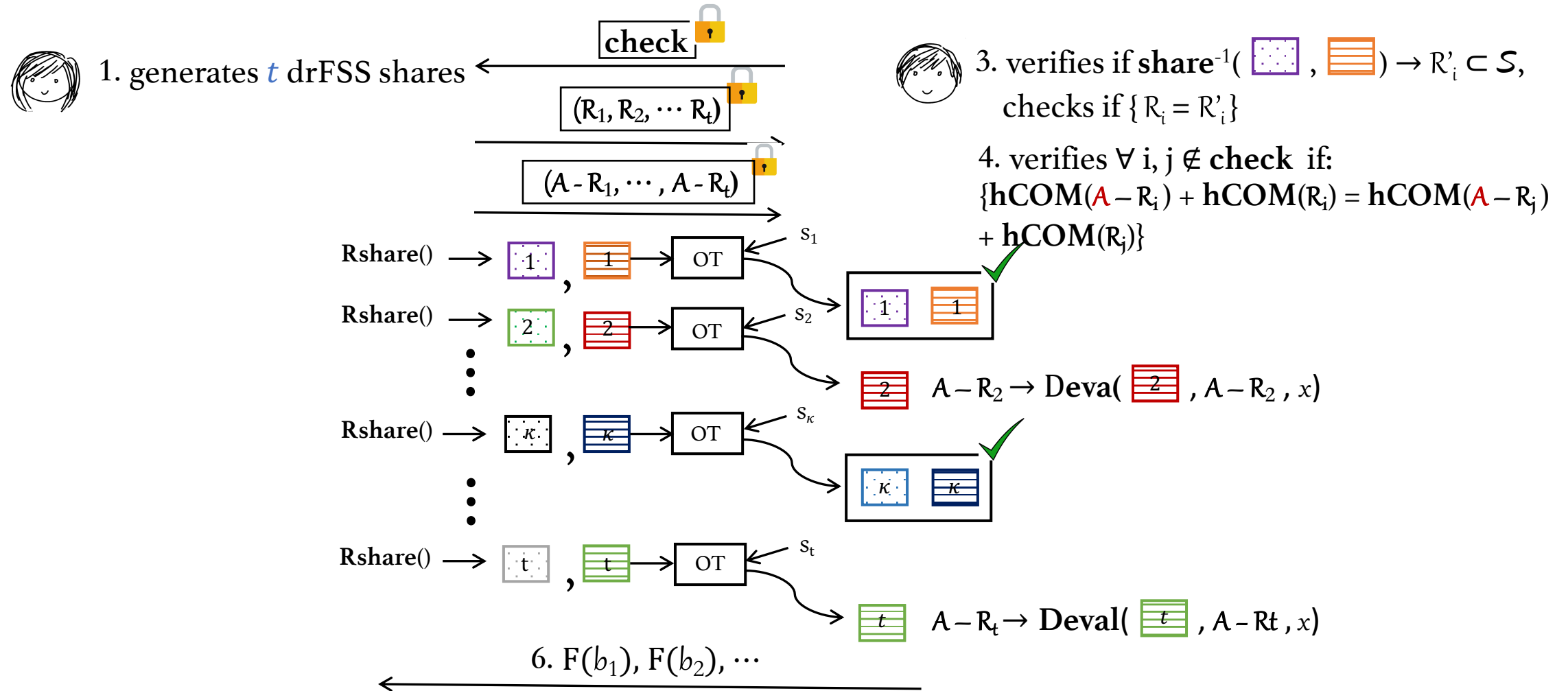
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Protocol Snapshot

assumptions: drFSS, committed OT, hCOM, random oracle model



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- ✓ more generally, show that derandomizable FSS can instantiate semi-honest structure-aware PSI

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- What if both Alice and Bob have structured inputs?
- Can we design drFSS for union of balls in other metric spaces like hamming distance, L-2 ?



Questions?

