

Multiparty Computation (MPC)

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Applied Cryptography 2 – ST 2020

#### Outline

#### **Introduction to Multiparty Computation**

#### **Cryptographic Primitives**

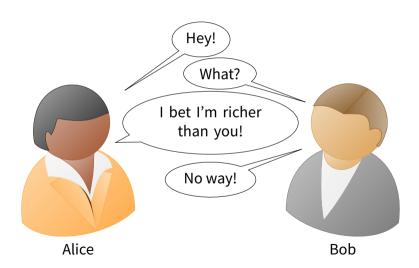
- Preliminaries
- 1-out-of-2 Oblivious Transfer
- 1-out-of-N Oblivious Transfer

#### **Protocols for Multiparty Computation**

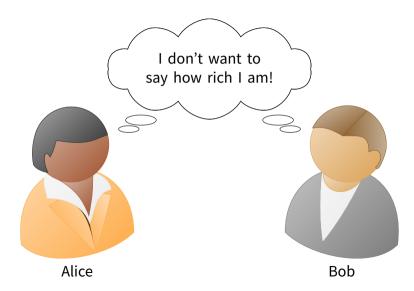
- Yao's Garbled Circuits
- Goldreich-Micali-Wigderson

**Introduction to Multiparty Computation** 

#### Yao's Millionaires' Problem [6]



#### Yao's Millionaires' Problem [6]



#### Secure Function Evaluation

- Generalization of the Problem
  - j parties
  - Inputs:  $x_i \in \{0,1\}^n$
  - Function:  $F: \{0,1\}^{jn} \to \{0,1\}^m$
- Construct protocol that ensures:
  - Some/All Users learns  $F(x_1, ..., x_j)$
  - User *i* learns nothing about  $x_j$  for  $j \neq i$
  - User *i* learns nothing about any intermediate values

#### Secure Function Evaluation (cont.)

- Applied to the Millionaires' Problem
  - 2 parties: Alice and Bob
  - Inputs:  $x_1, x_2 \in \{0, 1\}^{32}$  (32-bit integers)
  - Function:  $F(x_1, x_2) = x_1 > x_2$

#### Secure Function Evaluation (cont.)

- Trivial Solution
  - Use trusted third party
  - Each party sends it's input and desired function to TTP
  - TTP calculates the result and sends it to parties
- Can we do it without a TTP?

#### Secure Function Evaluation (cont.)

- Trivial Solution
  - Use trusted third party
  - Each party sends it's input and desired function to TTP
  - TTP calculates the result and sends it to parties
- Can we do it without a TTP?
  - Yes!
  - Yao: Garbled Circuits [5]
  - Goldreich, Micali, Wigderson: GMW protocol [3]
  - More on these later...

## Cryptographic Primitives

# Preliminaries

#### Reminder: Groups

#### Definition (Group)

An Abelian group  $\langle S, * \rangle$  is a set S and an operation \* that satisfy

- 1. Associative: a \* (b \* c) = (a \* b) \* c
- 2. Commutative: a \* b = b \* a
- 3. Neutral element (identity) e: a \* e = a
- 4. Inverse element  $a^{-1}$  for every  $a: a * a^{-1} = e$

A finite group is a group with a finite number of elements.

#### **Examples:**

 $\langle \mathbb{Z}_p, + \rangle$  is a finite group with identity 0.

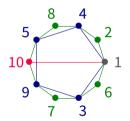
 $\langle \mathbb{Z}_p^*, \cdot \rangle = \langle \mathbb{Z}_p \setminus \{0\}, \cdot \rangle$  is a finite group with identity 1 (if p prime).

### Cyclic groups: Example $(\mathbb{Z}_{11}^*,\cdot)$

Consider  $\mathbb{Z}_{11}^* = \{1, 2, \dots, 10\}$  (order 10, since 11 is prime).

The subgroups of  $(\mathbb{Z}_{11}^*, \cdot)$  are:

Subgroup	Generators	Order
{1}	1	1
$\{1, 10\}$	10	2
$\{1, 3, 4, 5, 9\}$	3, 4, 5, 9	5
$\{1,2,\ldots,10\}$	2, 6, 7, 8	10



 $\mathbb{Z}_{11}^{\ast}$  is cyclic, and the elements 2, 6, 7, 8 are generators.

