

# CS459/698

## Privacy, Cryptography, Network and Data Security

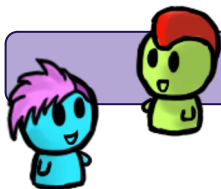
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Multi-Party Computation, PSI, PIR

Winter 2025, Monday/Wednesday 4:00pm-5:20pm

# What is Multi-Party Computation?

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**1) At least two parties**

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I have input y



I have input x

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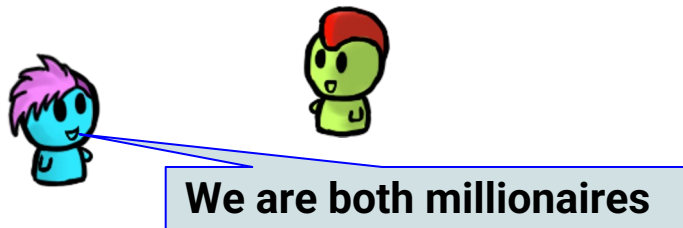
2) Both Alice and Bob know a function  $f$

**Goal:** learn  $f(x, y)$  but not reveal anything else about  $x$  or  $y$

**Critical:** Secret inputs, public outputs (to at least one party)

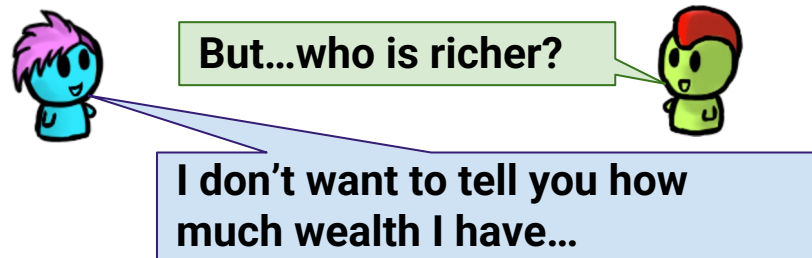
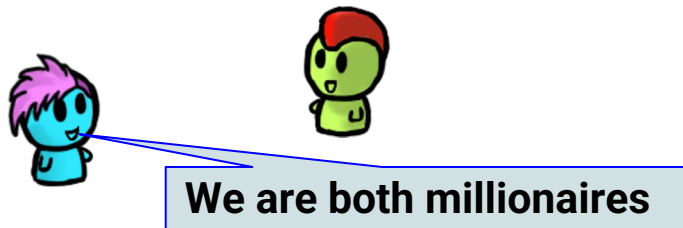
# Toy Example, “The Millionaire's Problem”

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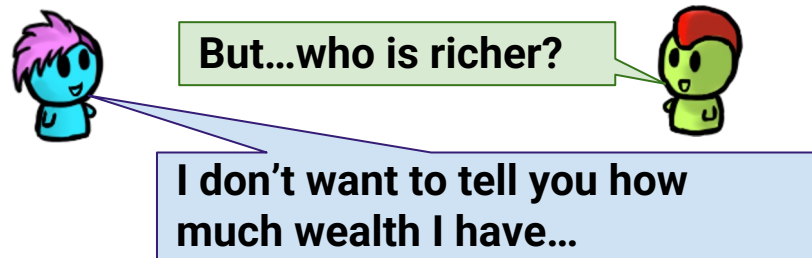
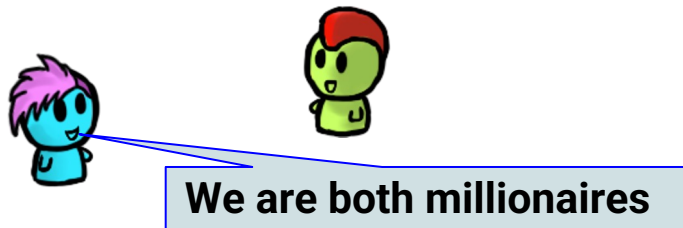
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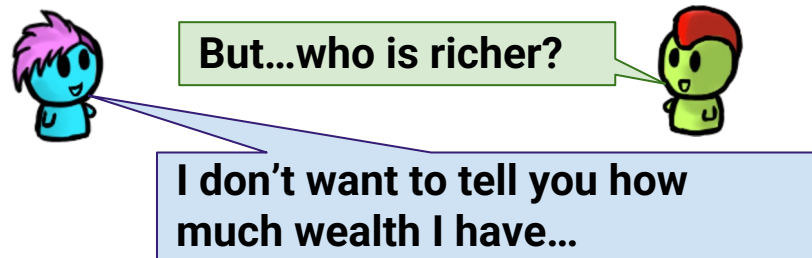
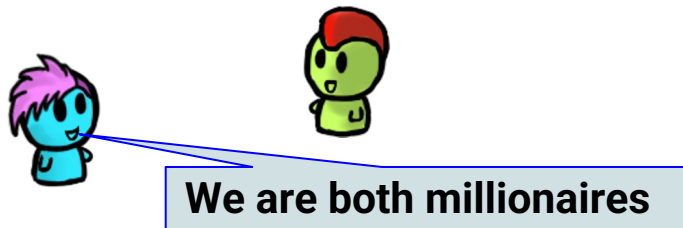


# Toy Example, “The Millionaire's Problem”



Q: how can Bob and Alice determine who is richer?