How does [GRS'22] work?

assumptions: OT-hybrid (Oblivious Transfer[Rabin81]), random oracle model

input A

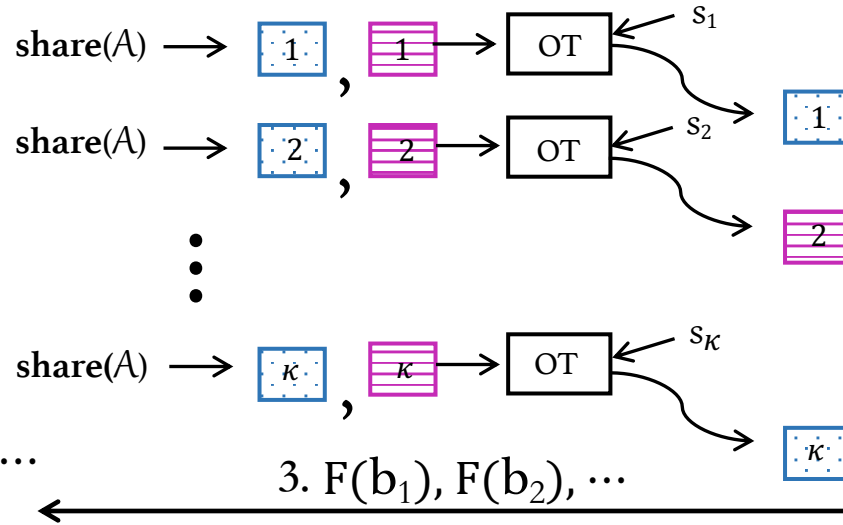


1. generates κ instances of bFSS shares

input B



2. picks κ choice bits to learn  or 



3. $F(a_1), F(a_2), \dots$

3. $F(b_1), F(b_2), \dots$

$$(x \in A \implies \text{ev}(\text{blue dotted box}, x) = \text{ev}(\text{pink striped box}, x))$$

$$\begin{aligned} F(x) &= \mathbf{H}(\text{ev}(\text{blue dotted box}, x) \parallel \text{ev}(\text{pink striped box}, x) \parallel \dots \parallel \text{ev}(\text{blue dotted box}, x)) \\ &= \mathbf{H}(\text{ev}(\text{blue dotted box}, x) \parallel \text{ev}(\text{blue dotted box}, x) \parallel \dots \parallel \text{ev}(\text{blue dotted box}, x)) \end{aligned}$$

Bob computes $F(x)$ on all his inputs

$$F(x) = \mathbf{H}(\text{ev}(\text{blue dotted box}, x) \parallel \text{ev}(\text{pink striped box}, x) \parallel \dots \parallel \text{ev}(\text{blue dotted box}, x))$$

construction	dFSS?	share size	eval cost
disjoint balls: basic FSS [BGI16]	yes	$O(n\kappa u^d)$	$O(nu^d)$
disjoint balls: [GRS22]	no	$O(n(4 \log \delta)^d \kappa)$	$O((2 \log \delta)^d)$
disjoint balls: ours	yes	$O(n\kappa(ud + (\log \delta)^d))$	$O((2 \log \delta)^d)$
balls with centers $> 4\delta$ apart: [GRS22]	no	$O(nd2^d \kappa \log \delta)$	$O(d \log \delta)$
balls with centers $> 8\delta$ apart: ours	yes	$O(nd\kappa \log \delta)$	$O(d \log \delta)$
axis-disjoint balls: [GRS22]	no	$O(nd\kappa \log \delta)$	$O(d \log \delta)$

Figure 1: FSS share size for n balls (ℓ_∞ norm) of radius δ in d dimensions, over u -bit integers. Evaluation time is for evaluating on one point.

structured input set	Communication cost (in GB)	
	[GRS22] (semi-honest secure)	Ours (malicious secure)
disjoint union of ℓ_∞ balls	101.1	662.4
union of balls with centers $> 8\delta$ apart	13.2	85.6

Figure 2: PSI concrete communication cost comparison with [GRS22]. Here Alice’s structured set (of size $\approx 10^7$) contains $n = 2700$ ℓ_∞ balls in 2 dimensions, each with radius $\delta = 30$ in universe of size 2^{32} along each dimension, and Bob inputs an unstructured set of size 10^6 .

