

# Bet-or-Pass: Adversarially Robust Bloom Filters

Moni Naor and Noa Oved

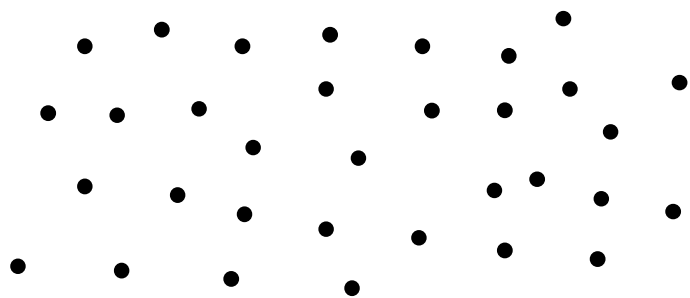


Weizmann Institute of Science

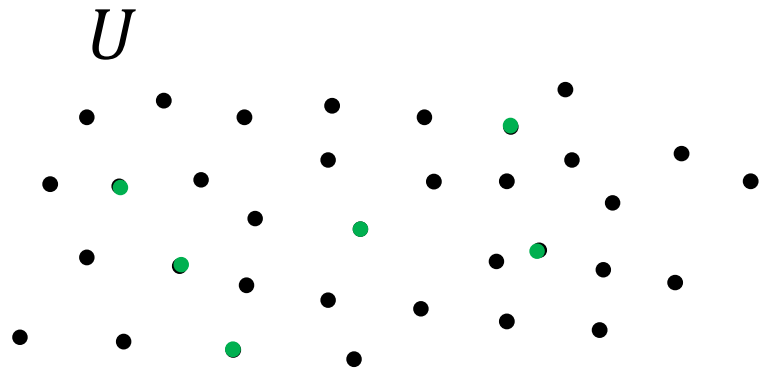
TCC 2022

# Bloom Filters [Bloom70]

$U$



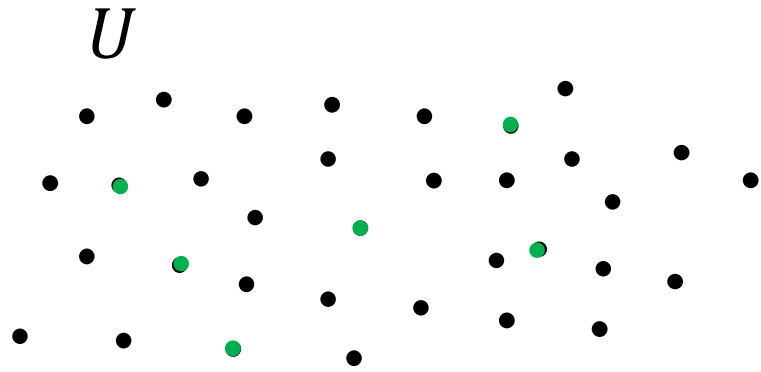
# Bloom Filters [Bloom70]



Static set  $S$   
 $|S| = n$

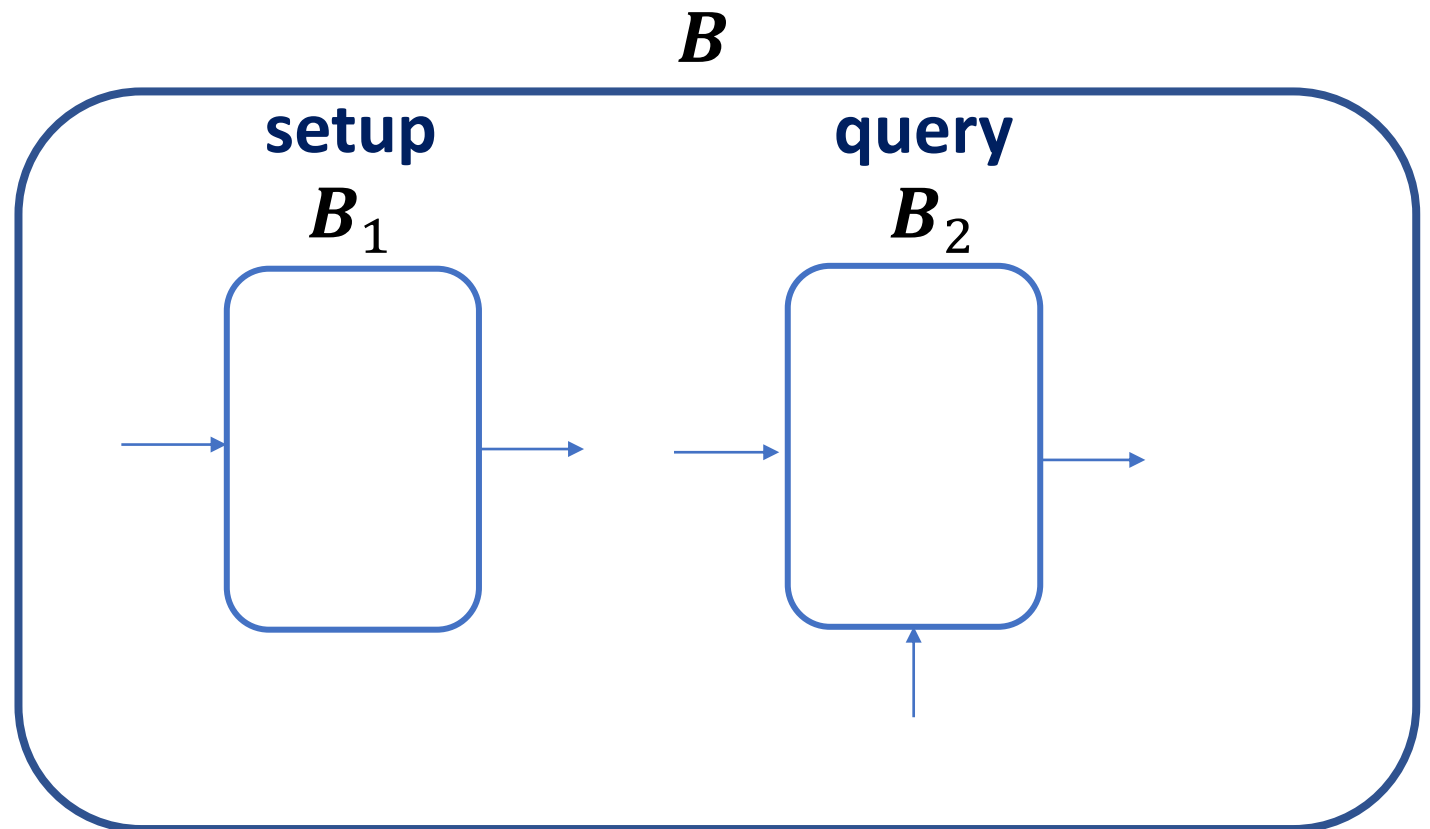
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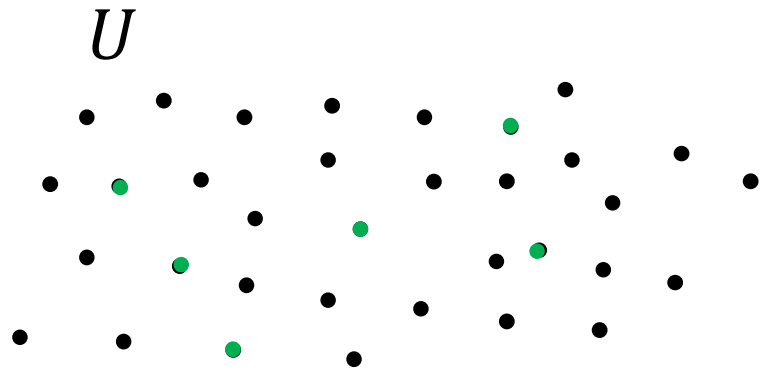


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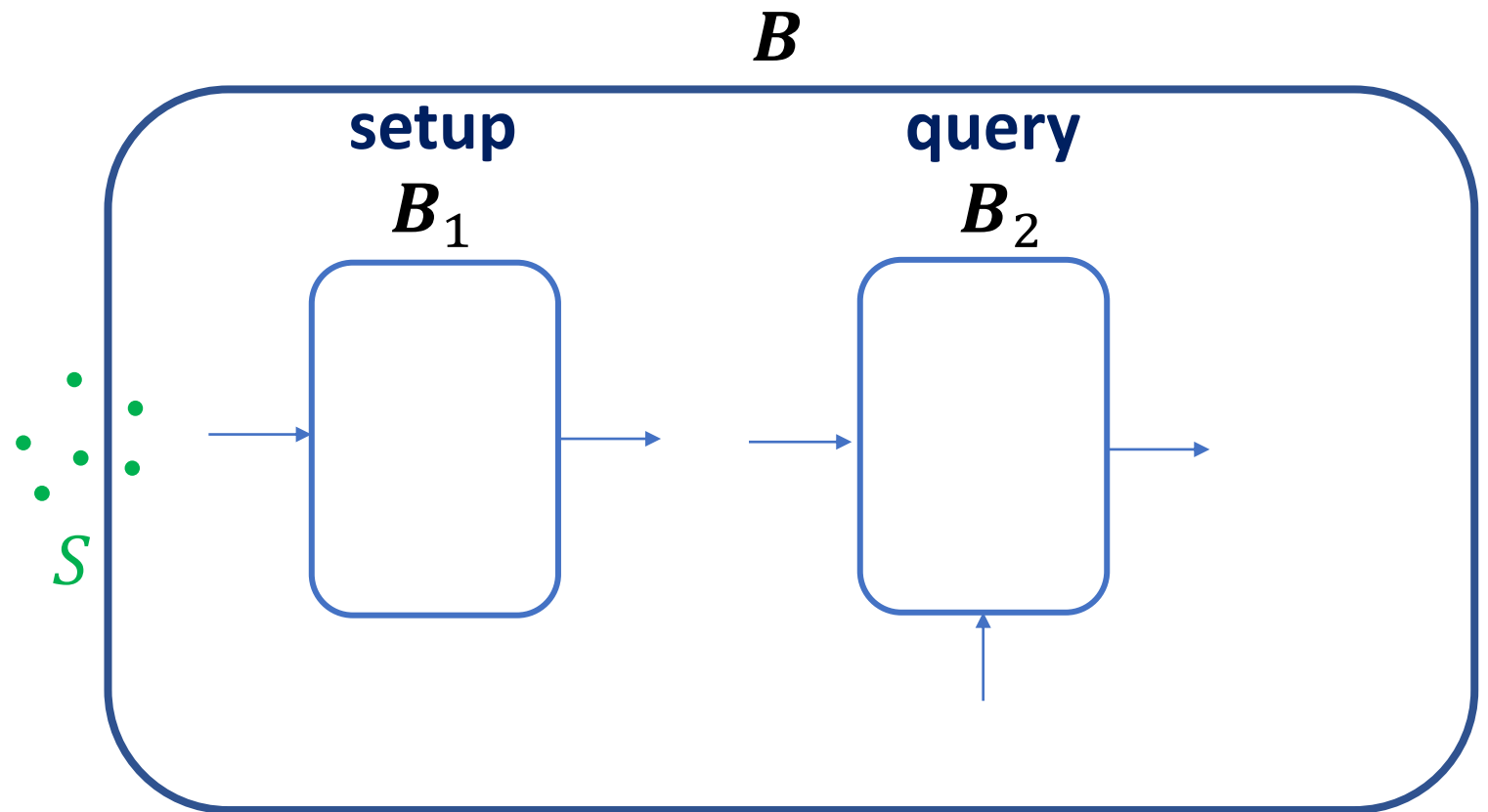


