

# Secure Multi-Party Computation

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## 1 Introduction

- What is SMC
- SMC Models
- Type of Adversaries
- SMC Approaches
- Applications
- Goals
- Actions

## 2 Literature Review

- SMC Operations
- Mitigation Mechanisms

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# What is SMC

- In Secure Multiparty Computation (SMC), multiple parties carry out computation over their confidential data without any loss of data security/privacy.
- Let multiple parties  $P_1, P_2, \dots, P_n$  want to perform computation  $C_i$  on their private data.  $D_1, D_2, \dots, D_n$  be the data corresponding to  $P_1, P_2, \dots, P_n$ .
- $D_i$  should not be accessible to any  $P_j$  during computation  $C_i$  where  $i \neq j$  and  $j = 1, 2, \dots, n$

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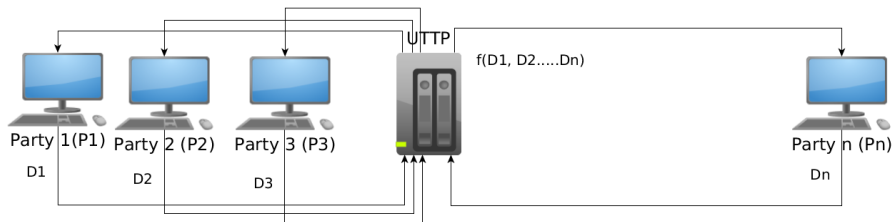
- SMC Operations
- Mitigation Mechanisms

- Generally two model paradigms are popular
  - Ideal model prototype of SMC
  - Real model prototype of SMC
- Ideal model prototype of SMC is also called **Uncorrupted Trusted Third Party** (UTTP). Parties send their data to UTTP to perform computation.
- In real model prototype of SMC, no external party is used. Both parties agree on a protocol to preserve privacy and maintain correctness result.
- Let  $D_i$  is private data of  $P_i$ ,  $i = 1, 2, \dots, n$ . In ideal model, data are send to UTTP directly where as in real model,  $f(D_1), f(D_2), \dots, f(D_n)$  exchange between the parties.

# SMC Models

Ideal vs. Real

Figure: Ideal model prototype of SMC



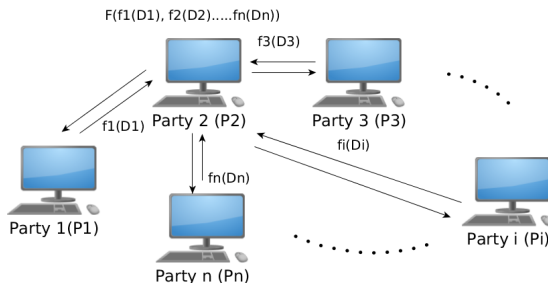
## Limitation

- UTTP turns corrupt, the privacy will be destroyed.
- It is costly due to the cost of working of the UTTP.

# SMC Models

## Ideal vs. Real

Figure: Real model prototype of SMC



## Limitation

- Adversary (a party) can carry out attack in the real model.
- Attack can be passive or active.



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# Type of Adversaries

- An adversary can be static or adaptive in nature.
- A **static adversary** is malicious in nature prior to the execution of protocol. An **adaptive adversary** is malicious during the execution of protocol.
- A **semi-honest adversary** follows the protocol but tries to learn other than the output of the computation.
- A **corrupt or malicious adversary** does not follow the protocol and tries to learn other than result.

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- Mainly three techniques are used for SMC
  - Randomization methods
  - Cryptographic techniques
  - Anonymization methods
- In **randomization methods**, participants use random numbers for obscuring their input.
- In **cryptographic techniques**, secret input are encrypted at participants side. Computation is performed on encrypted data.
- In **anonymization methods**, the identity of the parties are hide rather than hiding individual parties' data. It is the ideal model where TTP is used.

