

# Cryptography

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Hari



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## Secure Communication

- Encryption, signatures
- AES, RSA, etc.
- HTTPS!



Figure 1: HTTPS Secure Connection

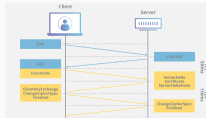


Figure 2: TLS: Cloudflare

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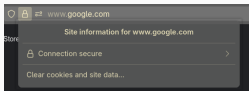


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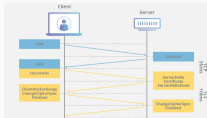


Figure 2: TLS: Cloudflare

## Secure **Computation**

- Modern day constructions
- MPC, FE, FHE, ZK, and more
- Voting and Auctions, Verifiable computation

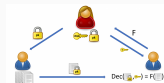


Figure 3: Secure Computation: COSIC

# Secret Sharing

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- *Correctness*:  $\text{Rec}(\text{Share}(s)) = s$ .
- *Privacy*: A set of  $n - 1$  shares of the secret reveals no information about  $s$ .

Let  $s$  be a secret in  $\{0, 1, \dots, p-1\}$  for a prime  $p$ . We do arithmetic mod  $p$ .

- Share: Sample one share  $s_1 \leftarrow \{0, 1, \dots, p-1\}$  uniformly at random. Return  $(s_1, s - s_1)$ .
- Rec( $s_1, s_2$ ): Return  $s_1 + s_2$ .

For  $n$  parties:

- Share: Sample  $n - 1$  shares  $s_1, \dots, s_{n-1} \leftarrow \{0, 1, \dots, p - 1\}$  uniformly at random. Return  $(s_1, s_2, \dots, s_{n-1}, s - s_1 - s_2 - \dots - s_{n-1})$ .
- Rec( $s_1, s_2$ ): Return  $s_1 + s_2 + \dots + s_n$ .

# Multiparty Computation

- We perform computation on data every day all the time!
- Statistics on data
- Finance and trading computations
- Machine learning computation on data

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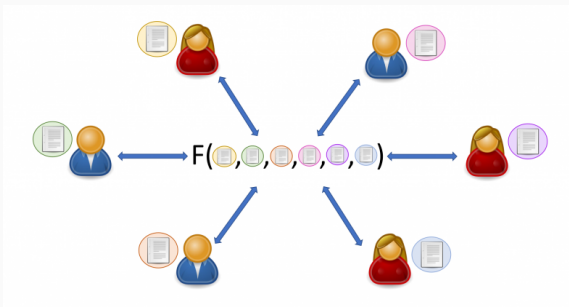


Figure 4: Secure MPC: Cosic

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# Secure Multiparty Computation

- First two party protocols introduced by Yao
- Generalized to multiple parties by Goldreich, Micali, and Widgerson
- Modern day protocols rely on interesting cryptography and a lot of optimizations

# Constructing MPC from secret sharing

- How do we express the computation of a function  $\mathcal{F}(x_1, x_2, \dots, x_n)$ ?

# Expressing computation

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- In this protocol, we have  $\mathcal{F}$  be a polynomial in the variables  $x_1, \dots, x_n$ .
- We call this an **arithmetic circuit**:  $\mathcal{F}$  is a circuit with addition and multiplication gates.

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- $(\text{condition} - 1) \cdot f(x) + (\text{condition}) \cdot g(x)$

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- This is done for each input – so every party holds a secret share for each input. For a value  $a$ , we notate this by  $[a]$ .

## Evaluating addition

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- One party has  $a_1, b_1$  and the other has  $a_2, b_2$ .

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- One party has  $a_1, b_1$  and the other has  $a_2, b_2$ .
- Note that  $a_1 + b_1$  and  $a_2 + b_2$  are shares for  $a + b$ ! Our prior secret sharing scheme was **linear**.

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- No! We want shares of  $(a_1 + a_2)(b_1 + b_2)$ . How do we do this?
- We introduce an extra party to provide data for multiplication.

## Beaver triples

- Let the third party sample random values  $r, s$ , and set  $t = rs$ .
- The third party then secret shares the values to  $[r], [s], [t]$  and sends the shares  $r_1, s_1, t_1$  and  $r_2, s_2, t_2$  to each party. This is known as a **Beaver triple**.

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- Now if the parties want to compute shares of  $ab$  from  $[a]$  and  $[b]$ , they do the following:
  - The two parties compute shares  $[a - r]$  and reveal their shares to each other.
  - Similarly, they compute shares of  $[b - s]$  and reveal the shares.

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- The parties now have  $x = a - r$  and  $y = b - s$ . Each party computes

$$xy + xs_0 + yr_0 + t_0$$

$$xy + xs_1 + yr_1 + t_1$$

- Observe that

$$ab = (a - r + r)(b - s + s) = (x + r)(y + s)$$

# Beaver triples

- Can we do this without the third party?
- Yes! We can generate beaver triples without a third party using threshold  $t$  out of  $n$  secret sharing.

## More Fun Things

- Our protocol assumes that parties behave honestly – is it secure if parties behave maliciously?
- (No, we need some kind of verifiable secret sharing)

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- How do we show that this protocol is correct and private?  
What does that mean?