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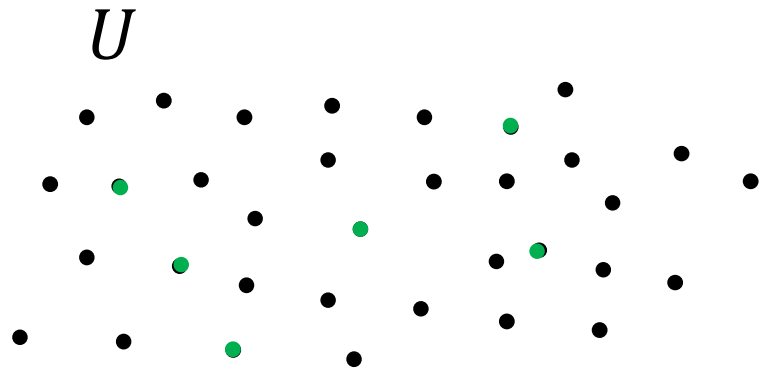


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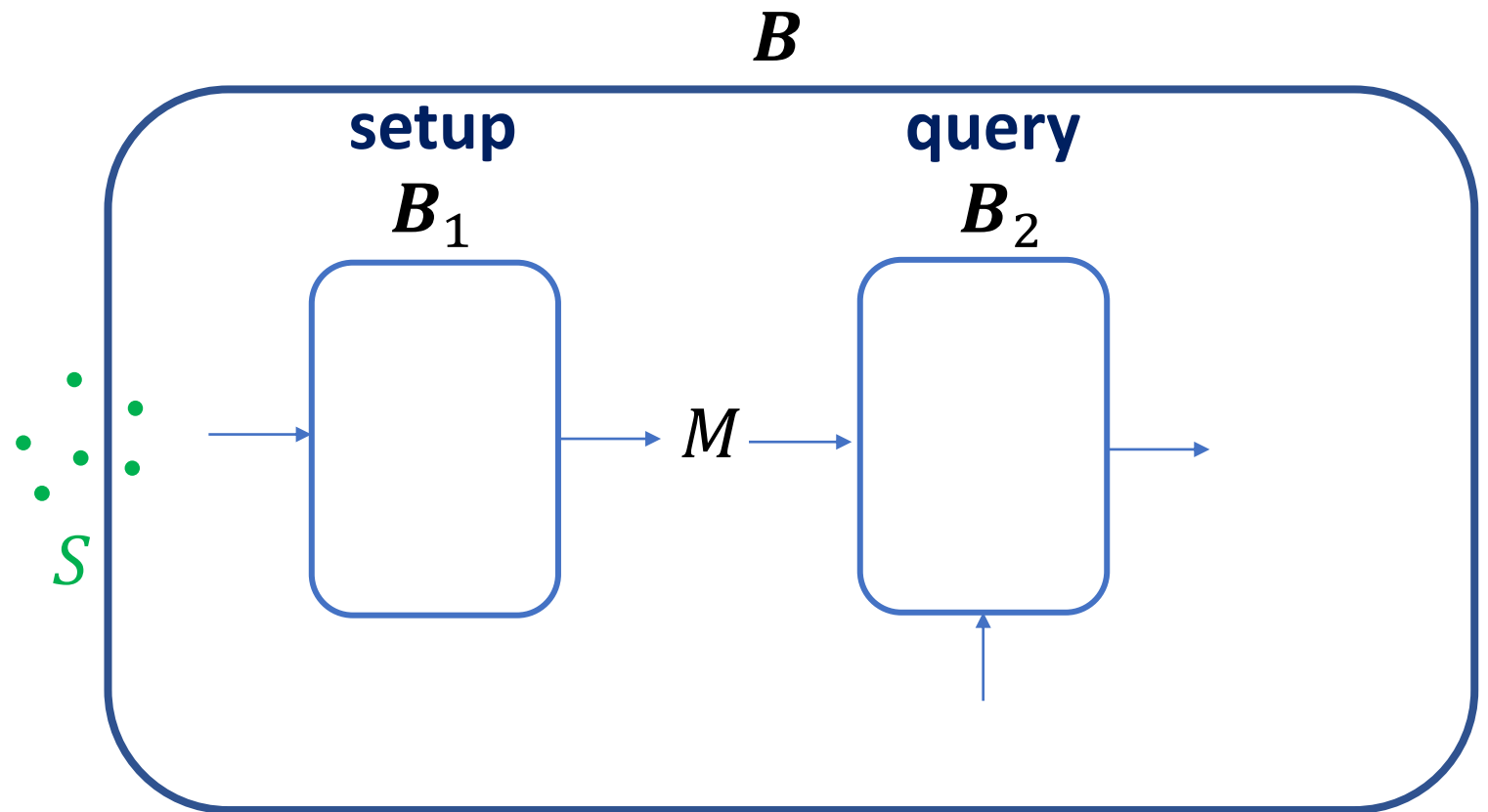


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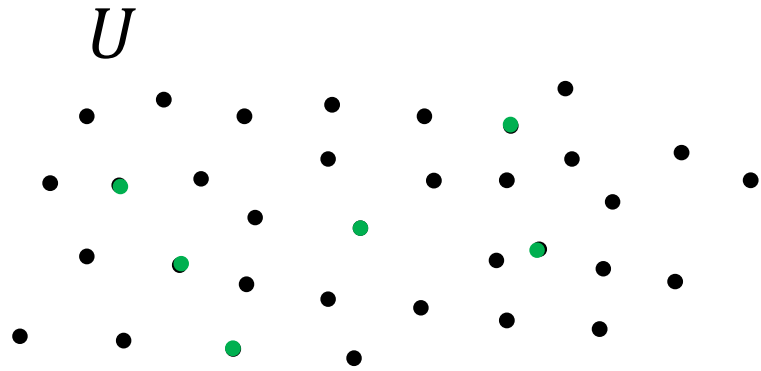


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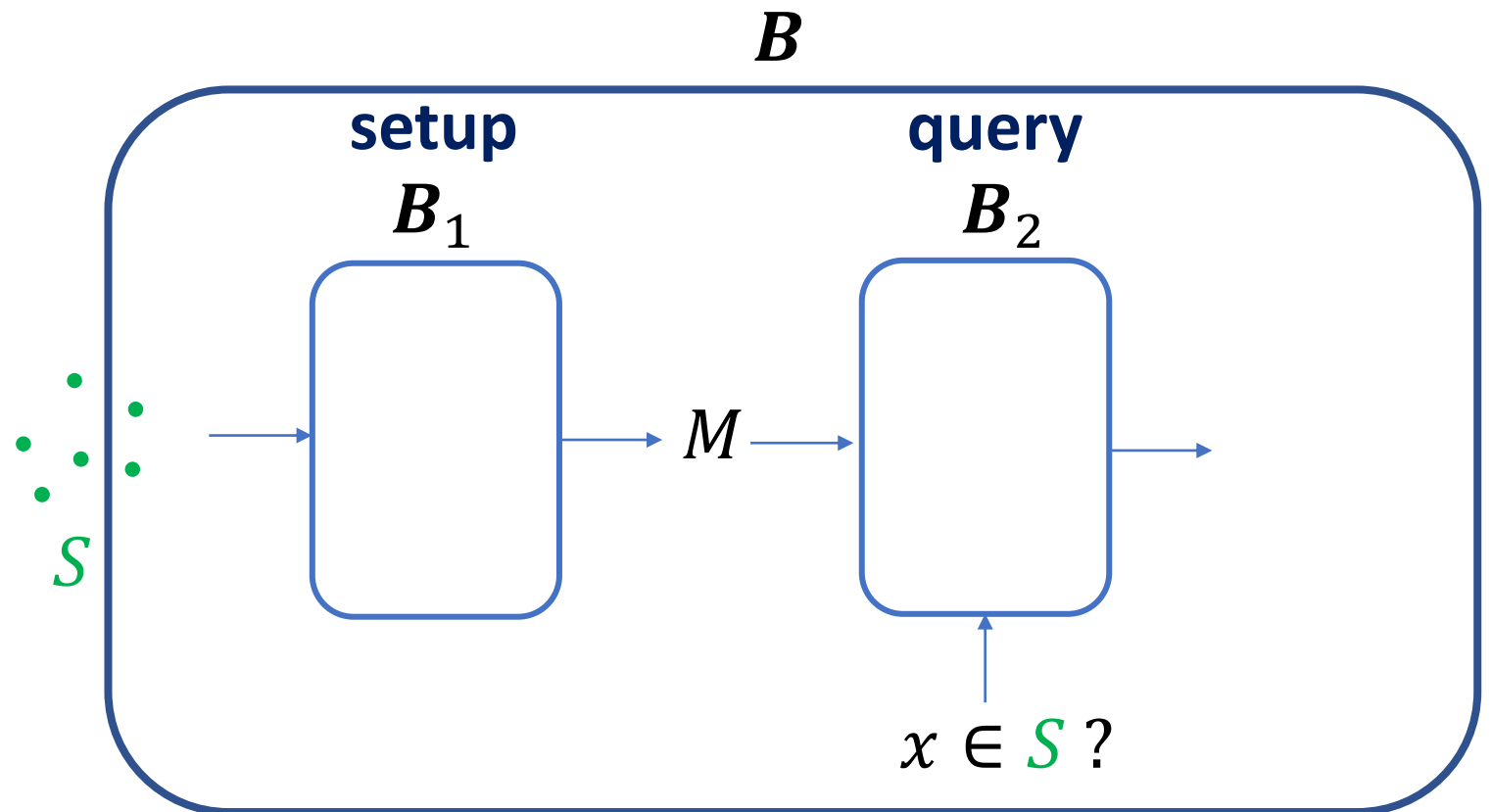


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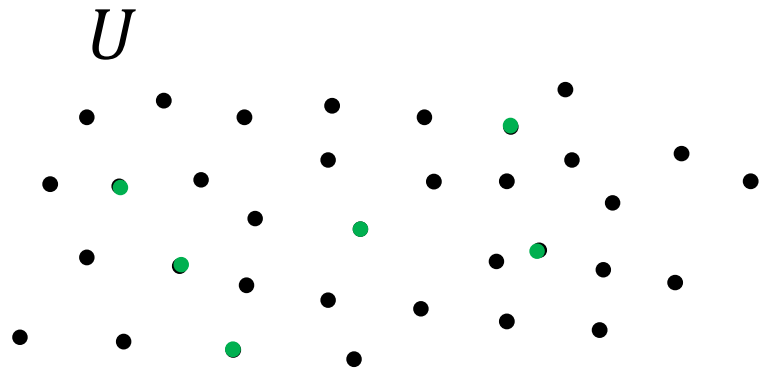