# Toy Example, “The Millionaire's Problem”



**Q:** how can Bob and Alice determine who is richer?

**A:** A multi-party computation to compute  $f: x < y$

## Fun Facts:

- Andrew C. Yao, Protocols for Secure Computations Proceedings of the 21st Annual IEEE Symposium on the Foundations of Computer Science, 1982
- “Yao’s millionaires’ problem” (Andrew C. Yao, Turing Award 2000)

# Solution



\$  $i$  millions

$E_a = \text{Enc w/PubA}$

$D_a = \text{Dec w/ PrivA}$



\$  $j$  millions

Assume:

$1 < i, j < 10$

1. Bob picks a random  $N$ -bit integer  $\mathbf{x}$ , and computes  $\mathbf{k} = E_a(\mathbf{x})$
2. Bob sends Alice the number  $\mathbf{k} - \mathbf{j} + 1$
3. Alice computes  $\mathbf{y}_u = D_a(\mathbf{k} - \mathbf{j} + \mathbf{u})$  for  $\mathbf{u} = [1, 2, \dots, 10]$ .
4. Alice generates random prime  $\mathbf{p}$  of  $N/2$ -bits, and computes  $\mathbf{z}_u = \mathbf{y}_u \pmod{\mathbf{p}}$ 
  - if all  $\mathbf{z}_u$  differ by at least 2 mod  $p$ , stop;
  - otherwise, generate another  $\mathbf{p}$  and repeat until all  $\mathbf{z}_u$  differ by at least 2 mod  $p$
5. Alice sends the prime  $\mathbf{p}$  and the following 10 numbers to Bob:
  - $\mathbf{z}_1, \mathbf{z}_2, \dots, \mathbf{z}_i$  followed by  $\mathbf{z}_{i+1} + 1, \mathbf{z}_{i+2} + 1, \dots, \mathbf{z}_{10} + 1$
6. Bob looks at  $\mathbf{z}_j$ , and decides that  $i \geq j$  if  $\mathbf{z}_j = \mathbf{x} \pmod{p}$ , and  $i < j$  otherwise. Tells Alice.

# Solution Rundown



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Assume:

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Let's use RSA as our crypto scheme!

**Alice holds:**

PubA =  $(e, N) = (79, 3337)$

PrivA =  $(d) = 1019$

**RSA operations:**

Encryption:  $y = x^e \bmod N$

Decryption:  $x = y^d \bmod n$

# Solution Rundown



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$E_a = \text{Enc w/ PubA}$

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\$  $j$  millions

Assume:

$1 < i, j < 10$

For this example, assume Alice has 5 millions ( $i = 5$ ) and Bob has 6 millions ( $j = 6$ )

## Step 1:

- Bob picks a random N-bit integer  $x = 1234$
- Bob computes  $k = E_a(x) = 1234^{79} \bmod 3337 = 901$

## Step 2:

- Bob sends Alice  $\underline{k} - \underline{j} + \underline{1} = 901 - 6 + 1 = 896$

# Solution Rundown



\$  $i$  millions

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\$  $j$  millions

Assume:

$1 < i, j < 10$

## Step 3:

- Alice generates  $Y_1 \dots Y_{10}$ , obtained by decrypting  $k - j + 1$  to  $k - j + 10$ 
  - This is because of our bound that tells us Alice and Bob have a number of millions between 1 and 10
  - i.e.,  $u = [1 \dots 10]$
- Alice can do this even without knowing  $k$  or  $j$
- *So, what does she get?*

# Solution Rundown



\$  $i$  millions

$E_a = \text{Enc w/PubA}$

$D_a = \text{Dec w/ PrivA}$



\$  $j$  millions

Assume:

$1 < i, j < 10$

$u$	$k - j + u$	<i>RSA decryption</i>	$y_u$
1	896	$896^{1019} \bmod 3337$	1059 → The original value Bob sent
2	897	$897^{1019} \bmod 3337$	1156
3	898	$898^{1019} \bmod 3337$	2502
4	899	.	2918
5	900	.	385
6	901	.	1234 (as it should be) → Bob's random number
7	902	.	296
8	903	.	1596
9	904	.	2804
10	905	$905^{1019} \bmod 3337$	1311

# Solution Rundown



\$  $i$  millions

$E_a = \text{Enc w/PubA}$

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\$  $j$  millions

Assume:

$1 < i, j < 10$

## Step 4:

- Next, Alice generates prime number  $p$  of  $N/2$  bits
- In this example, let's pick  $p = 107$
- Then, Alice generates  $Z_1 \dots Z_{10}$ , obtained by computing  $Y_1 \dots Y_{10} \bmod p$
- Keep in mind that  $p$  must be such that all  $Z_u$  differ by at least 2 units
  - This will later allow Bob to reliably determine whether  $i < j$



# Solution Rundown



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  - This will later allow Bob to reliably determine whether  $i < j$
- ***So, what does she get?***

# Solution Rundown



\$  $i$  millions

$E_a = \text{Enc w/PubA}$

$D_a = \text{Dec w/ PrivA}$



\$  $j$  millions

Assume:

$1 < i, j < 10$

$u$	$k - j + u$	<i>RSA decryption</i>	$y_u$	$Z_u = (Y_u \bmod 107)$
1	896	$896^{1019} \bmod 3337$	1059	96
2	897	$897^{1019} \bmod 3337$	1156	86
3	898	$898^{1019} \bmod 3337$	2502	41
4	899	.	2918	29
5	900	.	385	64
6	901	.	1234	57
7	902	.	296	82
8	903	.	1596	98
9	904	.	2804	22
10	905	$905^{1019} \bmod 3337$	1311	27

# Solution Rundown



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$u$	$k - j + u$	<i>RSA decryption</i>	$y_u$	$Z_u = (Y_u \bmod 107)$
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All  $Z_u$  differ by at least 2

# Solution Rundown



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Assume:

$1 < i, j < 10$

## Step 5:

- Now, Alice sends  $p$  and 10 numbers to Bob
  - The first few numbers are  $Z_1, Z_2, Z_3 \dots$  up to the value of  $Z_i$ , where  $i$  is Alice's wealth in millions

$p$	$Z_1$	$Z_2$	$Z_3$	$Z_4$	$Z_5$	$Z_{6+1}$	$Z_{7+1}$	$Z_{8+1}$	$Z_{9+1}$	$Z_{10+1}$
107	96	86	41	29	64	58	83	99	23	28

# Solution Rundown



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Assume:

$1 < i, j < 10$

## Step 6:

- Bob now looks at the  $j^{\text{th}}$  number, where  $j$  is his wealth in millions

Bob looks at this value

$p$	$Z_1$	$Z_2$	$Z_3$	$Z_4$	$Z_5$	$Z_{6+1}$	$Z_{7+1}$	$Z_{8+1}$	$Z_{9+1}$	$Z_{10+1}$
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- He then computes  $x \bmod p = 1234 \bmod 107 = 57$
- Lastly, if the  $j^{\text{th}}$  number is equal to **57**, then Alice is equally wealthy (or more) than Bob ( $i \geq j$ ). Else, Bob is wealthier than Alice ( $i < j$ ).

# Solution Rundown



\$  $i$  millions

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107	96	86	41	29	64	58	83	99	23	28

- He then computes  $x \bmod p = 1234 \bmod 107 = 57$
- Lastly, if the  $j^{\text{th}}$  number is equal to **57**, then Alice is equally wealthy (or more) than Bob ( $i \geq j$ ). Else, Bob is wealthier than Alice ( $i < j$ ).
- Step 7:** Bob tells Alice the result



I'm wealthier!

# Why does the Solution Work?

---

## The intuition:

- Alice adds **1** to numbers in the series greater than her wealth ( $i = 5$ );
- Bob checks if the number in his position in the series ( $j = 6$ ) has had **1** added to it: if it has, then he knows he must be wealthier than Alice.



\$ I'm wealthier!

# Why does the Solution Work?

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## The intuition:

- Alice adds **1** to numbers in the series greater than her wealth ( $i = 5$ );
- Bob checks if the number in his position in the series ( $j = 6$ ) has had **1** added to it: if it has, then he knows he must be wealthier than Alice.
- All this has been done without either of them transmitting their wealth



# Any issues?

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**Q:** Can anyone identify a reason it would fail?

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**Short A:** Other than lies...no.

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**Q:** Can anyone identify a reason it would fail?

**Short A:** Other than lies...no.

**Long A:** This technique is not cheat-proof (Bob could lie in step 7). Yao shows that such techniques can be constructed so that cheating can be limited, usually by employing extra steps.

# How Scalable is this Solution?

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## **In the real-world:**

- You would need (lots of) processing power!

# How Scalable is this Solution?

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## In the real-world:

- You would need (lots of) processing power!
- Q: Any idea why?

# How Scalable is this Solution?

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## In the real-world:

- You would need (lots of) processing power!
- If you wanted to cover the range 1 to 100,000,000 at a unit resolution, then Alice will be sending Bob a table of 100,000,000 numbers!
- This table would be on the order of a GB. You could handle it, but processing and storage implications are non-trivial.

**New advances on MPC attempt to tackle these issues in clever ways...**

# A Potential “Real-World” Example

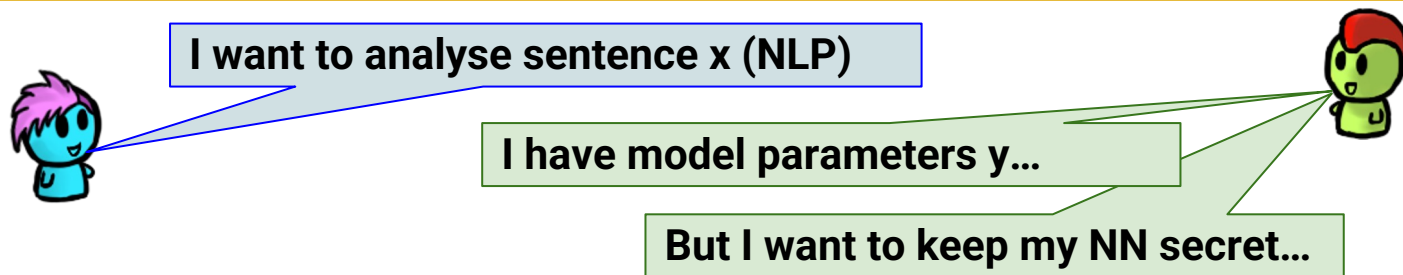
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I want to analyse sentence  $x$  (NLP)

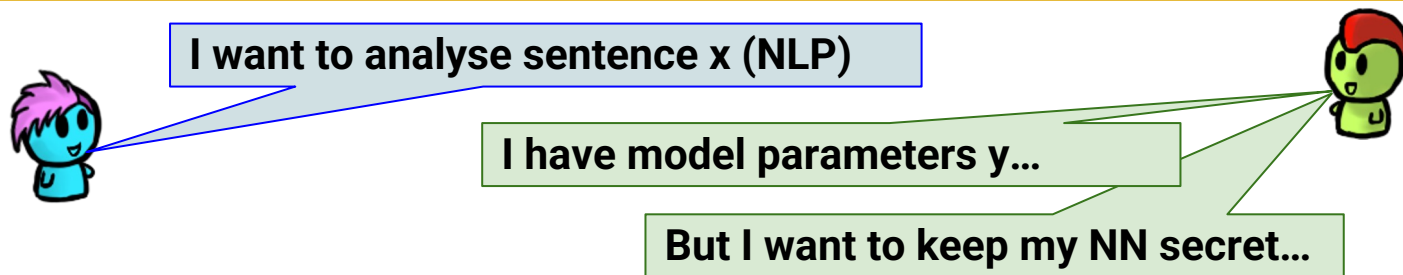
# A Potential “Real-World” Example

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# A Potential “Real-World” Example



