

Introduction: Trusted Third Party

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To compute on private data there are two main solutions:

- ▶ Homomorphic encryption
- ▶ Multiparty Computation

Introduction: Formalization of the Model

- An MPC protocol is a set of instructions for each party. These instructions can be local computations and exchanges of data.
- The output can be revealed to all or some of the players.

Introduction: Security Properties

- ▶ Input privacy: the execution of the protocol should not give any information about the private data of the parties, except for what is revealed by the output of the function.

Boolean MPC: Garbled Circuits

Every function can be represented as a boolean circuit with AND, OR and NOT gates. Gates are connected by three types of wires: input wires, output wires and intermediate wires.

Boolean MPC: Garbled Circuits

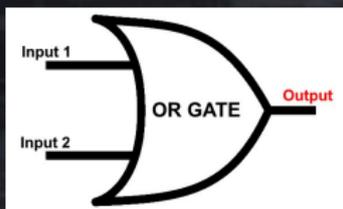
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Ingredients:

- ▶ Double key symmetric encryption: given a plaintext m and two keys k_1, k_2 , we denote by $E_{k_1, k_2}(m)$ the encryption of m with keys k_1, k_2 . For example we can use $E_{k_1, k_2}(m) = AES_{k_1}(AES_{k_2}(m))$. In order to check the validity of a plaintext we can add some redundancy.
- ▶ Oblivious Transfer (OT)

Boolean MPC: Example of Garbled Truth Table

OR gate



W_0	W_1	W	W_0	W_1	W	Garbled value
0	0	0	w_0^0	w_1^0	w^0	$\mathbb{E}_{w_0^0, w_1^0}(w^0)$
0	1	1	w_0^0	w_1^1	w^1	$\mathbb{E}_{w_0^0, w_1^1}(w^1)$
1	0	1	w_0^1	w_1^0	w^1	$\mathbb{E}_{w_0^1, w_1^0}(w^1)$
1	1	1	w_0^1	w_1^1	w^1	$\mathbb{E}_{w_0^1, w_1^1}(w^1)$

Arithmetic MPC: Additive Secret Sharing

Suppose n players P_1, \dots, P_n .

If a player P wants to share its secret input x , he randomly generates n shares $x^{(j)}$ such that

$$x = \sum_{j=1}^n x^{(j)}$$

Then P sends $x^{(j)}$ to player P_j .

The shared value of x is denoted as

$$[[x]] = (x^{(1)}, \dots, x^{(n)})$$

This means that every player has a little part of x but nobody knows the actual value.

Arithmetic MPC: Example of Additive Secret Sharing

Suppose 5 players P_1, \dots, P_5 . A dealer wants to share the secret $s = 6 \in \mathbb{F}_{11}$.

- ▶ He generates 4 random elements of \mathbb{F}_{11}

$$s^{(1)} = 5, s^{(2)} = 3, s^{(3)} = 8, s^{(4)} = 0$$

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$$s^{(5)} = s - \sum_{i=1}^4 s^{(i)} = 6 - 5 = 1$$

and distributes $s^{(i)}$ to P_i .

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and distributes $s^{(i)}$ to P_i .

- ▶ All players can reconstruct the secret sharing their values to get

$$s = \sum_{i=1}^5 s^{(i)}$$

Arithmetic MPC: Shamir Secret Sharing Scheme

Suppose n players P_1, \dots, P_n and $t \leq n$. A secret x of the player P can be shared as follow:

- ▶ P secretly chooses a random polynomial f of degree $t - 1$ such that $f(0) = x$.
- ▶ P gives to the player P_i the couple $(i, f(i))$.

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The shared value of x is denoted as

$$[[x]] = ((1, f(1)), \dots, (n, f(n)))$$

Arithmetic MPC: Lagrange Interpolation

Given a set of points $\{(x_1, y_1), \dots, (x_r, y_r)\}$ such that $x_i \neq x_j$ for every $i \neq j$, then exists a unique polynomial f of degree $\leq r - 1$ such that $f(x_i) = y_i$ for each i .

The polynomial f can be constructed as follows:

- ▶ Define

$$\delta_i(x) = \frac{\prod_{\substack{j=1 \\ j \neq i}}^r (x - x_j)}{\prod_{\substack{j=1 \\ j \neq i}}^r (x_i - x_j)}$$

we see that for each i $\delta_i(x_i) = 1$ and $\delta_i(x_j) = 0$ if $i \neq j$.

- ▶ Then set

$$f(x) = \sum_{i=1}^r \delta_i(x) y_i$$

Arithmetic MPC: Arithmetic with Additive Secret Sharing

If players have $[[x]]$ and they want to compute $[[z]] = [[cx]]$ for any public c :

- ▶ Each player P_i sets $z^{(i)} = cx^{(i)}$

- ▶ In fact:

$$z = \sum_{i=1}^n cx^{(i)} = c \sum_{i=1}^n x^{(i)} = cx$$

- ▶ This is another communication-free operation.