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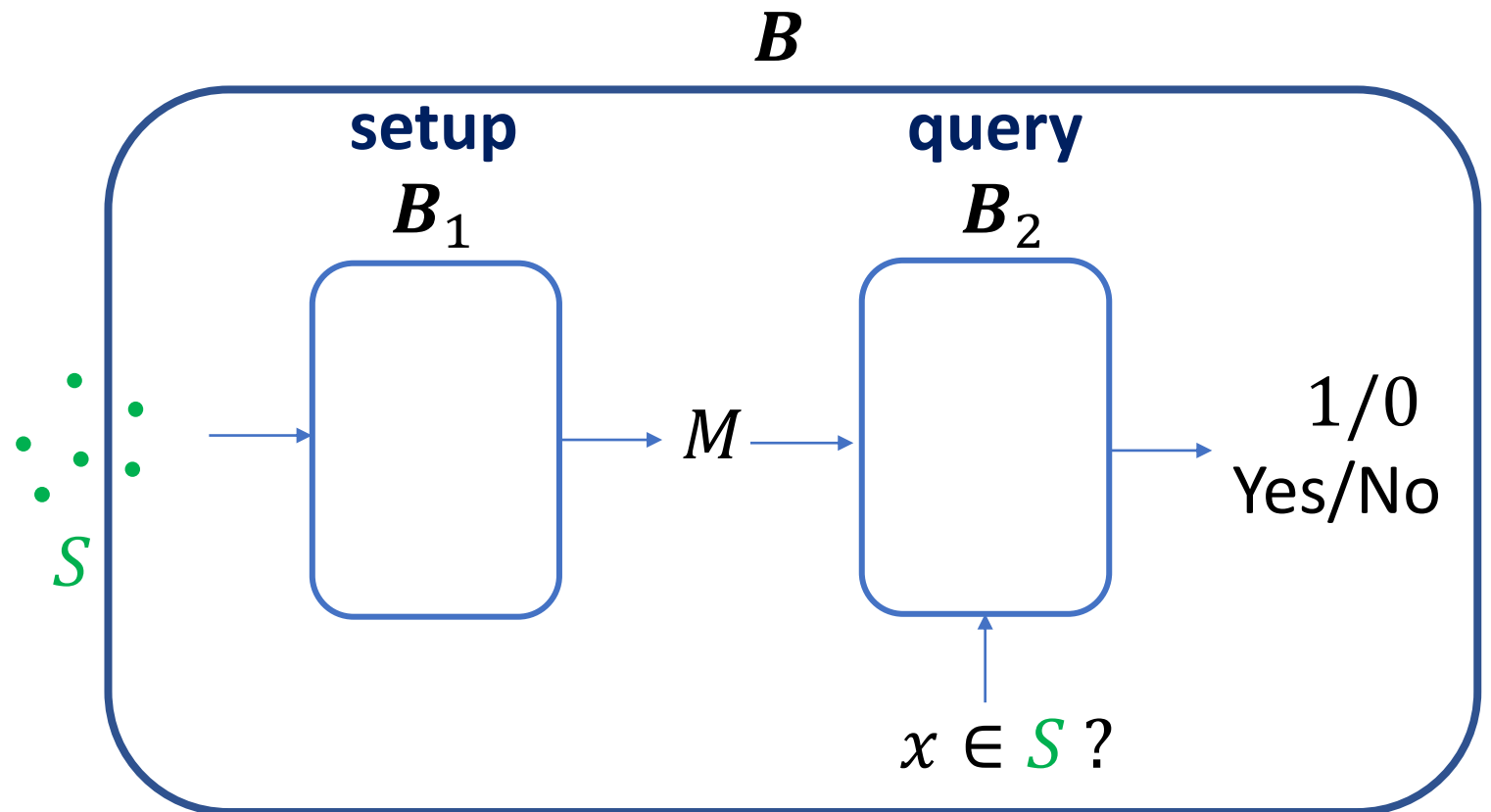


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# Bloom Filters

## Definition:

$\mathbf{B}_{n,\epsilon}$  satisfies that for all sets  $S$  of size  $n$ :

- For any  $x \in S$ :  $\mathbf{B}_{n,\epsilon}$  outputs “Yes”
- For any  $x \notin S$ :  $\Pr[\mathbf{B}_{n,\epsilon}(x) \text{ outputs “Yes”}] \leq \epsilon$

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Memory Lower Bound [CFG+78]:  $n \log \frac{1}{\epsilon} \leq \text{memory} \ll |S|$

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*non-negligible*

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set representation

# Goal

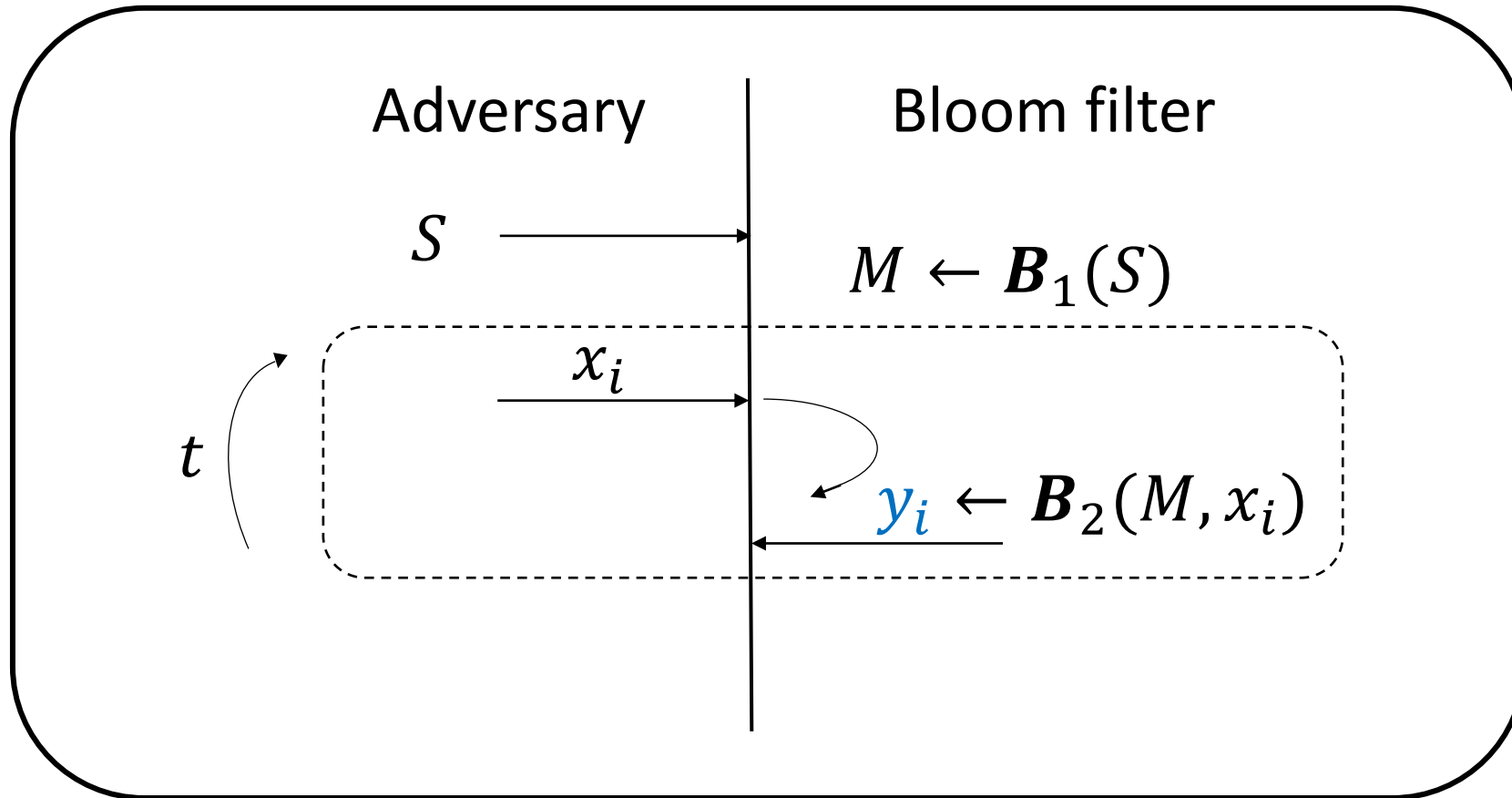
Find a fundamental definition for **robust Bloom filter**

Previous work: [NY15],[BFG+18]

# Settings

$\lambda$ : security parameter

## Adaptive Game [based on NY15]



# Robust Bloom filter

**Wishful thinking:**

Robust Bloom filter  $\approx$  truly unpredictable  $\epsilon$ -biased coin

$$(y_1, \dots, y_t) \approx (\text{coin}_1, \dots, \text{coin}_t)$$



# Robust Bloom filter



## Wishful thinking:

Robust Bloom filter  $\approx$  truly unpredictable  $\epsilon$ -biased coin

$$(y_1, \dots, y_t) \approx (\text{coin}_1, \dots, \text{coin}_t)$$

**Motivation:** avoid clusters of false positives

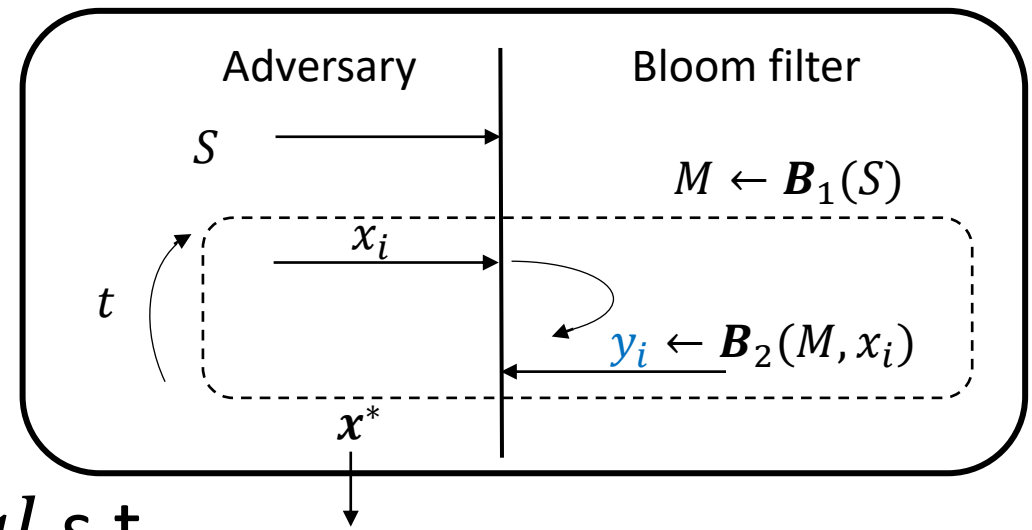
0001111111001      ,1 = FP

# Previous Work [NY15]

(informal) Definition [NY15]:

$\mathcal{B}_{n,\epsilon}$  satisfies **NY15** if  $\forall$  PPT  $\mathcal{A} \exists \text{negl}$  s.t.