#### Reminder: Elliptic Curves

#### Elliptic curve over $\mathbb{F}$

Elliptic curve = solutions (x, y) of equation in Weierstrass Form

$$y^2 + a_1 xy + a_3 y = x^3 + a_2 x^2 + a_4 x + a_6$$

Coefficients  $a_1, \ldots, a_6$  and point coordinates x, y: elements of field  $\mathbb{F}$ .

The Weierstrass Form can be simplified for different fields:

Elliptic curve over  $\mathbb{Q}$ ,  $\mathbb{R}$ ,  $\mathbb{C}$ , or any prime field  $\mathbb{F}_{p^m}$  ( $p \neq 2, 3$ )

$$y^2 = x^3 + ax + b$$
 (+some constraints for  $a, b$ 

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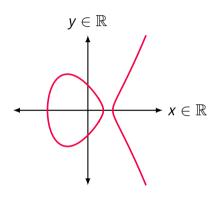
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#### Elliptic curve over $\mathbb{Q}$ , $\mathbb{R}$ , $\mathbb{C}$ , or any prime field $\mathbb{F}_{p^m}$ $(p \neq 2, 3)$

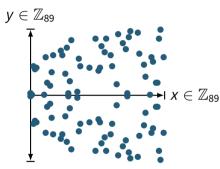
$$y^2 = x^3 + ax + b$$

(+some constraints for a, b)

#### Reminder: Elliptic Curves over Finite Fields



$$y^2 = x^3 - 2x + 1$$
 over  $\mathbb R$ 



$$y^2 = x^3 - 2x + 1$$
 over  $\mathbb{Z}_{89}$  (96 elements)

#### Reminder: The Discrete Logarithm Problem (DLP)

#### Definition (Discrete Logarithm Problem)

Given a prime p, a generator  $g \in \mathbb{Z}_p^*$ , and an element  $y \in \mathbb{Z}_p^*$ , find the integer  $x \in \{0, \dots, p-2\}$  such that  $g^x = y \pmod{p}$ .

#### Definition (Generalized Discrete Logarithm Problem)

Given a finite cyclic group G of order n, a generator  $g \in G$  and an element  $y \in G$ , find  $x \in \{0, \dots, n-1\}$  such that  $g^x = y$ .

The difficulty of the DLP highly depends on the group

- **Example:** DLP in  $(\mathbb{Z}_p,+)$  is easy. We only need to find x such that  $g+g+\ldots+g=g\cdot x=y\pmod p \quad \Rightarrow \quad x=y\cdot g^{-1}\pmod p.$
- **Example:** DLP in  $(\mathbb{Z}_p^*, \cdot)$  is believed to be hard.

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**Example:** DLP in  $(\mathbb{Z}_p,+)$  is easy. We only need to find x such that  $g+g+\ldots+g=g\cdot x=y\pmod p \implies x=y\cdot g^{-1}\pmod p.$ 

**Example:** DLP in  $(\mathbb{Z}_p^*, \cdot)$  is believed to be hard.

#### Reminder: Diffie-Hellman (DH)

#### Definition (Computational Diffie-Hellman Problem)

Given a finite cyclic group G of order n, a generator  $g \in G$ ,  $g^a$  and  $g^b$   $(a, b \in \{0, ..., n-1\}$  and secret), find  $g^{ab}$ .

#### Definition (Decisional Diffie-Hellman Problem)

Given a finite cyclic group G of order n, a generator  $g \in G$ , distinguish the triple  $(g^a, g^b, g^{ab})$  from  $(g^a, g^b, g^c)$ .  $(a, b, c \in \{0, \dots, n-1\}$  and secret)

Best known solution: find a from  $g^a$ , or b from  $g^b$  (= solve DLP)