**Require:** A function  $f$  over public parameters, but secret architecture

**Goal:** A MPC for  $f(x, y)$  such that only Alice learns the analysis of her sentence and Alice does not learn the NN

# “Types” of MPC: Participant Set

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**Two-party**



**Multi-Party**

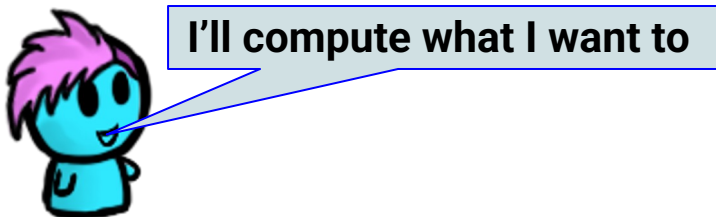
# MPC Server Model

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- Assume  $n \gg 3$  clients with an input
  - E.g., collect statistics about emoji usage in texting
- Dedicate 2 (or 3) parties as computation nodes (servers)
- The clients send “encrypted” versions of their inputs
- The servers perform multi-party computation
  - Decrypt input
  - Compute  $f$

# “Types” of MPC: Functionality

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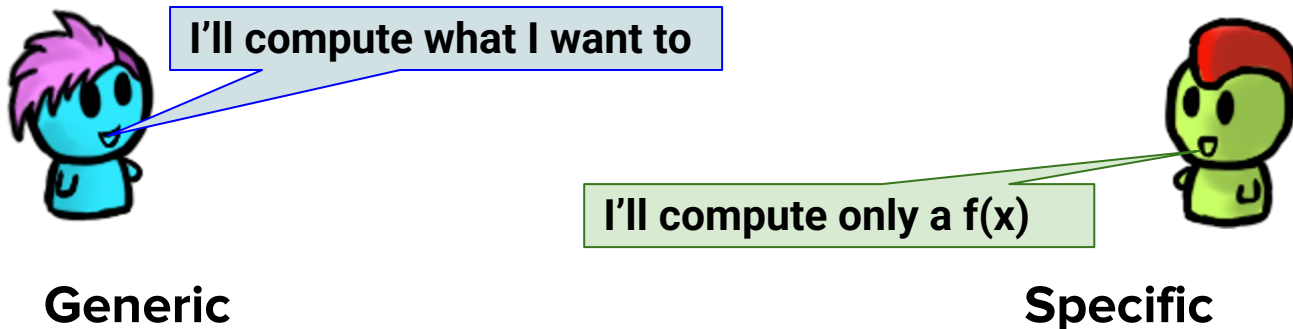


## Generic

Generic functions:

A multi-party computation protocol that can be used for **“any” function  $f$**

# “Types” of MPC: Functionality



## Generic functions:

A multi-party computation protocol that can be used for **“any” function  $f$**

## Specific functions:

A multi-party computation protocol that can only be used for **a specific function  $f$**

# “Types” of MPC: Security

---



I'm just curious

**Passive**

**Passive** security (security against **semi-honest adversaries**)

Each party **follows the protocol** but keeps a record of all messages and after the protocol is over, **tries to infer additional information** about the other parties' inputs

# “Types” of MPC: Security

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Each party **follows the protocol** but keeps a record of all messages and after the protocol is over, **tries to infer additional information** about the other parties' inputs



I'm beyond curious

**Active**

**Active** security (security against **malicious adversaries**)

Each party **may arbitrarily deviate from the protocol**.  
Either the protocol computes  $f$  or the protocol is aborted.

# Relationship between Passive and Active Security

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- Passive security is a **prerequisite** for active security
  - A protocol can be secure against passive adversaries but not active ones
  - A protocol secure against active adversaries is also secure against passive ones
- Any protocol secure against passive adversaries can be turned into a protocol secure against active adversaries
  - E.g., by adding protocol steps proving the correct computation of each message:
    - Cryptographic commitments: can we detect a participant deviates from the proto?
    - Validations: Are parameters within expected bounds?



Known as Goldreich's compiler (Oded Goldreich, Knuth Prize 2017)



# An MPC Application for a specific function: Private Set Intersection (PSI)

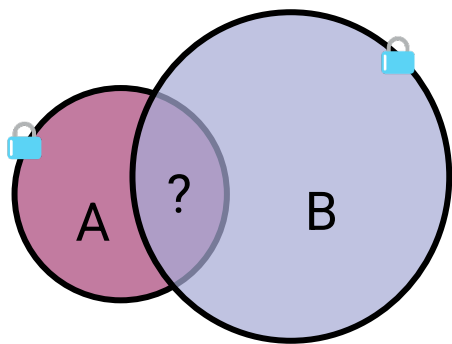
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# Private Set Intersection (PSI)

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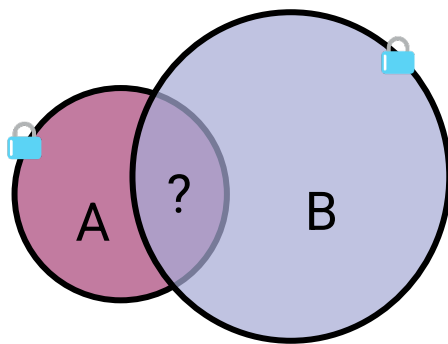
- Alice has set  $\mathbf{X} = \{x_1, x_2, x_3, \dots, x_n\}$
- Bob has set  $\mathbf{Y} = \{y_1, y_2, y_3, \dots, y_m\}$
- They want to compute  $\mathbf{Z} = \mathbf{X} \cap \mathbf{Y}$  (but reveal nothing else)
  
- Good real-world use case: private contact discovery
  - i.e., how many and which contacts do we have in common?