$$\Pr[x^* \text{ is false positive}] \leq \epsilon + \text{negl}(\lambda)$$





# Previous Work [NY15]

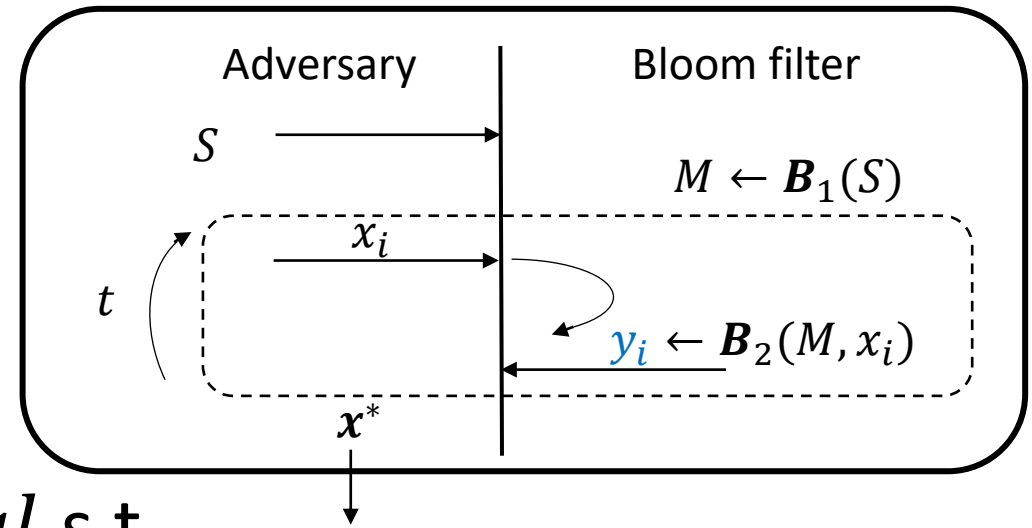
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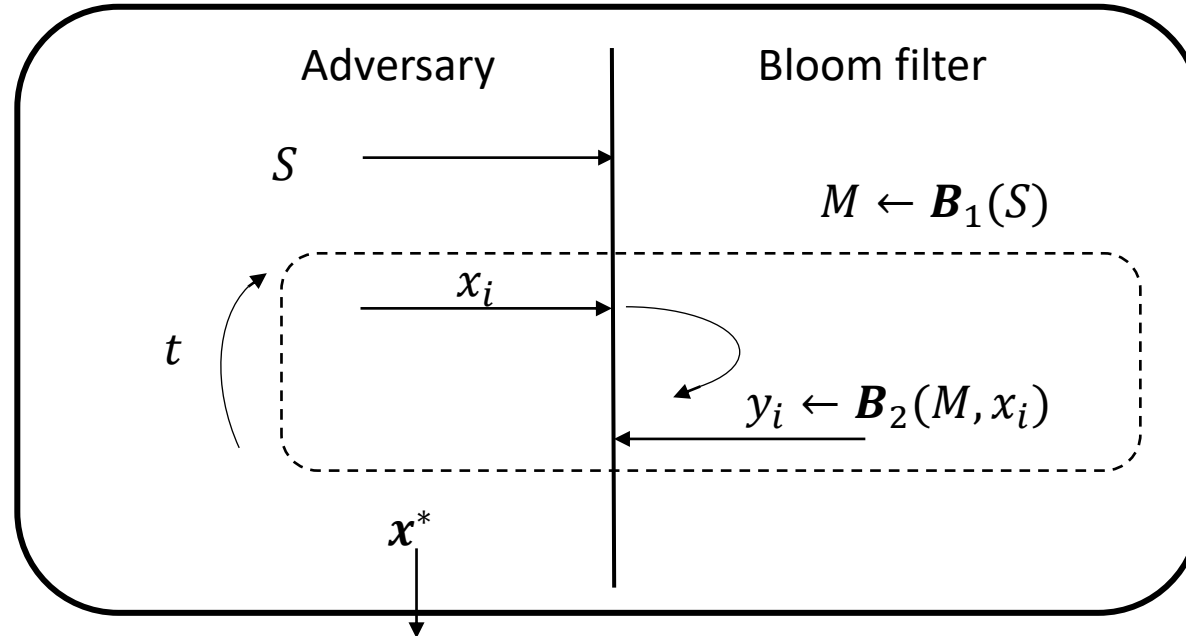
NY15 **does not** satisfies our wishful thinking:

$$(y_1, \dots, y_t) \not\approx (\$)_1, \dots, (\$)_t$$



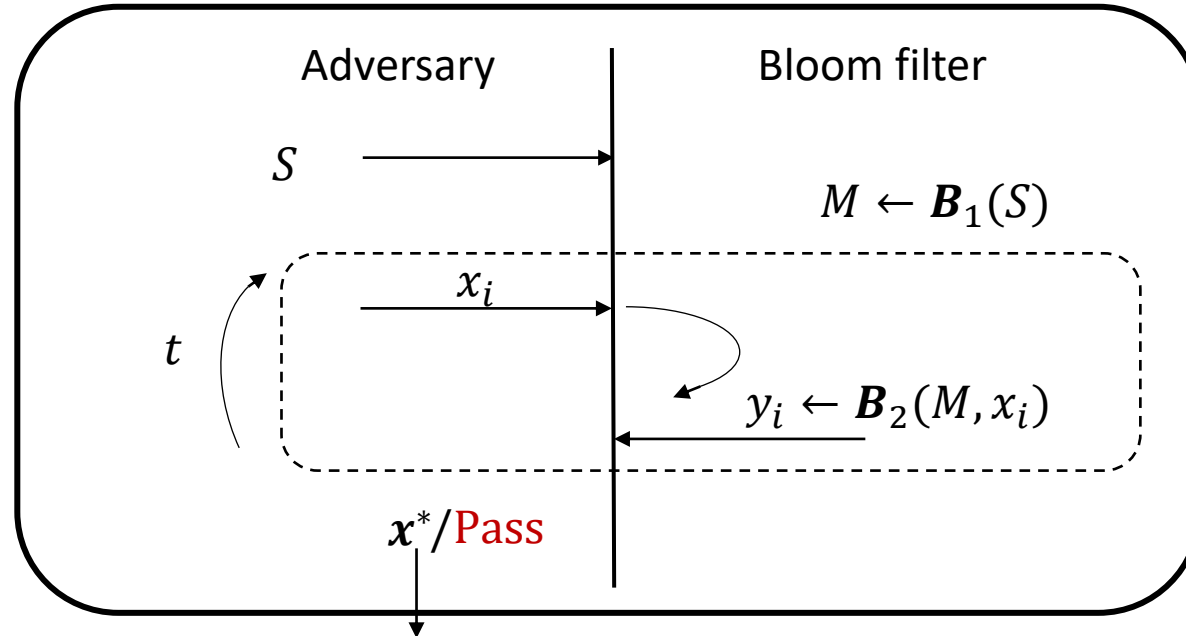
# Main Result

Introduce *Bet-or-Pass* (BP), we allow the adversary to **Pass**



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# Main Result

Adversary Profit:

$$Profit_{\mathcal{A}} = \begin{cases} 1/\varepsilon & \text{if } \mathcal{A} \text{ outputs a false positive} \\ -1/(1 - \varepsilon) & \text{if } \mathcal{A} \text{ outputs **not** a false positive} \\ 0 & \text{if } \mathcal{A} \text{ passes} \end{cases}$$

Note: The expected profit of  $\varepsilon$ -biased coin is 0

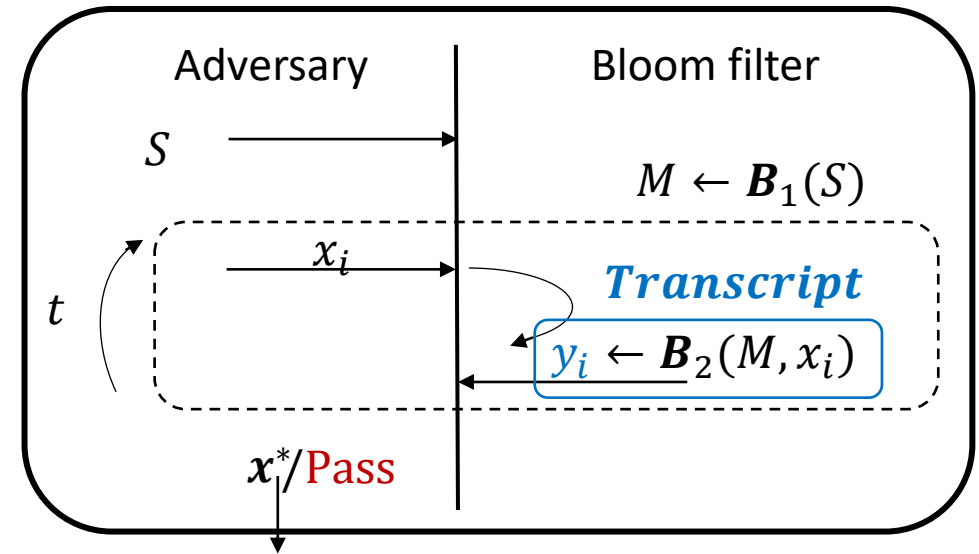
(informal) Definition:

$B_{n,\varepsilon}$  satisfies **Bet-or-Pass (BP)** if  $\forall$  PPT  $\mathcal{A} \exists \text{negl}$  s.t.