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- **Private Information Retrieval:** Client requests the server to provide  $i^{\text{th}}$  bit/word without the server knowing anything about it. Client is also not aware of bit/ word sequence.
- **Privacy-Preserving Data Mining:** One or multiple parties execute data mining operation on the private database of another party without knowing any details.
- **Privacy-Preserving Database Query:** One party has a string  $S_i$  and other party has database  $D$  to be searched. Such that other party does not know about  $S_i$  and first one does not know about  $D$ .
- **Privacy-Preserving Intrusion Detection:** Party B enters the hacker's information and searches A's database, B only gets the comparison results.

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Let  $D_i$  is private data of  $P_i$ ,  $i = 1, 2, \dots, n$ . Wish to perform a computation  $f(D_1, D_2, \dots, D_n) = (Y_1, Y_2, \dots, Y_n)$ .  $Y_i$  is private output value for  $P_i$ .

- **Correct:** Parties correctly compute  $f$ .
- **Privacy:** For  $P_1, P_2, \dots, P_n$ , each player's input remains private.
- **Output Delivery:** Protocol never end until everyone receives an output.
- **Fairness:** If one party gets the answer, so does every one else.



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- ① Data stored at remote site must be obscured.
- ② Data must be obscured during transition.
- ③ Prevent information access pattern of data at remote site from adversaries.
- ④ Perform operation on obscured data at remote site.

Note: All the above cases need not to be satisfied for all the SMC operations.

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## Type of operations

- **Private Information Retrieval:** Party  $i$  retrieve information from party  $j$  without its knowledge,  $i, j \in N$
- **Privacy Preserving Computation:** Parties  $P_1, P_2, \dots, P_n$  perform computation  $C_i$  over their private data  $D_1, D_2, \dots, D_n$  without revealing information to each other.
- **Privacy Preserving Database Query:** Party  $i$  queries  $s_i$  to party  $j$  having Database  $D_t$  s.t. party  $j$  doesn't know about  $s_i$ .

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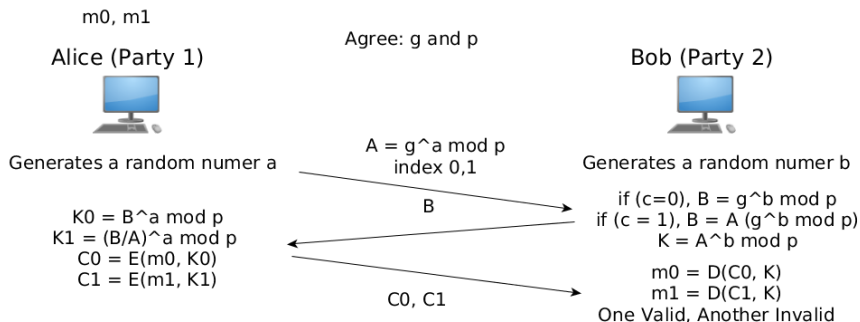
- SMC Operations
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# Mitigation Mechanisms

## Private Information Retrieval

**Oblivious Transfer (OT):** It is a protocol where party A transfer many pieces of information to party B but remain oblivious about which piece of information retrieved by party B.

Figure: OT for private information retrieval



# Mitigation Mechanisms

## Private Information Retrieval

### Algorithm

- **step 1:** Alice (Party 1) and Bob (Party 2) agree upon shared input 'g' and 'p'.
- **step 2:** Party 1 generates a random number 'a' and computes  $A = g^a \bmod p$ . Sends index number of its messages  $m_0 = 0$ ,  $m_1 = 1$  with A to Party 2.
- **step 3:** Party 2 generates a random number 'b' and computes  $B = g^b \bmod p$  /  $A(g^b \bmod p)$  based on its choice 0/1 and sends it to Party 1. Generate  $K_s = A^b \bmod p$ .
- **step 4:** Party 1 generates  $K_0 = B^a \bmod p$  and  $K_1 = (B/A)^a \bmod p$ . Sends  $E_{K_0}(m_0)$  and  $E_{K_1}(m_1)$  to Party 2.
- **step 5:** Party 2 decrypts both messages using  $K_s$ . One gives valid output but another not.