# Private Set Intersections



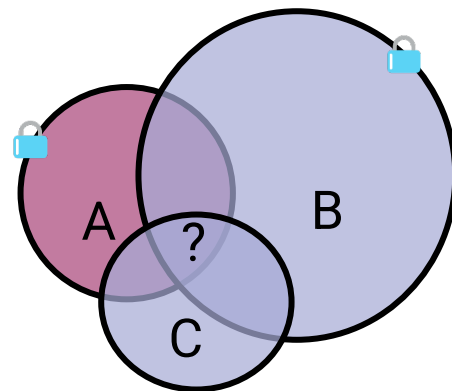
2-Party, One-Way PSI

$A \rightarrow B$



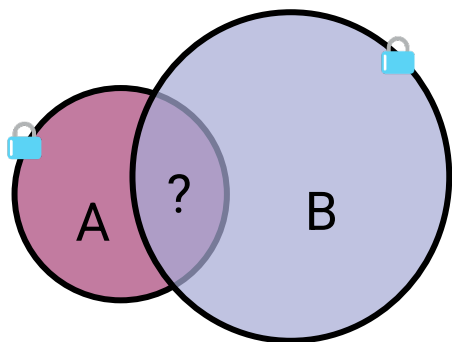
2-Party, Two-Way PSI

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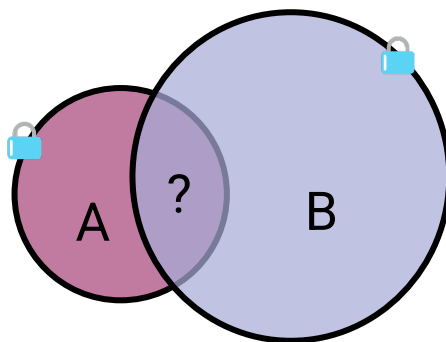
n-Party PSI

# Private Set Intersections



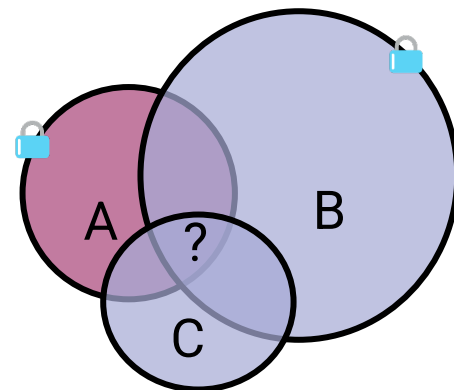
2-Party, One-Way PSI

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2-Party, Two-Way PSI

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n-Party PSI

**Directionality**

**Reducing Information Exchange**

**Multi-party**

**Varying Guarantees**

# Strawman Protocol for PSI

- Alice permutes her set  $\mathbf{X}$ , Bob permutes his set  $\mathbf{Y}$ . Then:
  - For each  $\mathbf{x} \in X$ 
    - For each  $\mathbf{y} \in Y$ 
      - Compute  $\mathbf{x} =? \mathbf{y}$
- **Protocol for comparison ( $\mathbf{x} =? \mathbf{y}$ )**
  - Alice  $\rightarrow$  Bob:  $E_A(\mathbf{x})$
  - Bob: Choose random  $\mathbf{r}$  and compute  $\mathbf{c} = (E_A(\mathbf{x}) * E_A(-\mathbf{y}))^{\mathbf{r}}$ 
    - Add encrypted value of  $\mathbf{x}$  with encrypted value of  $-\mathbf{y}$  (the negative of  $\mathbf{y}$ ) and raise the result to the power of  $\mathbf{r}$ .
  - Bob  $\rightarrow$  Alice:  $\mathbf{c}$  (Bob has no idea what  $\mathbf{x}$  is)
  - Alice: Knows whether  $\mathbf{x} = \mathbf{y}$ , if  $D_A(\mathbf{c}) = 0$ , else  $\mathbf{x} \neq \mathbf{y}$

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We will see more later!