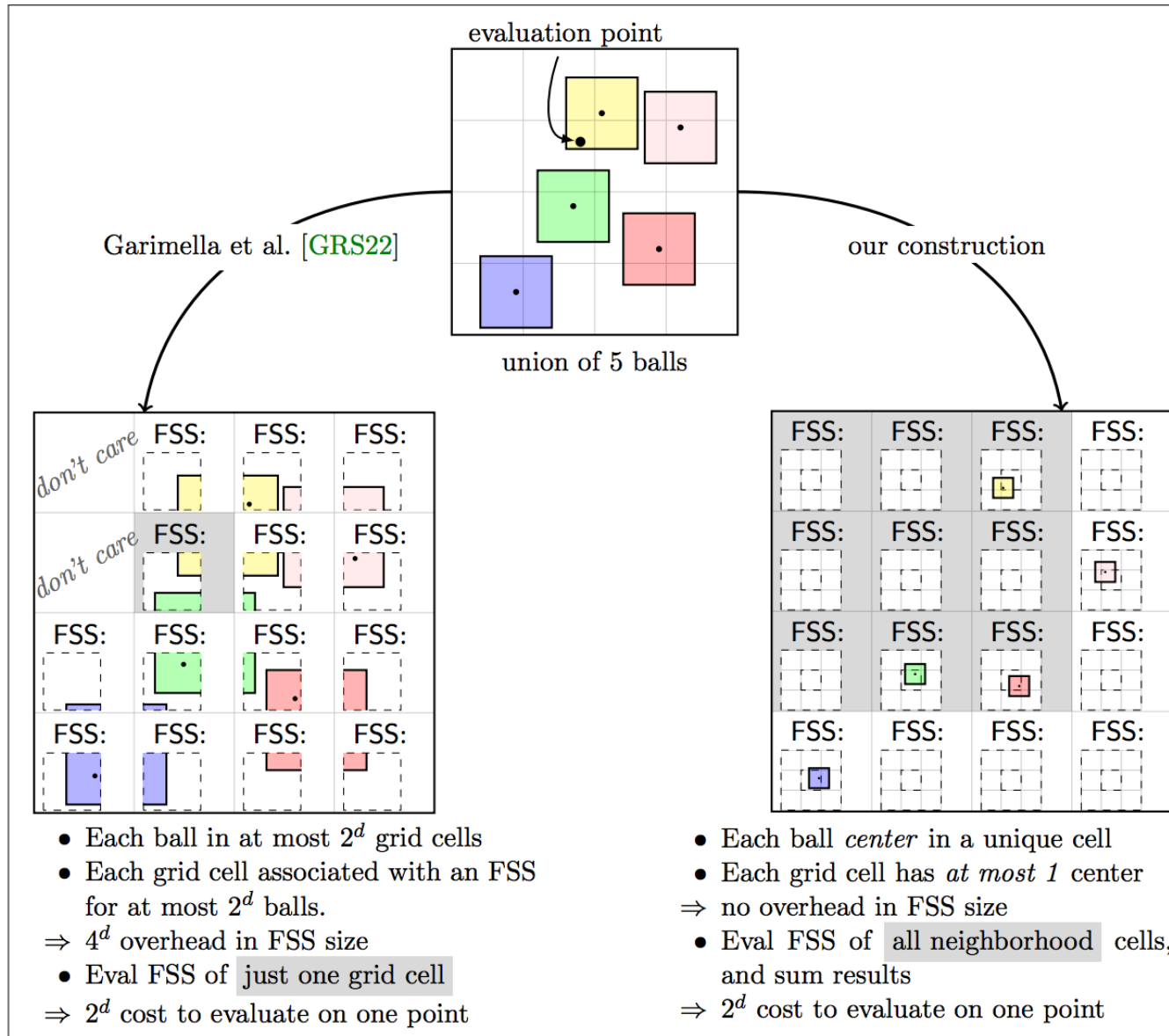


Figure 8: Illustration of the construction of Garimella et al. [GRS22] and our improved construction, for the union of n balls.