# Mitigation Mechanisms

## Private Information Retrieval

### Example

- **Given:** Alice's  $m_0 = 10$ ,  $m_1 = 12$ .
- **step 1:** Alice (Party 1) and Bob (Party 2) agree upon shared input  $g = 3$  and  $p = 77$ .
- **step 2:** Party 1 generates  $a = 5$  and computes  $A = 12$ . Sends index number of its messages  $m_0 = 0$ ,  $m_1 = 1$  with  $A$  to Party 2.
- **step 3:** Party 2 generates  $b = 4$  and computes  $B = 4 / 48$  based on its choice 0/1 and sends it to Party 1. Generate  $K_s = 23$ .
- **step 4:** If  $c = 0$  at party 2, party 1 generates  $K_0 = 23$  and  $K_1 = 0.0041$ . Sends  $E_{K_0}(10)$  and  $E_{K_1}(12)$  to Party 2.
- **step 5:** Party 2 decrypts both messages using  $K_s$ .  $D_{K_s}(E_{K_0}(10)) = 10$ ,  $D_{K_s}(E_{K_1}(12)) = \text{garbage}$ .



# Mitigation Mechanisms

## Privacy Preserving Computation (Randomization Technique)

**Private summation protocol:** Parties use random numbers for obscuring their inputs. Perform computation over obscured inputs.

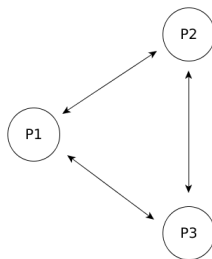
### Algorithm

- **Given:** Each party  $P_i$  with input  $D_i$
- **step 1:** Generate random number  $r_{i,j}$  to its neighbour  $P_j$ .
- **step 2:** Wait for  $r_{j,i}$  from each neighbour  $P_j$ .
- **step 3:** Compute  $D_i' = D_i + \sum_j r_{j,i} - \sum_j r_{i,j}$ .
- **step 4:** Publish  $D_i'$  to each other.
- **step 5:** Output =  $\sum_i D_i'$

# Mitigation Mechanisms

## Privacy Preserving Computation (Randomization Technique)

Figure: Private summation protocol



$$\begin{aligned}D_1' &= D_1 - r_{12} - r_{13} + r_{21} + r_{31} \\D_2' &= D_2 - r_{21} - r_{23} + r_{12} + r_{32} \\D_3' &= D_3 - r_{31} - r_{32} + r_{13} + r_{23} \\ \sum_i D_i' &= \sum_i D_i\end{aligned}$$

# Mitigation Mechanisms

## Privacy Preserving Computation (Randomization Technique)

**Three Party Protocol:** Source party uses a random number for obscuring the whole operation where  $f(D_1, D_2, D_3) = D_1 D_2 D_3$ .

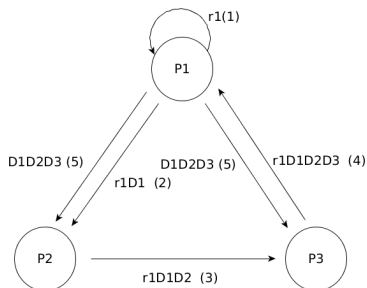
### Algorithm

- **Given:** Parties  $P_1$ ,  $P_2$  and  $P_3$  have  $D_1$ ,  $D_2$ ,  $D_3$  respectively.
- **step 1:**  $P_1$  chooses a random number  $r_1$ .
- **step 2:** Computes  $r_1 D_1$  and sends it to  $P_2$ .
- **step 3:**  $P_2$  computes  $r_1 D_1 D_2$ , sends to  $P_3$ .
- **step 4:**  $P_3$  computes  $r_1 D_1 D_2 D_3$ . sends to  $P_1$ .
- **step 5:**  $P_1$  computes  $r_1^{-1}(r_1 D_1 D_2 D_3)$ . Sends  $D_1 D_2 D_3$  to  $P_2$  and  $P_3$ .