Arithmetic MPC: Arithmetic with Additive Secret Sharing

Suppose parties have $[[x]]$ and $[[y]]$.

To compute $[[z]] = [[xy]]$:

- ▶ Players compute $[[\rho]] = [[x]] - [[a]]$ and reveal ρ

Arithmetic MPC: A Simple Example (1)

Two parties, P_1 and P_2 want to compute $f(x_1, x_2) = x_1x_2 + x_1$ in \mathbb{F}_7 . Suppose $x_1 = 2$ and $x_2 = 5$.

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- ▶ They share their inputs. P_1 generates a random $x_1^{(1)} = 3$ and sets $x_1^{(2)} = 2 - 3 = 6$. P_1 sends $x_1^{(2)}$ to P_2 , then we have:

$$[[x_1]] = [[2]] = (3, 6)$$

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- ▶ P_2 does the same, he generates $x_2^{(1)} = 1$ and sets $x_2^{(2)} = 5 - 1 = 4$ and sends $x_2^{(1)}$ to P_1 . Then

$$[[x_2]] = [[5]] = (1, 4)$$

Arithmetic MPC: A Simple Example (2)

Now they want to compute $[[x_1 x_2]]$. They pick a precomputed multiplication triple:

$$([[a]], [[b]], [[c]]) = ([[2]], [[6]], [[5]])$$

such that:

$$[[2]] = (1, 1), \quad [[6]] = (4, 2), \quad [[5]] = (0, 5)$$

Arithmetic MPC: A Simple Example (3)

Multiplication subprotocol:

- ▶ P_1 computes

$$\rho^{(1)} = x_1^{(1)} - a^{(1)} = 2$$

$$\sigma^{(1)} = x_2^{(1)} - b^{(1)} = 4$$

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- ▶ P_1 sets $z^{(1)} = c^{(1)} + \rho b^{(1)} + \sigma a^{(1)} + \rho\sigma = 6$

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Arithmetic MPC: A Simple Example (4)

Now we have $[[z]] = (6, 4) = [[3]] = [[2 \cdot 5]]$. To obtain the output of $f(2, 5)$ we need to compute $[[z + x_1]]$.

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- ▶ P_1 sets $w^{(1)} = z^{(1)} + x_1^{(1)} = 2$
- ▶ P_2 sets $w^{(2)} = z^{(2)} + x_1^{(2)} = 3$
- ▶ Now they exchange their shares and learn the output $w = 2 + 3 = 5$, in fact $f(2, 5) = 5$.

Arithmetic MPC: Offline Phase vs Online Phase

Some protocols split computation in two parts:

- ▶ A preprocessing phase that depends on the function and is independent on the inputs. It is called “offline phase”.
- ▶ An evaluation phase: players use their inputs and compute the function, this is called “online phase”.

Active Security: How to Prevent Active Attacks?

How to deal with malicious adversaries that can deviate from the protocol? When the protocol says “send x ” they could send y or some crafted values.

There are some solutions, we see how the SPDZ protocol solves this problem.

Active Security: MAC Keys

Each player P_i generates a MAC key $\Delta^{(i)}$. We define

$$\Delta = \sum_{i=1}^n \Delta^{(i)}$$

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Now shares of the value $x \in \mathbb{F}$ are of the form

$$[[x]] = \underbrace{(x^{(1)}, \dots, x^{(n)})}_{\text{shares}}, \underbrace{(m(x)^{(1)}, \dots, m(x)^{(n)})}_{\text{MAC shares}}, \underbrace{(\Delta^{(1)}, \dots, \Delta^{(n)})}_{\text{MAC keys}}$$

Such that:

$$x = \sum_{i=1}^n x^{(i)}, \quad x \cdot \Delta = \sum_{i=1}^n m(x)^{(i)}$$

Active Security: MAC Keys

If a malicious player sends the wrong values for $x^{(i)}$, he can't modify his MAC shares $m(x)^{(i)}$ to be consistent with the new value since he has not other MAC shares and Δ .

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When the function is evaluated and players hold the shared output, before revealing it to all parties, there is a general MAC check on all the values opened during the protocol.

If this check passes, then the output is revealed and accepted.

Real-world Applications

Since 2008 there were a lot of real-world applications of MPC, for example:

- ▶ Danish sugar beet auction
- ▶ Benchmarking
- ▶ Satellite collisions
- ▶ Machine learning on private data

Libraries

There are a lot of libraries that implement some MPC functionalities. Some examples:

- ▶ SCALE-MAMBA
- ▶ MP-SPDZ
- ▶ libSCAPI
- ▶ Fresco
- ▶ ...and many other