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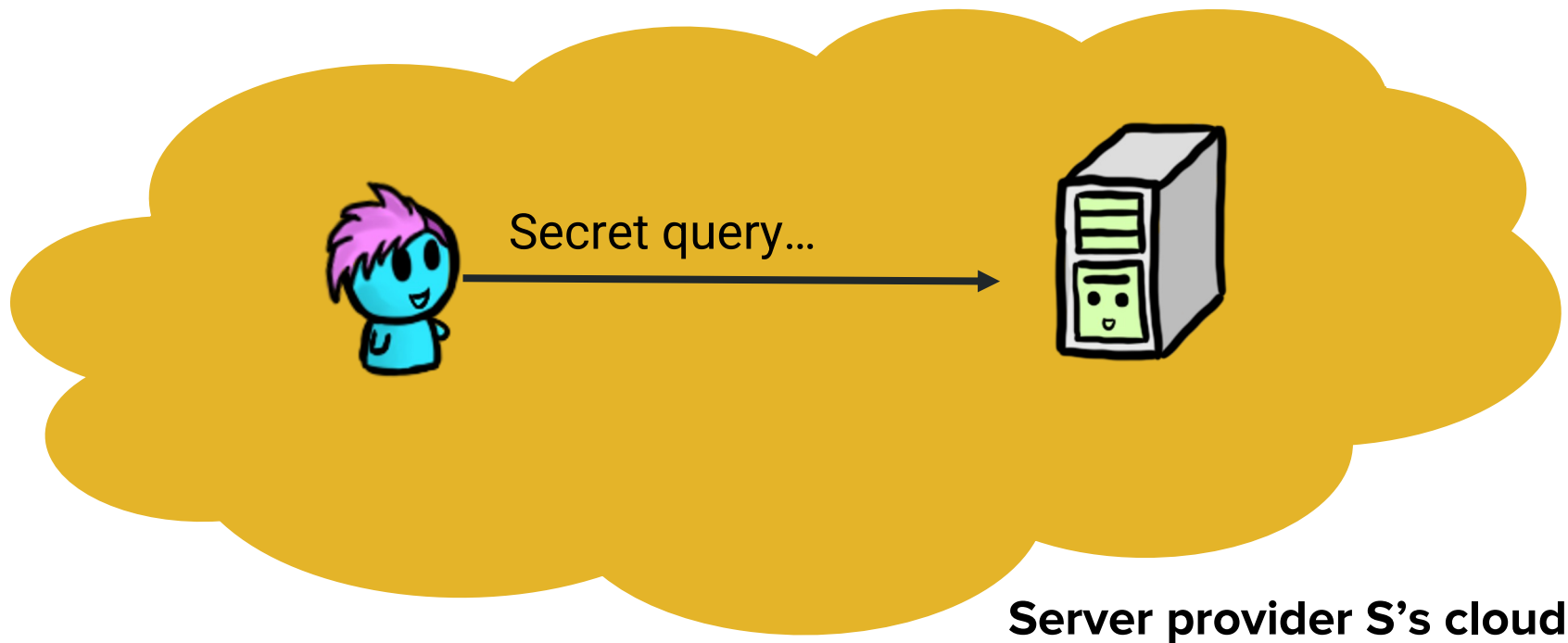
# Private Information Retrieval (PIR)

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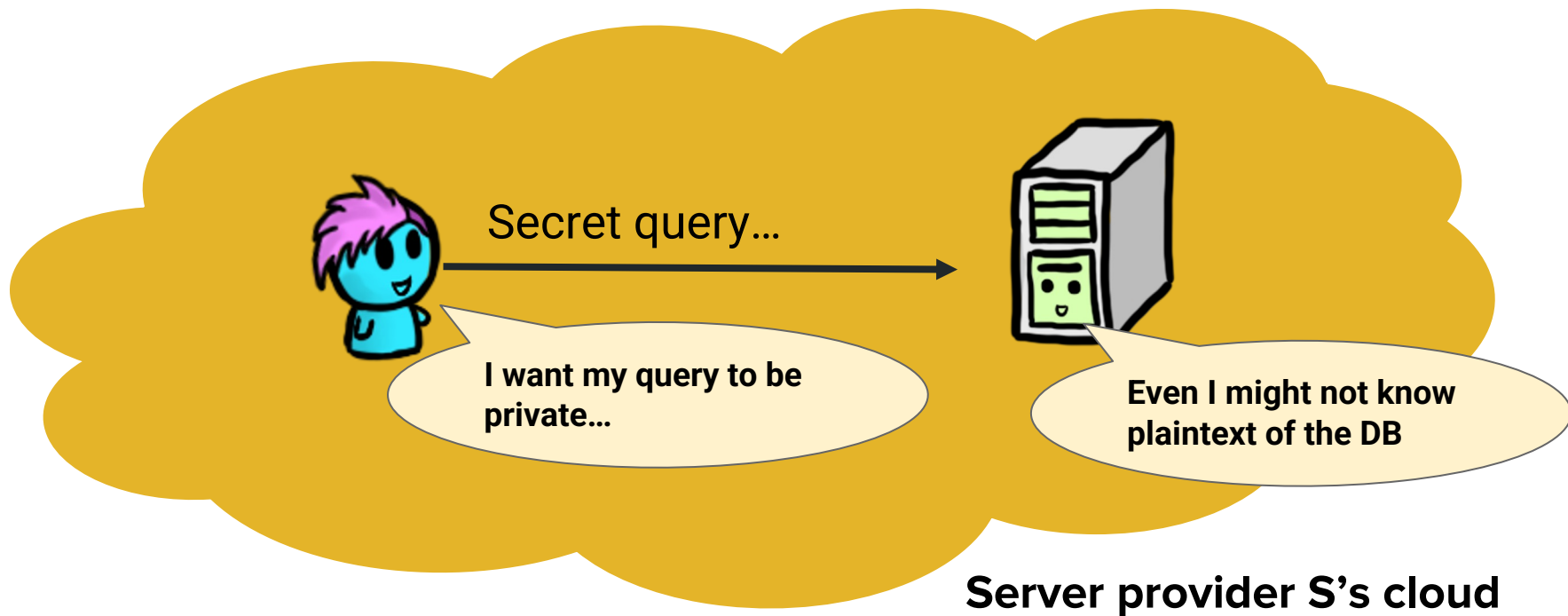
# Can we privately query a database?

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# Ideally...

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# Motivating Example (1)

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- A server stores a list of “broken” passwords that appeared on the Internet
- The client wants to check whether the password they just created for an Internet site is in that database
  - **If it is**, they should not use it...
  - **If it is not**, but is revealed to the database, it should not be used either!