$$\mathbb{E}[Profit_{\mathcal{A}}] \leq 0 + \text{negl}(\lambda)$$

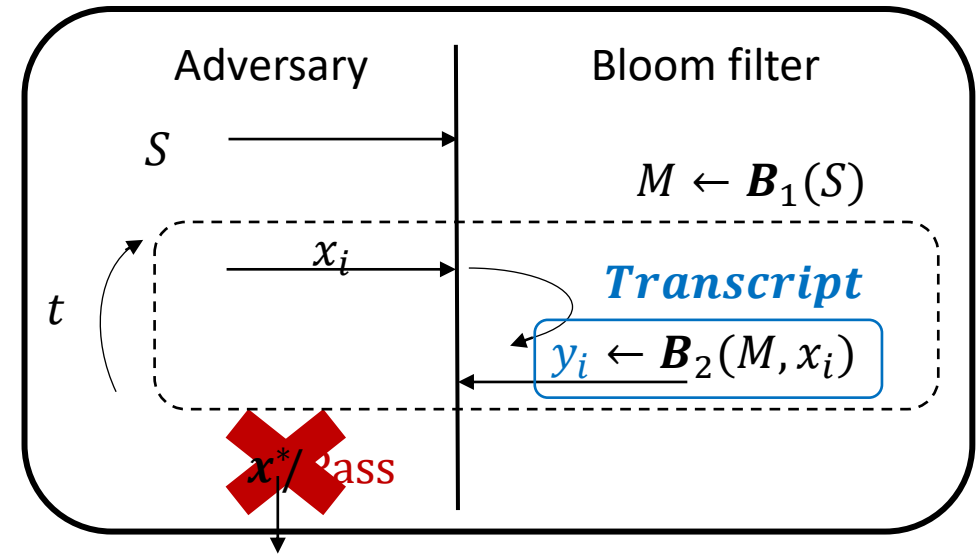
# Formalize Wishful Thinking

## Monotone Test



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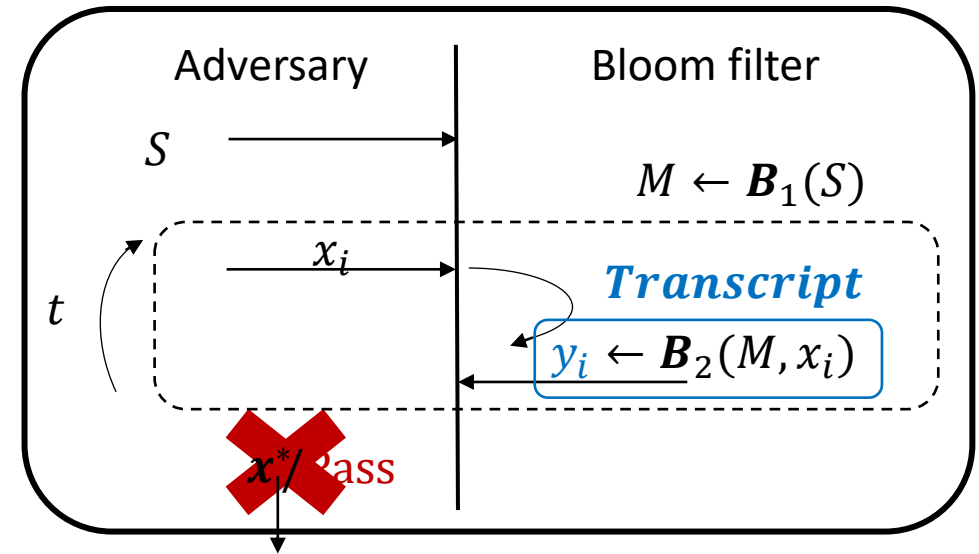
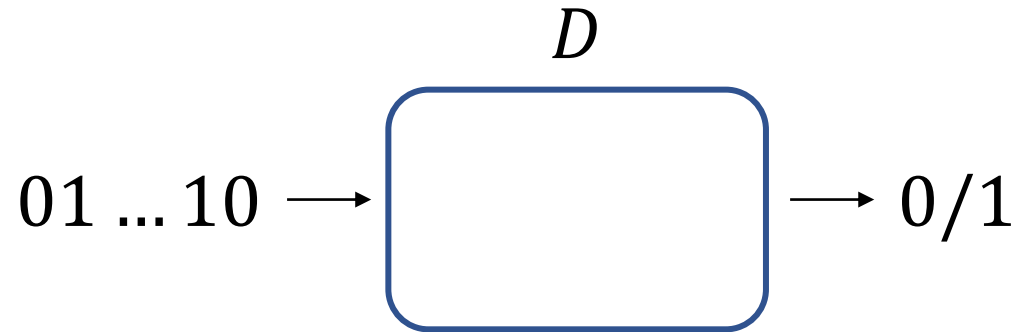
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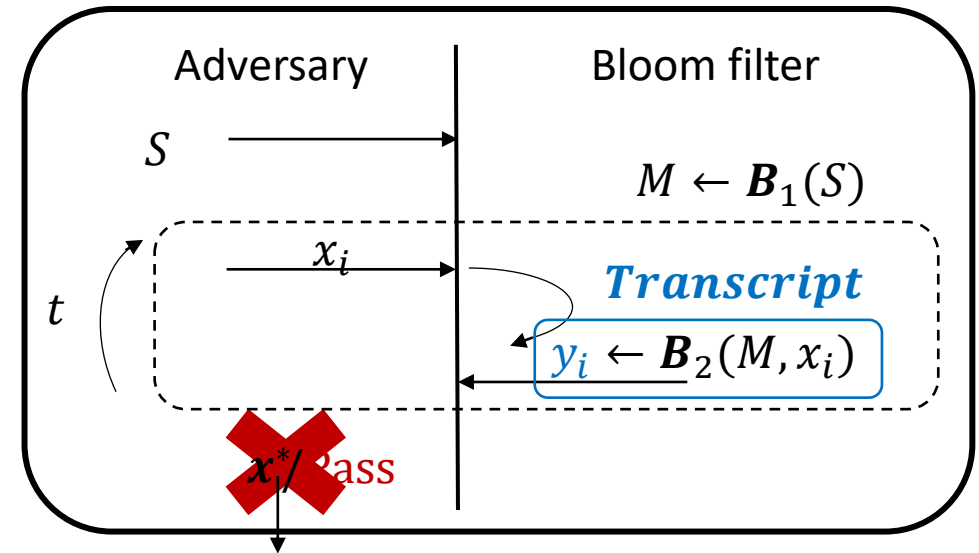
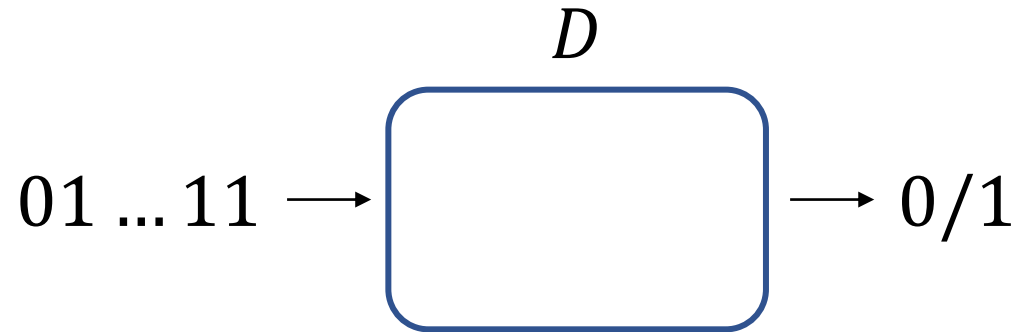
Distinguisher:



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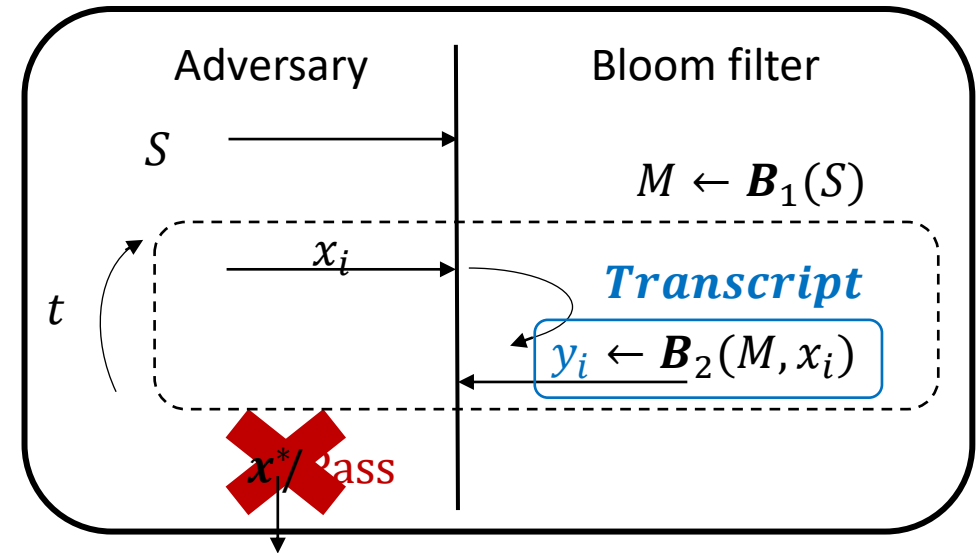
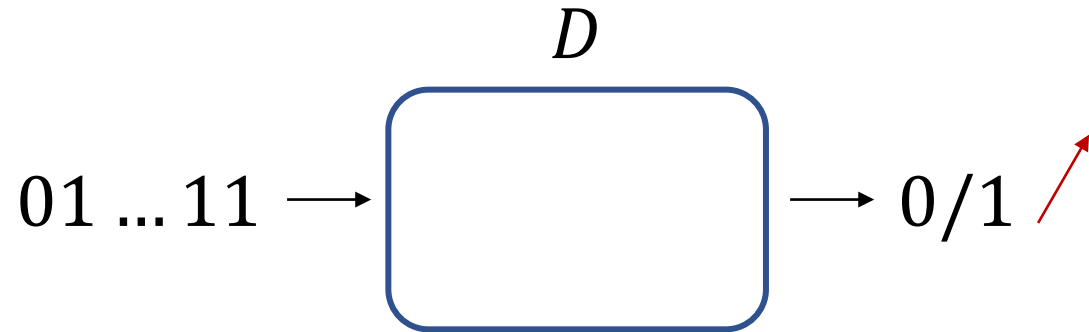




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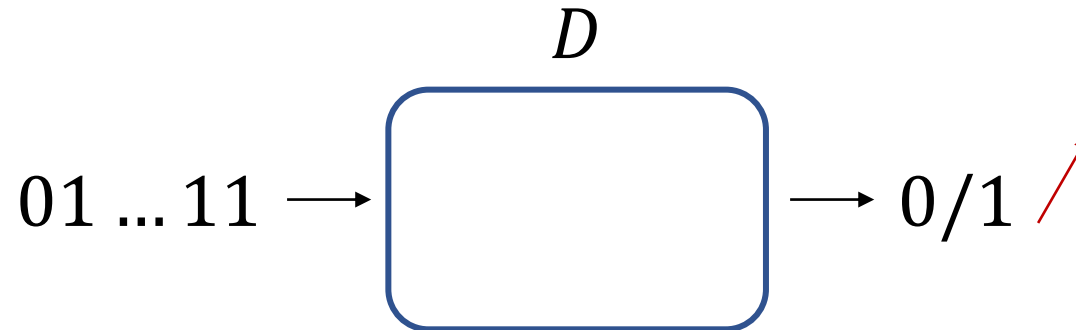
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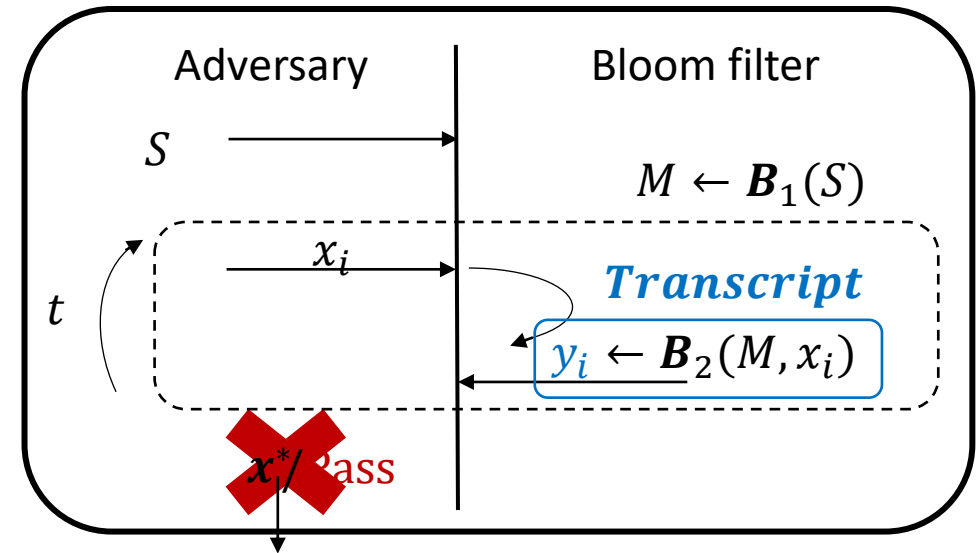
## Monotone Test

Distinguisher:



Example:

- **Cluster:** outputs 1 iff the sequence contains  $w$  consecutive 1's.



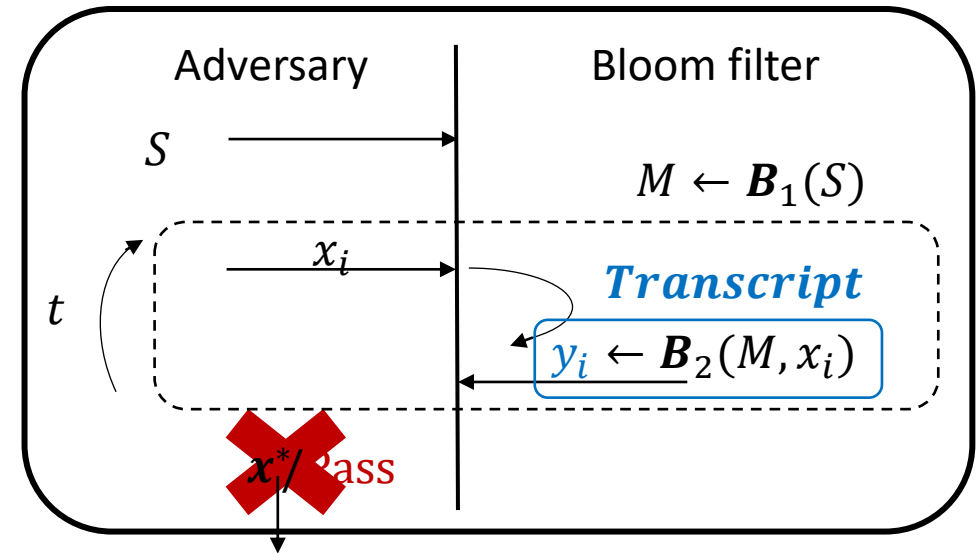
# Formalize Wishful Thinking

## Monotone Test

(informal) Definition:

$\mathcal{B}_{n,\epsilon}$  satisfies **Monotone Test** if  $\forall$  Monotone PPT distinguisher  $D$  and  $\forall$  PPT  $\mathcal{A} \exists \text{negl}$  s.t.

$$\Pr_{\mathcal{S} \in \text{Transcript}} [D(\mathcal{S}) = 1] - \Pr_{\mathcal{S} \in \mathbb{S}_{\epsilon}} [D(\mathcal{S}) = 1] \leq \text{negl}(\lambda)$$