1-out-of-2 Oblivious Transfer

#### Oblivious Transfer (OT)

#### 1-out-of-2 Oblivious Transfer: $\binom{2}{1}$ -OT

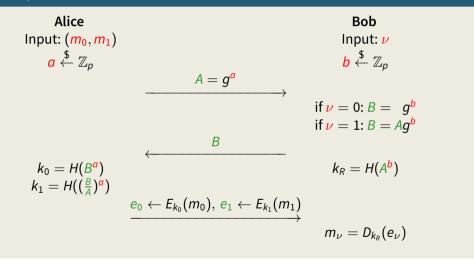
- 2 parties: sender and chooser
- Sender has 2 strings  $m_0, m_1 \in \{0, 1\}^n$
- Chooser has 1 bit  $\nu \in \{0,1\}$
- After protocol:
  - Chooser learns  $m_{\nu}$
  - Chooser learns nothing about  $m_{1-\nu}$
  - lacktriangle Sender learns nothing about u

#### Chou-Orlandi OT

- "The Simplest Protocol for Oblivious Transfer" by Chou and Orlandi [2]
- Idea:
  - Very similar to Diffie-Hellman Key-Exchange
  - Sender generates 2 encryption keys
  - Chooser is able to only learn one
- Security:
  - Based on a variant of CDH problem
  - Recent Result: Security proof has small mistake
    - needs additional fixes for malicious security

#### Chou-Orlandi OT (cont.)

#### "The Simplest Protocol for Oblivious Transfer" [2]

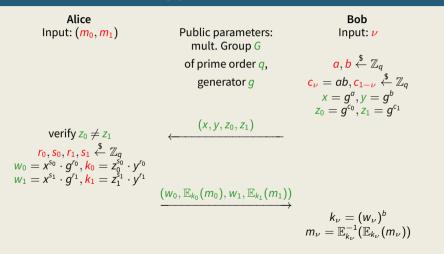


#### Naor-Pinkas OT

- Efficient OT protocol by Naor and Pinkas [4]
- Idea:
  - Sender generates 2 encryption keys
  - Chooser is able to only learn one
- Security:
  - Based on DDH problem
  - Secure for groups with prime order q, where DDH is hard

#### Naor-Pinkas OT (cont.)

#### Naor-Pinkas Oblivious Transfer [4]



1-out-of-N Oblivious Transfer

#### Oblivious Transfer (cont.)

#### 1-out-of-N Oblivious Transfer: $\binom{N}{1}$ -OT

- 2 parties: sender and chooser
- Sender has N strings  $m_0, \ldots, m_{N-1} \in \{0, 1\}^n$
- Chooser has  $\log_2(N)$ -bit value  $\nu \in \{0, \dots, N-1\}$
- After protocol:
  - Chooser learns  $m_{\nu}$
  - Chooser learns nothing about  $m_i \neq m_{\nu}$
  - Sender learns nothing about  $\nu$

## Building $\binom{N}{1}$ -OT

- Instantiate directly if supported (e.g., Naor-Pinkas OT)
- Build from  $\binom{2}{1}$ -OT (Idea: transfer encryption key per bit of  $\nu$ )

### $\binom{N}{1}$ -OT from $\binom{2}{1}$ -OT

- Sender prepares  $L = \log_2(N)$  keypairs:  $(k_1^0, k_1^1), \dots, (k_L^0, k_L^1)$
- Sender encrypts and sends item m<sub>i</sub>:

$$C_i = m_i \oplus \left(\bigoplus_{j=1}^L \mathbb{E}(k_j^{i_j}, i)\right)$$

- For each bit b of  $\nu$ : Perform  $\binom{2}{1}$ -OT to give chooser  $k_j^b$
- Chooser has all keys to decrypt C<sub>ν</sub>

#### Solution to Millionaires' Problem

- We can use  $\binom{N}{1}$ -OT to solve the Millionaires' Problem
  - Constraint: Set of possible inputs is small
  - Assume Alice and Bob have  $i \in S = \{1, ..., 10\}$  million
- Protocol:
  - Alice has 5 million, Bob has 3 million.
  - Alice calculates F(5, y) for all  $y \in S$ 
    - $F(5, \{1, \dots, 4\}) = \text{'Alice'}$
    - F(5,5) = 'Same'
    - $F(5, \{6, \dots, 10\}) = \text{'Bob}$

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#### Solution to Millionaires' Problem (cont.)