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- The client should query **without revealing** the password!

# Motivating Example (2)

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- Netflix stores movies in a database
  - 1. The Shawshank Redemption
  - 2. The Godfather
  - 3. The Dark Knight
  - 4. Lord of the Rings: The Two Towers
  - ...
- You request movies by index, say 1, 4, 2, ...
- Netflix caches your selection and gradually **builds a profile** on your movie preferences

# Motivating Example (2)

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- Netflix stores movies in a database
  - 1. The Shawshank Redemption
  - 2. The Godfather
  - 3. The Dark Knight
  - 4. Lord of the Rings: The Two Towers
  - ...
- You request movies by index, say 1, 4, 2, ...
- Netflix caches your selection and gradually **builds a profile** on your movie preferences
- The server should be queried **without learning** the item of interest!

# PIR

---



**Carol has index  $i$**

# PIR

---



Carol has index  $i$

Server has DB  $d_1, \dots, d_n$





# PIR

---



Carol has index  $i$

Server has DB  $d_1, \dots, d_n$



**Goal 1: Correctness - Client learns  $d_i$**

# PIR

---



Carol has index  $i$

Server has DB  $d_1, \dots, d_n$



**Goal 1: Correctness** - Client learns  $d_i$

**Goal 2: Security** - Server does not learn index  $i$

# Blatantly non-private protocol

---

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

## Protocol:

- User: show me  $i$
- Server: here is  $X_i$

## Analysis:

- No privacy!
- # of bits: 1 — very efficient

# Trivially-private protocol

---

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

## Protocol:

- User: show me ***ALL indexes***
- Server: here is  $\{X_1, X_2, \dots, X_n\}$

## Analysis:

- Complete privacy!
- # of bits:  $n$  — very impractical

# More solutions?

---

## User asks for additional random indices

- **Drawback:** balance information leak vs communication cost

## Anonymous communication:

- **Note:** this is in fact a different concern: it hides the identity of a user, not the fact that  $X_i$  is retrieved

# Information-Theoretic PIR

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** multiple ( $\geq 2$ ) non-cooperating servers

## An example 2-server IT-PIR protocol:

- User  $\rightarrow$  Server 1:  $Q_1 \subset R \{1, 2, \dots, n\}$ ,  $i \notin Q_1$
- Server 1  $\rightarrow$  User:  $R_1 = \bigoplus_{k \in Q_1} X_k$
- User  $\rightarrow$  Server 2:  $Q_2 = Q_1 \cup \{i\}$
- Server 2  $\rightarrow$  User:  $R_2 = \bigoplus_{k \in Q_2} X_k$
- User derives  $X_i = R_1 \oplus R_2$

## Analysis:

- Probabilistic-based privacy ( $1/|Q_2|$ )
- # of bits: 1 ( $\times$  2 servers) + inexpensive computation

# Information-Theoretic PIR (Example)

## Formal model:

- Server: holds an n-bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** multiple ( $\geq 2$ ) non-cooperating servers

**Database:**  $[X_1, X_2, \mathbf{X_3}, X_4] = [0, 1, \mathbf{0}, 1]$

- User  $\rightarrow$  Server 1:  $\mathbf{Q_1} \subset \{1, 2, \dots, N\}, i \notin Q_1$
- Server 1  $\rightarrow$  User:  $\mathbf{R_1} = \bigoplus_{k \in Q_1} X_k$
- User  $\rightarrow$  Server 2:  $\mathbf{Q_2} = Q_1 \cup \{i\}$
- Server 2  $\rightarrow$  User:  $\mathbf{R_2} = \bigoplus_{k \in Q_2} X_k$
- User derives  $\mathbf{X_i} = R_1 \oplus R_2$



- User  $\rightarrow$  Server 1:  $\mathbf{Q_1} = X_1, X_4$
- Server 1  $\rightarrow$  User:  $\mathbf{R_1} = 1$
- User  $\rightarrow$  Server 2:  $\mathbf{Q_2} = X_1, \mathbf{X_3}, X_4$
- Server 2  $\rightarrow$  User:  $\mathbf{R_2} = 1$
- User derives  $\mathbf{X_i} = 0$

# Information-Theoretic PIR (Example)

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** multiple ( $\geq 2$ ) non-cooperating servers

$X_1$	$X_2$	$X_3$	$X_4$
0	1	0	1





# Information-Theoretic PIR (Example)

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
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**Assumption:** multiple ( $\geq 2$ ) non-cooperating servers



Q1 to S1  
[ $X_1, X_4$ ]

$R_1 = 1$

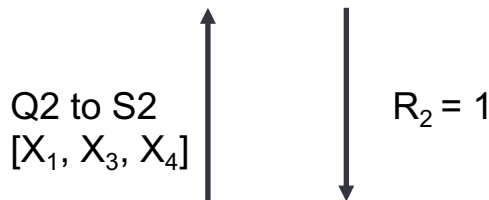


# Information-Theoretic PIR (Example)

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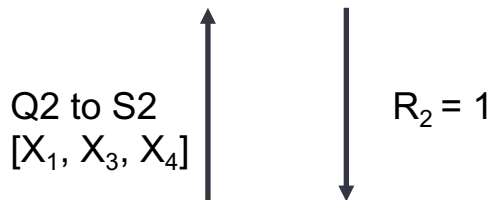


# Information-Theoretic PIR (Example)

## Formal model:

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- User: wishes to retrieve  $X_i$  AND keep  $i$  private

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$$X_3 = R_1 \oplus R_2 = 0$$

# Computational PIR

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** 1 server with limited computation power