# Mitigation Mechanisms

## Privacy Preserving Computation (Randomization Technique)

Figure: Three party protocol



### Limitation

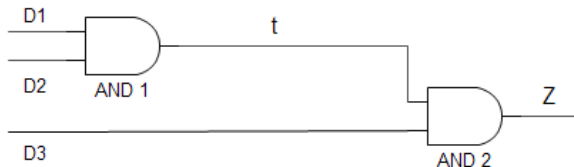
- No standardize algorithm for a single operation.

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

**Yao Garbled Circuit:** One of the protocol for secure m-party computation. Used to evaluate boolean function.

Figure: Circuit diagram of  $D_1 \wedge D_2 \wedge D_3$



# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

**Yao Garbled Circuit:** It is a 2-party computation protocol. It can be extended to m-party.

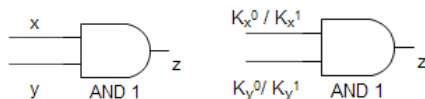
### Algorithm (2-party)

- **Given:** Digital Circuit.  $P_1$  is generator and  $P_2$  is evaluator.
- **step 1:**  $P_1$  generates GCT. Encrypts each row of GCT.
- **step 2:**  $P_1$  sends GCT and key associate with its input.
- **step 3:**  $P_1$  and  $P_2$  do oblivious transfer.  $P_2$  obtains the key associated with its input.
- **step 4:**  $P_2$  computes circuit output and sends to  $P_1$

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

Figure: Circuit diagram of  $x \wedge y$



$x$	$y$	$z$	$x'$	$y'$	$z'$	GCT
0	0	0	$K_x^0$	$K_y^0$	0	$E_{K_x^0}(E_{K_y^0}(0))$
0	1	0	$K_x^0$	$K_y^1$	0	$E_{K_x^0}(E_{K_y^1}(0))$
1	0	0	$K_x^1$	$K_y^0$	0	$E_{K_x^1}(E_{K_y^0}(0))$
1	1	1	$K_x^1$	$K_y^1$	1	$E_{K_x^1}(E_{K_y^1}(1))$

Where  $K_x^0$ ,  $K_x^1$ ,  $K_y^0$  and  $K_y^1$  are random numbers generated by  $P_1$ .

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

Table: Suffled GCT

GCT
$E_{K_x^0}(E_{K_y^0}(0))$
$E_{K_x^1}(E_{K_y^1}(1))$
$E_{K_x^1}(E_{K_y^0}(0))$
$E_{K_x^0}(E_{K_y^1}(0))$

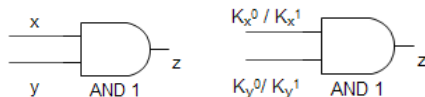
- $P_1$  suffles the GCT. Send GCT and  $K_x^a$  to  $P_2$ .
- $P_2$  does oblivious transfer for  $K_y^b$ .
- $P_2$  decrypts one row successfully. Send the output to  $P_1$ .



# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

Figure: Circuit diagram of  $x \wedge y$



$x$	$y$	$z$	$x'$	$y'$	$z'$	GCT
0	0	0	3	7	0	$E_3(E_7(0))$
0	1	0	3	9	0	$E_3(E_9(0))$
1	0	0	5	7	0	$E_5(E_7(0))$
1	1	1	5	9	1	$E_5(E_9(1))$

Where 3, 5, 7 and 9 are random numbers generated by  $P_1$ .