# Main Result

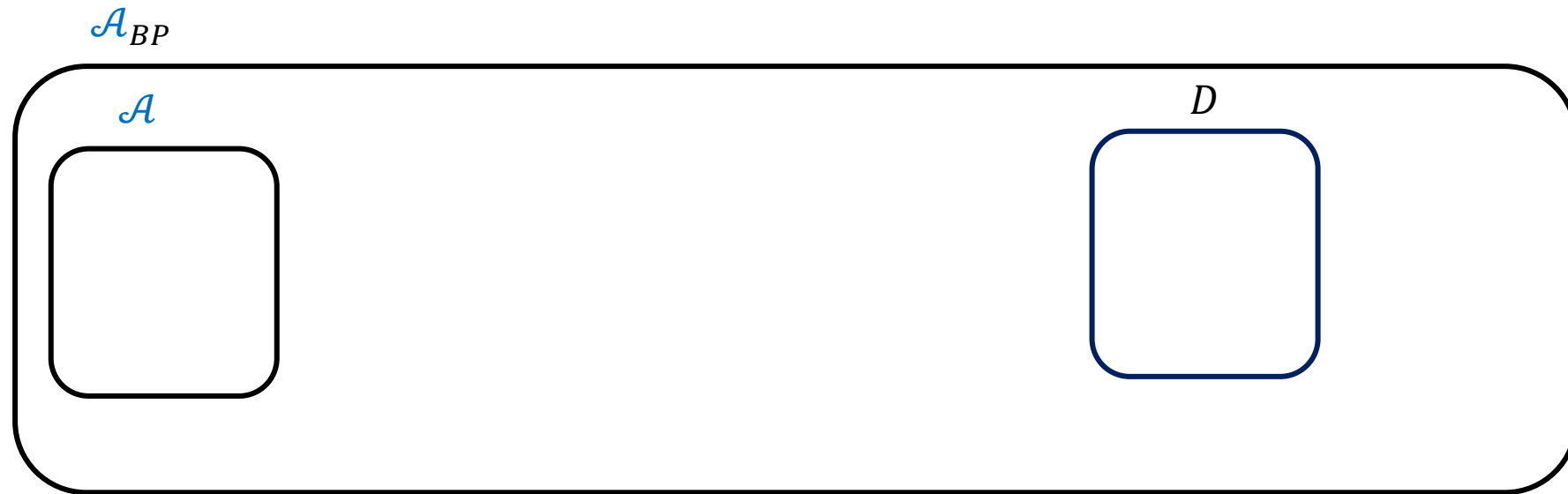
Let  $0 < \varepsilon < 1$  and  $n \in \mathbb{N}$ . Let  $\mathbf{B}_{n,\varepsilon}$  be **BP** test resilient Bloom filter. Then  $\mathbf{B}_{n,\varepsilon}$  is also **monotone** test resilient.

# Main Theorem: Proof Sketch

- Proof by contradiction
- We show how we can take  $\mathcal{A}$  and  $D$  and use them when building an adversary that can predict when it's best to bet.
- Hybrid argument