## An example CPIR protocol:

- User chooses a large random number  $m$
- User generates  $n - 1$  random quadratic residues (QR) mod  $m$ :  $a_1, a_2, \dots, a_{i-1}, a_{i+1}, \dots, a_n$
- User generates a quadratic non-residue (QNR) mod  $m$ :  $b_i$
- User  $\rightarrow$  Server:  $a_1, a_2, \dots, a_{i-1}, b_i, a_{i+1}, \dots, a_n$

(The server cannot distinguish between QRs and QNRs mod  $m$ , i.e., the request is just a series of random numbers:  $u_1, u_2, \dots, u_n$ )

- Server  $\rightarrow$  User:  $R = u_1^{X_1} * u_2^{X_2} * \dots * u_n^{X_n}$  (The product of QRs is still a QR)
- User check: if  $R$  is a QR mod  $m$ ,  $X_i = 0$ , else ( $R$  is a QNR mod  $m$ )  $X_i = 1$

# Quadratic Residues: A recap

---

**Definition:** A number  $a$  is a quadratic residue modulo  $n$  if there is an integer  $x$  such that  $x^2 = a \bmod n$

# Quadratic Residues: A recap

---

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e.g., let  **$n = 7$**

$$0^2 = 0 \bmod 7$$

$$1^2 = 1 \bmod 7$$

$$2^2 = 4 \bmod 7$$

$$3^2 = 2 \bmod 7$$

$$4^2 = 2 \bmod 7$$

$$5^2 = 4 \bmod 7$$

$$6^2 = 1 \bmod 7$$

...

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... (and so on)



**0, 1, 2, 4** are Quadratic Residues mod **7**

# Quadratic Residues: A recap

---

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$5^2 = 4 \bmod 7$

$6^2 = 1 \bmod 7$

... (and so on)



**0, 1, 2, 4** are Quadratic Residues mod 7



**3, 5, 6** are Quadratic Non-Residues mod 7



# Quadratic Residues: A recap

If we know the factorization of  $n$ , we can reduce the problem to checking residues modulo each prime factor...  
Does this remind you of something?

**Definition:** A number  $a$  is a quadratic residue modulo  $n$  if there is an integer  $x$  such that  $x^2 = a \pmod{n}$

e.g., let  $n = 7$

$$0^2 = 0 \pmod{7}$$

$$1^2 = 1 \pmod{7}$$

$$2^2 = 4 \pmod{7}$$

$$3^2 = 2 \pmod{7}$$

$$4^2 = 2 \pmod{7}$$

$$5^2 = 4 \pmod{7}$$

$$6^2 = 1 \pmod{7}$$

... (and so on)



0, 1, 2, 4 are Quadratic Residues mod 7



3, 5, 6 are Quadratic Non-Residues mod 7

# Computational PIR

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** 1 server with limited computation power

## An example CPIR protocol:

- User chooses a large random number  $m$
- User generates  $n - 1$  random quadratic residues (QR) mod  $m$ :  $a_1, a_2, \dots, a_{i-1}, a_{i+1}, \dots, a_n$
- User generates a quadratic non-residue (QNR) mod  $m$ :  $b_i$
- User  $\rightarrow$  Server:  $a_1, a_2, \dots, a_{i-1}, b_i, a_{i+1}, \dots, a_n$

(The server cannot distinguish between QRs and QNRs mod  $m$ , i.e., the request is just a series of random numbers:  $u_1, u_2, \dots, u_n$ )

- Server  $\rightarrow$  User:  $R = u_1^{X_1} * u_2^{X_2} * \dots * u_n^{X_n}$  (The product of QRs is still a QR)
- User check: if  $R$  is a QR mod  $m$ ,  $X_i = 0$ , else ( $R$  is a QNR mod  $m$ )  $X_i = 1$

# Computational PIR (Example)

## Formal model:

- Server: holds an  $n$ -bit string  $\{X_1, X_2, \dots, X_n\}$
- User: wishes to retrieve  $X_i$  AND keep  $i$  private

**Assumption:** 1 server with limited computation power

**Database:**  $[X_1, X_2, X_3, X_4] = [0, 1, 0, 1]$

- User chooses random number **7**
- User generates  $n - 1$  random quadratic residues (QR) mod **7**:  $a_1, a_2, a_4 = 0, 2, 4$
- User generates a quadratic non-residue (QNR) mod  $m$ :  $b_3 = 3$
- User  $\rightarrow$  Server:  $a_1, a_2, b_3, a_4$  **0, 2, 3, 4**

(The server cannot distinguish between QRs and QNRs mod  $m$ )

- Server  $\rightarrow$  User:  $R = \underline{0^{X_1} * 2^{X_2} * 3^{X_3} * 4^{X_4}} = \underline{0^0 * 2^1 * 3^0 * 4^1} = \underline{1 * 2 * 1 * 4} = 8$  (The product of QRs is still a QR)
- User check:  **$8 = 1 \bmod 7$** . Thus, 8 is a quadratic residue modulo 7, since 1 is a QR mod 7  
**Hence,  $X_3 = 0$**

# Comparison of CPIR and IT-PIR

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## CPIR

- Possible with a single server
- Server needs to perform intensive computations
- To break it, the server needs to solve a hard problem

## IT-PIR

- Only possible with  $>1$  server
- Server may need lightweight computations only
- To break it, the server needs to collude with other servers

# Quick announcement (again 😊)

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- **Student Course Perceptions** (<https://perceptions.uwaterloo.ca/>)
  - Close on Friday, April 4<sup>th</sup>
  - Did you like it? Did you hate it? Let me know!