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

Table: Suffled GCT

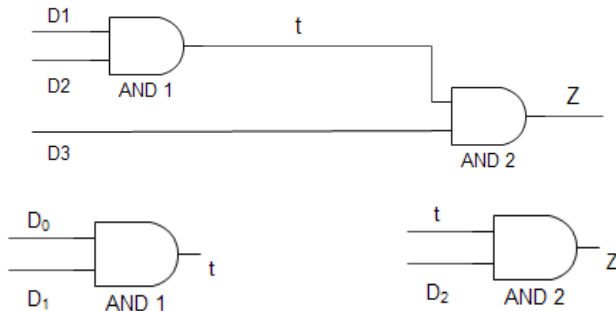
GCT
$E_3(E_7(0))$
$E_5(E_9(1))$
$E_5(E_7(0))$
$E_3(E_9(0))$

- $P_1$  suffles the GCT. Send GCT and 3 to  $P_2$ .
- $P_2$  does oblivious transfer for  $K_y^b$ . If choice = 0 then 7 else 9 will be retrieved.
- $P_2$  decrypts one row successfully. Send the output to  $P_1$ .

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

Figure: Circuit diagram of  $D_1 \wedge D_2 \wedge D_3$



For 1<sup>st</sup> circuit,  $P_1$  is generator and  $P_2$  is evaluator. 2<sup>nd</sup> circuit,  $P_2$  is generator and  $P_3$  is evaluator.

# Mitigation Mechanisms

## Privacy Preserving Computation (Cryptographic Technique)

### Algorithm (m-party)

- **Given:** For digital Circuit  $C_1$ ,  $P_1$  is generator and  $P_2$  is evaluator. Digital Circuit  $C_2$ ,  $P_2$  is generator and  $P_3$  is evaluator.
- **step 1:**  $P_1$  generates  $GCT_1$ . Encrypts each row of  $GCT_1$ .
- **step 2:**  $P_1$  sends  $GCT_1$  and key associate with its input.
- **step 3:**  $P_1$  and  $P_2$  do oblivious transfer.  $P_2$  obtains the key associated with its input.
- **step 4:**  $P_2$  computes circuit output and one will be valid.
- **step 5:** Repeat step 1 to step 4 for circuit  $C_2$ .
- **step 6:**  $P_3$  sends final output to  $P_1$  and  $P_2$ .

# Mitigation Mechanisms

## Privacy Preserving Database Query

**Database Encryption Scheme:** Databases are encrypted to prevent any information leakage.

- To reduce computational time, only sensitive columns of database tables are encrypted.
- Probabilistic encryption is used to encrypt repeated pattern.
- Encryption and decryption keys are known to client.

# Mitigation Mechanisms

## Privacy Preserving Database Query

Table: Ailment and Patient (original)

Name	Disease	Name	City	Gender
Alice	AIDS	Alice	Seattle	Female
Bob	Flu	Bob	Madison	Male
Chen	AIDS	Chen	Palo Alto	Male
Dana	Diabetes	Dana	New York	Female

Table: Ailment and Patient (encrypted)

Name	Disease	Name	City	Gender
Alice	!@#\$xyz	Alice	Seattle	2xU%b
Bob	@%^abc	Bob	Madison	Ry!<4&
Chen	*&#pqr	Chen	Palo Alto	wl-]%5
Dana	(p#z*94	Dana	New York	3xt*&i

# Mitigation Mechanisms

## Privacy Preserving Database Query

**Privacy preserving database query:**  $P_i$  performs 'x' operation on database at  $P_j$ , where sensitive columns of the databases are encrypted.

### Query

```
select Name, Disease, City from Patient join Ailment  
on Name where Disease = 'AIDS'
```

### Encrypted query

```
select Name, Disease, City from Patient join Ailment  
on Name where Disease = 'xxxxxxxxxxxxxxxxxx'
```

Table: Output

Alice	!@#\$xyz	Seattle
Chen	*&#pqr	Palo Alto

# Mitigation Mechanisms

## Privacy Preserving Database Query

- Hiding data is not enough, Prevent adversary (server) to understand the query pattern.
- If adversary knows Chen has AIDS externally, then Alice also AIDS.
- Use **Oblivious RAM** to hide query and memory access pattern.
- ORAM executes query and hides read/write memory access by read and write memory access.



To be Continued ...

Thank  
You