Theorem: BP  $\implies$  monotone

# Main Theorem: Proof Sketch



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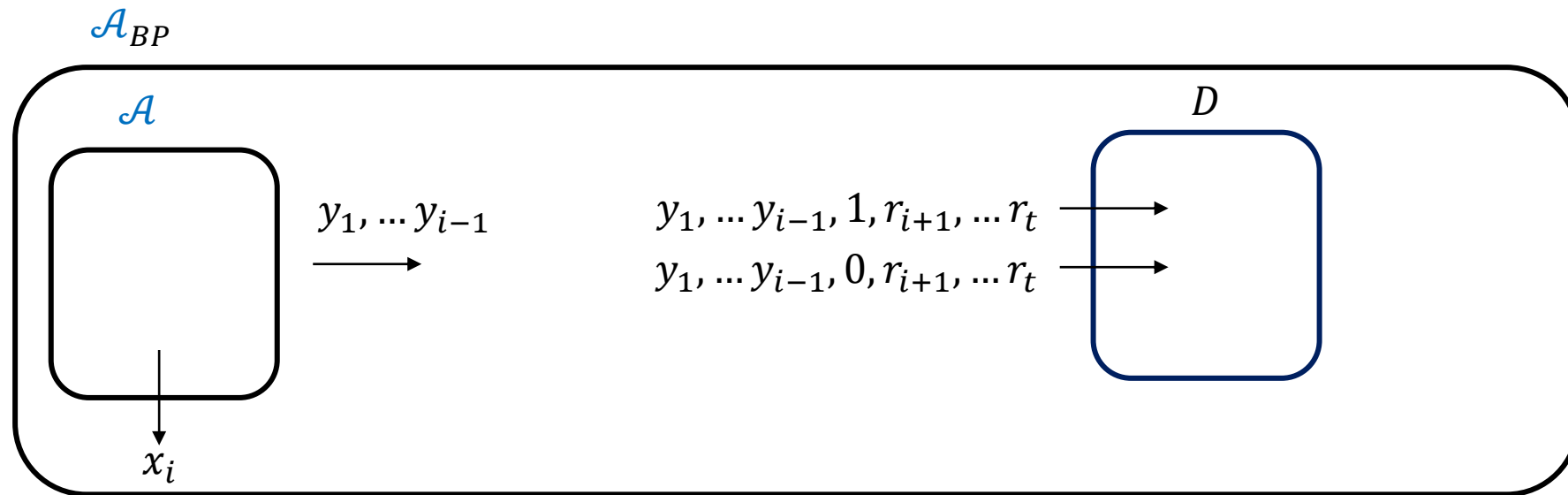
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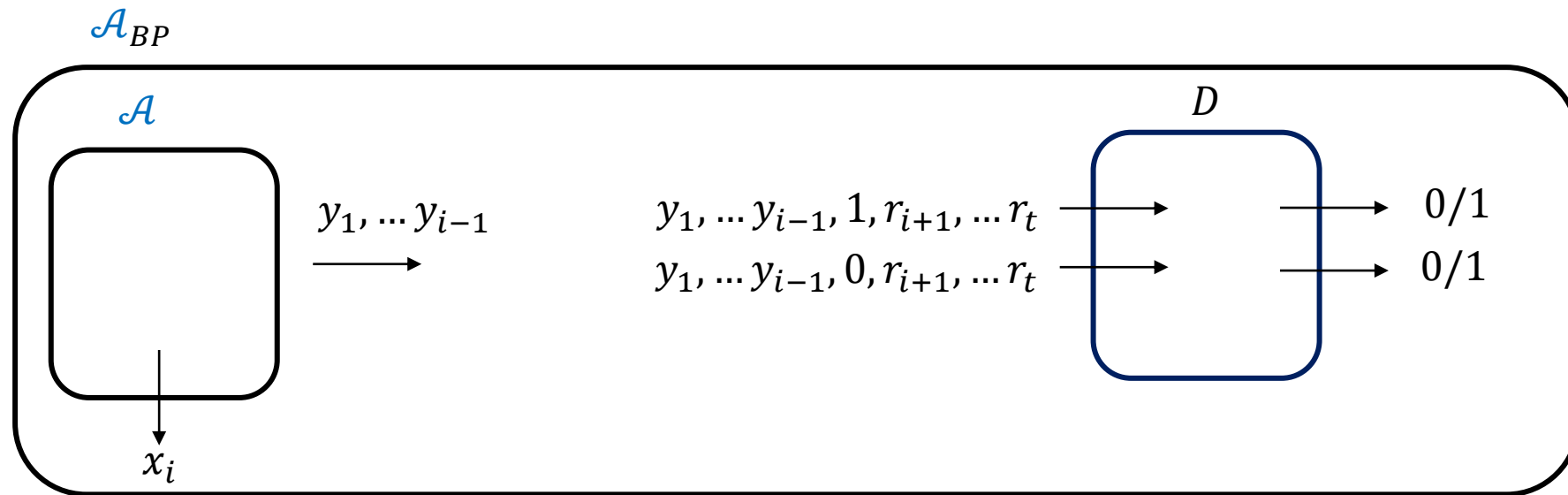
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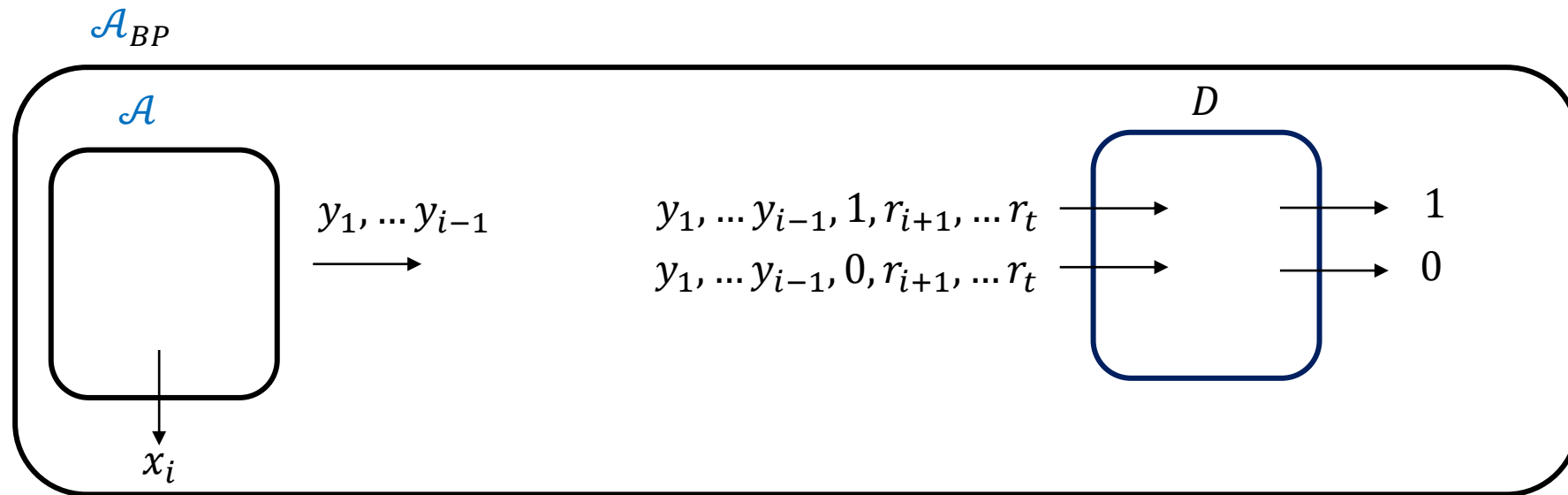
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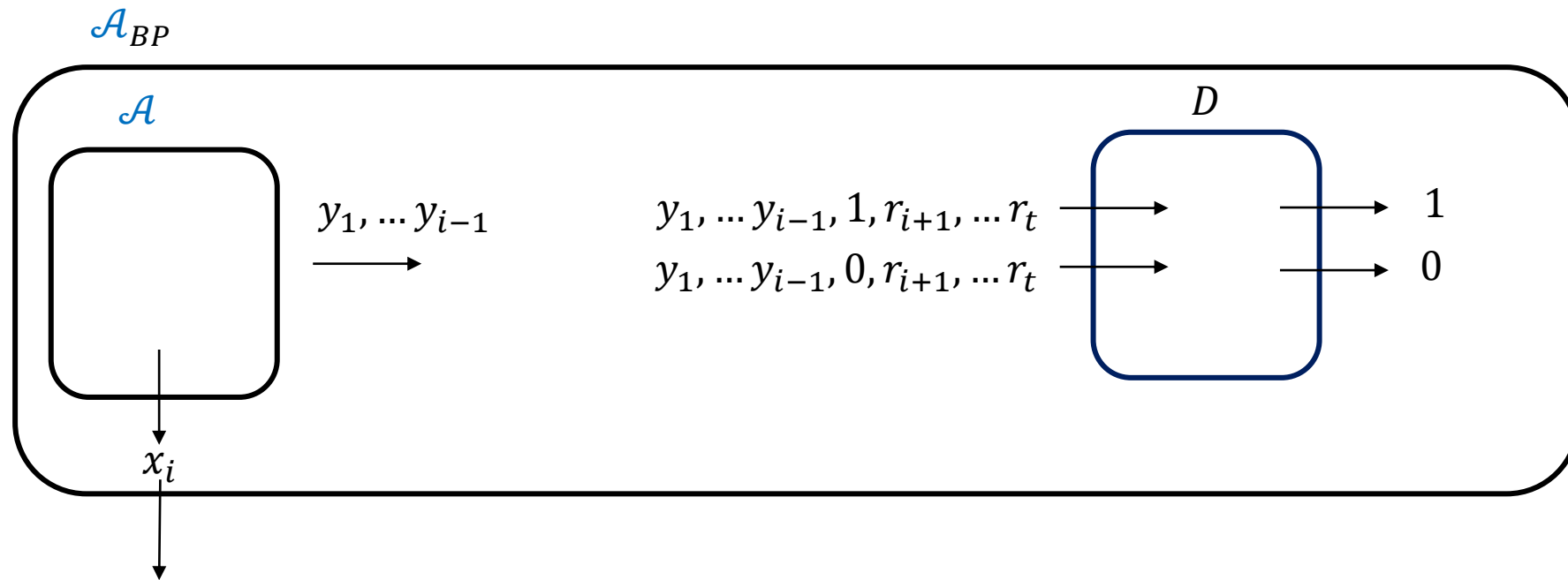
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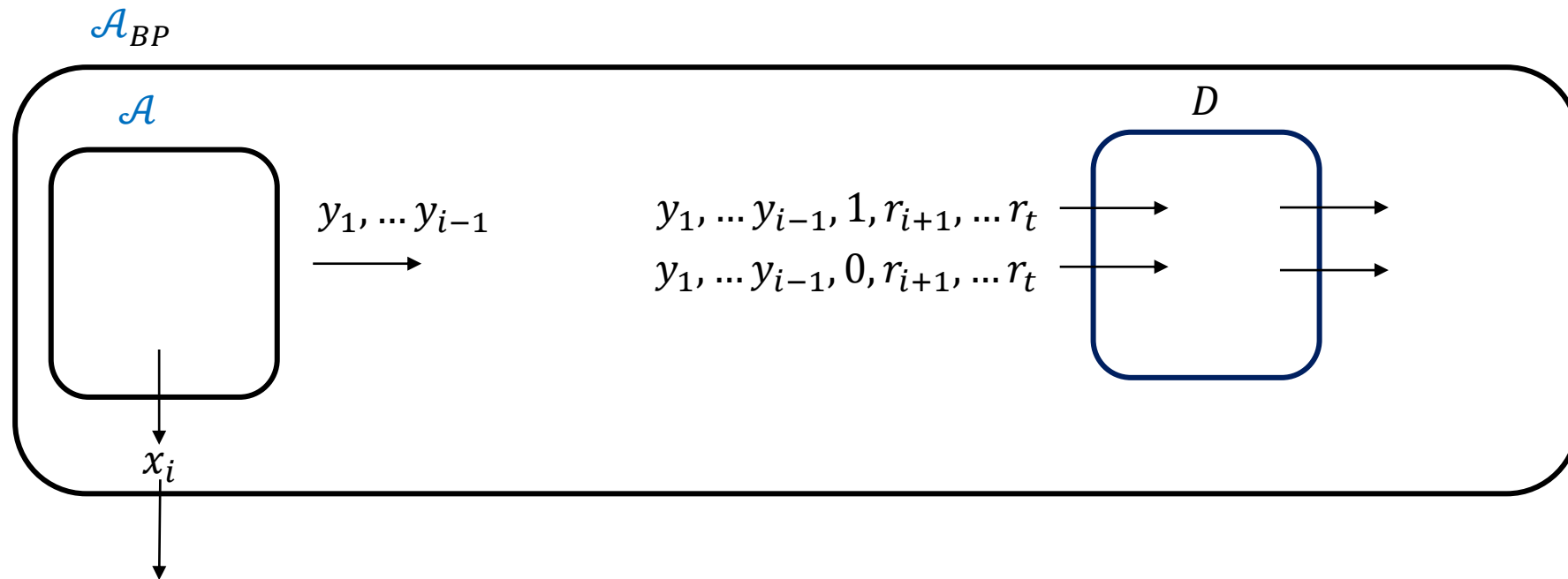
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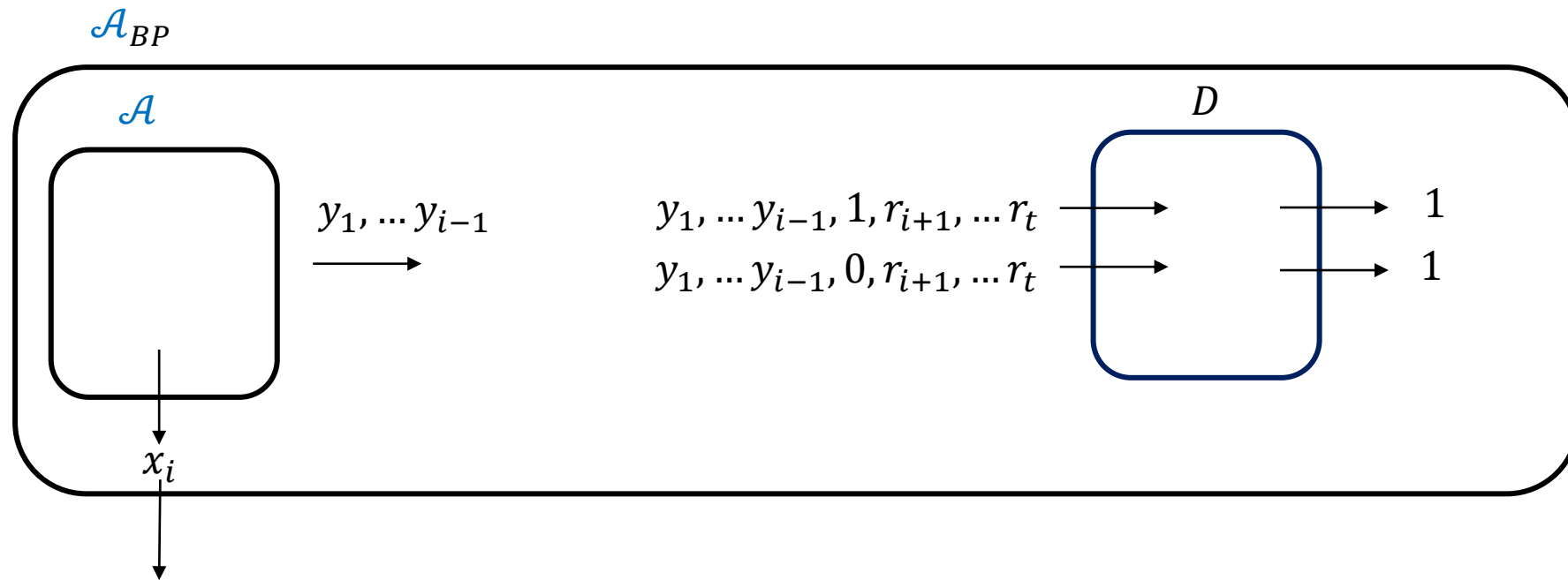
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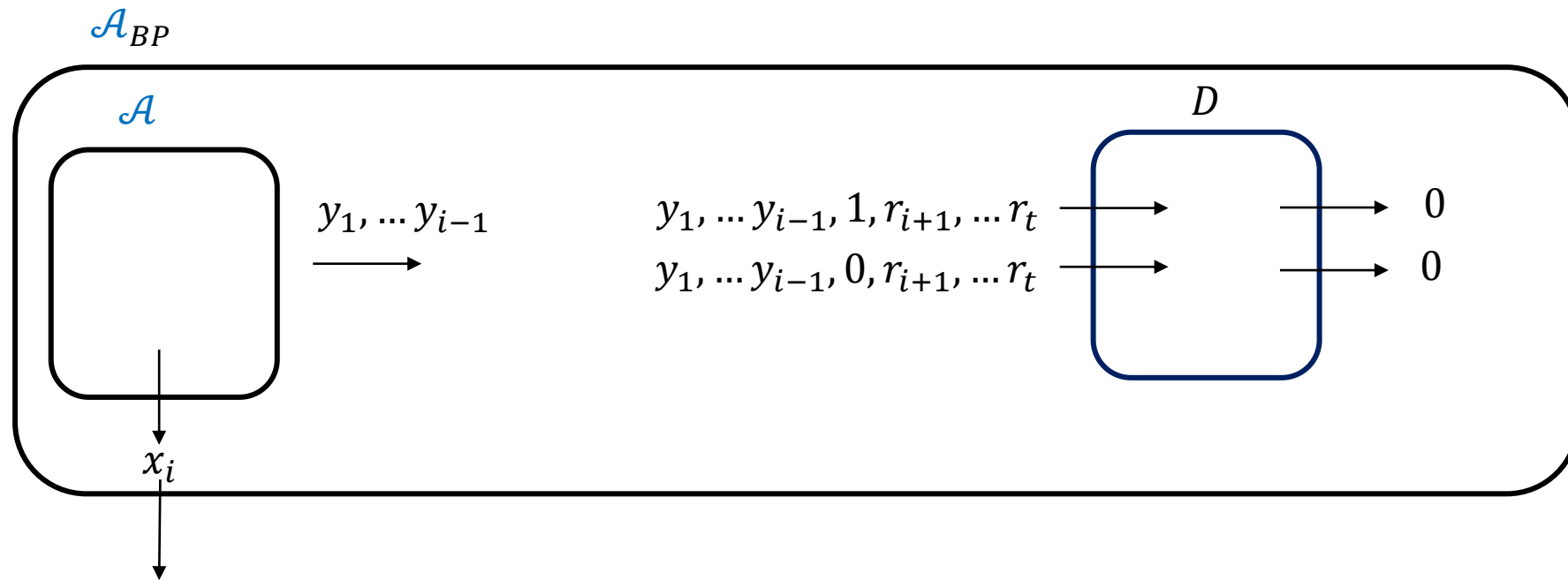
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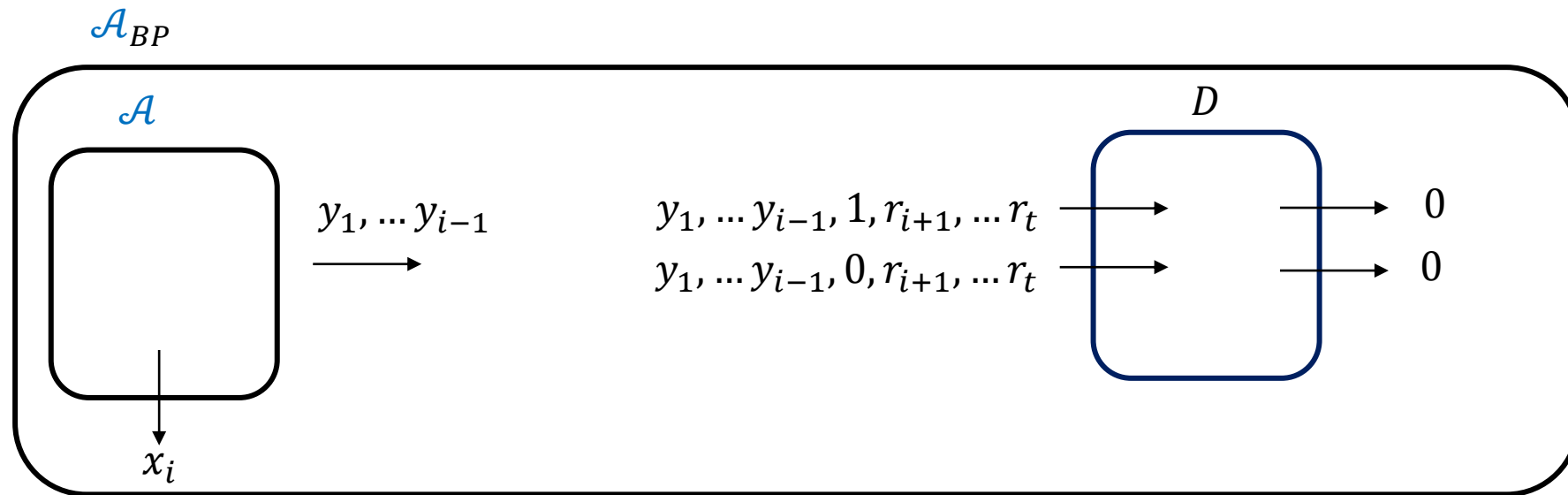
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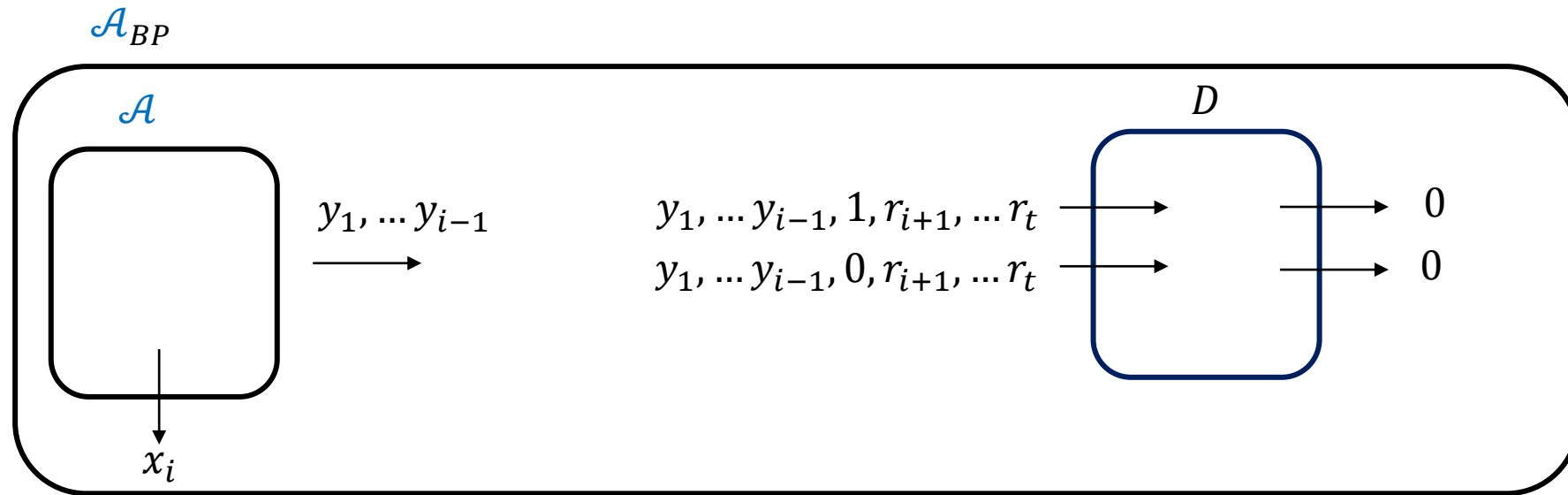
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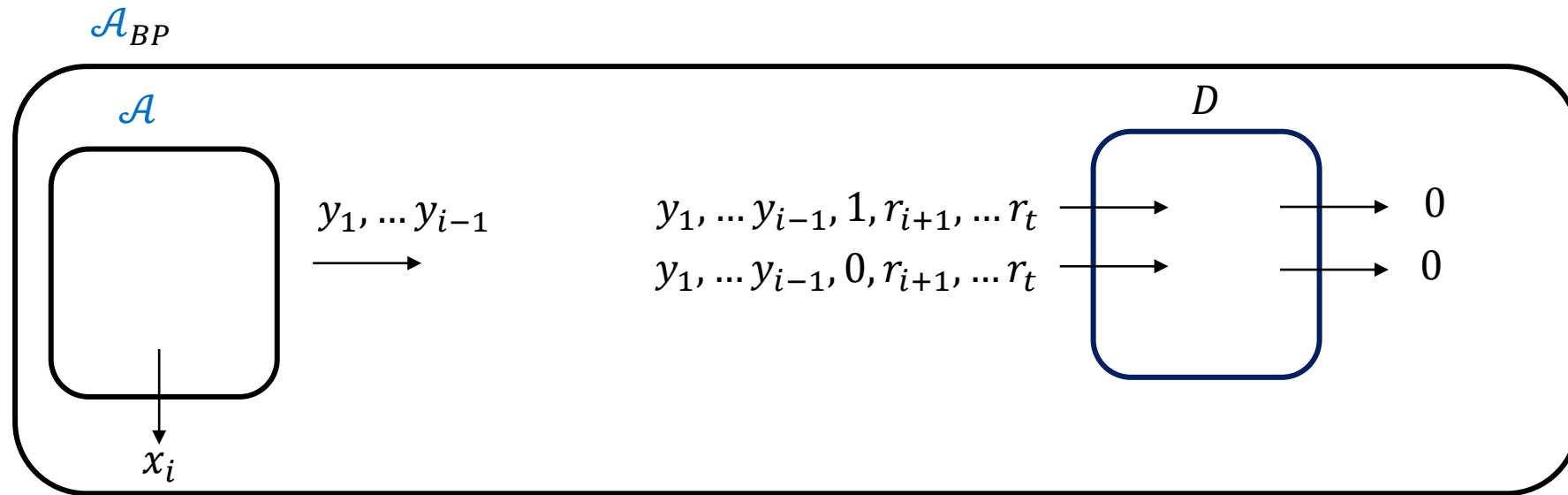
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$$\Pr[bet] > 0 \text{ and } \Pr[x_i \text{ is FP} \mid bet] > \varepsilon \implies \mathbb{E}[Profit_{\mathcal{A}_{BP}}] > 0$$

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# Summary and More

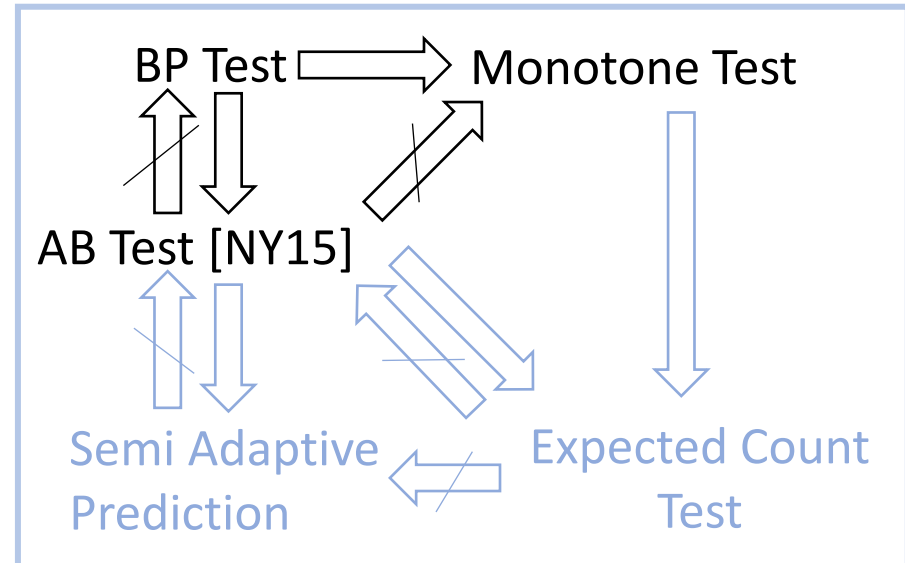
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  - Construction based on OWF
  - More (weaker) notions

Paper:  
Bet-or-Pass: Adversarially Robust Bloom Filters  
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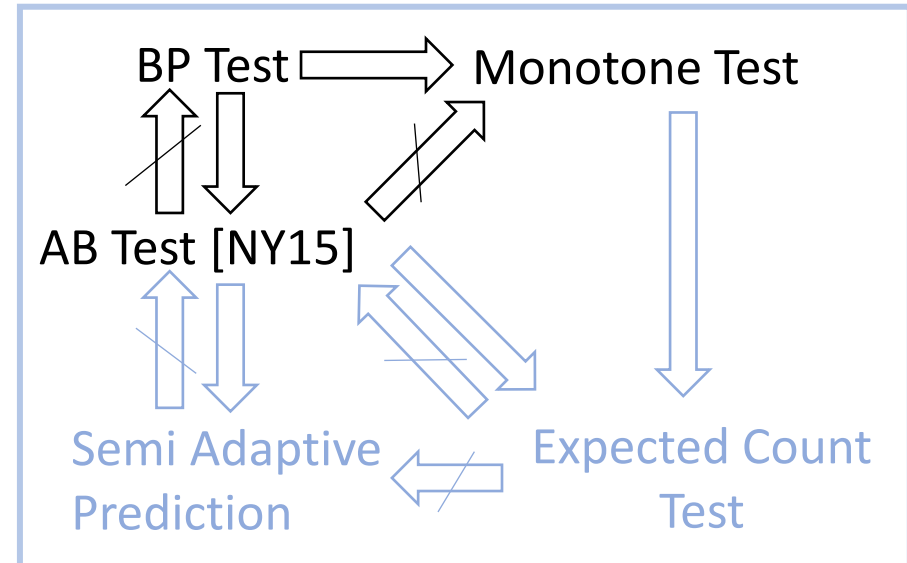
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- Open Questions:
  - Monotone Test Resilience implies BP Test Resilience?
  - Allowing repetitions [BFG+18]
  - And more

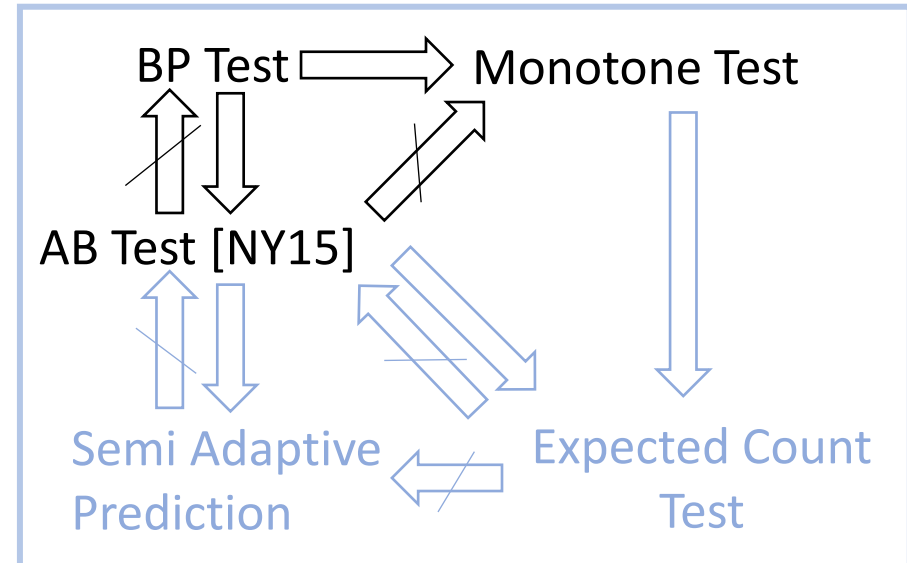
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Thank You!