- Protocol (cont.)
  - Perform  $\binom{10}{1}$ -OT
  - Alice inputs the 10 results: {'Alice',...,'Same',...,'Bob}
  - Bob's choice is his input value:  $\nu = 3$
  - After the OT, he learns 'Alice' and tells the result to Alice
- Problems:
  - Only practical for small input sets
    - More on that now
  - Only works for honest parties, cannot detect cheating
    - More on that next lecture

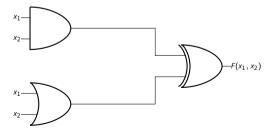
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# Protocols for Multiparty Computation

#### Multiparty Computation (MPC) Protocols

- Shared Idea:
  - Jointly evaluate a circuit calculating  $F(x_1, x_2)$
- Yao's garbled circuits [5]
- Goldreich-Micali-Widgerson protocol [3]

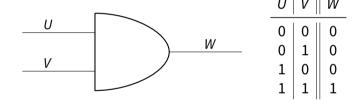


## Yao's Garbled Circuits

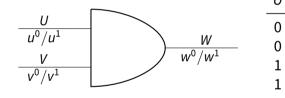
#### **Basics**

- Yao's original solution to his Millionaires' Problem
- Basic Idea:
  - Describe function as boolean circuit
  - Obfuscate (garble) truth tables of gates in circuit
  - Encrypt output values with corresponding input values
    - Allows to decrypt only 1 output
    - No idea if current wire is 0 or 1 due to garbling

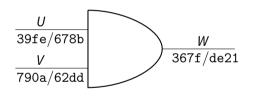
Draw truth table of gate



Assign labels to each wire

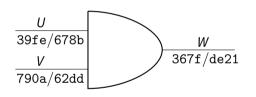


Replace boolean values with wire labels



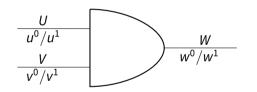
U	V	W
39fe	790a	367f
39fe	62dd	367f
678b	790a	367f
678b	62dd	de21

Encrypt result of gate with input labels



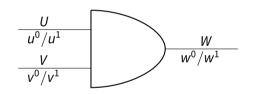
U	V	W
39fe	790a	$\mathbb{E}_{39 fe,790 a}(367 f)$
39fe	62dd	$\mathbb{E}_{39\text{fe},62\text{dd}}(367\text{f})$
678b	790a	$\mathbb{E}_{678b,790a}(367f)$
678b	62dd	$\mathbb{E}_{678 ext{b},62 ext{dd}}( ext{de21})$

Generalized view

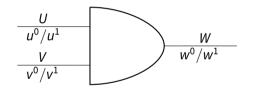


$$\begin{array}{c|c|c|c} U & V & W \\ \hline u^0 & v^0 & \mathbb{E}_{u^0,v^0}(w^0) \\ u^0 & v^1 & \mathbb{E}_{u^0,v^1}(w^0) \\ u^1 & v^0 & \mathbb{E}_{u^1,v^0}(w^0) \\ u^1 & v^1 & \mathbb{E}_{u^1,v^1}(w^1) \end{array}$$

Randomly shuffle table rows



Only keep encrypted result



# **Garbled Table**

$$\mathbb{E}_{u^1, v^0}(w^0) \ \mathbb{E}_{u^1, v^1}(w^1) \ \mathbb{E}_{u^0, v^1}(w^0) \ \mathbb{E}_{u^0, v^0}(w^0)$$

# Garbling a Circuit

- Assign wire labels for 0 and 1 to each wire
- Garble gate:
  - Replace truth table by corresponding wire labels
  - Encrypt output wire labels using input wire labels as keys
  - Randomly shuffle entries in truth table
- Repeat for each gate

# **Input Values**

- Alice is the garbler
  - She knows the wire labels corresponding to her input
  - Can send her wire labels and circuit to Bob
- How does Bob get the wire labels corresponding to his input?
  - Cannot tell Alice his input values directly
- Solution: Use  $\binom{2}{1}$ -OT!
  - For each input wire  $w_i$  corresponding to Bob's input bit  $y_i$
  - Alice is OT-sender with strings  $w_i^0, w_i^0$
  - Bob is OT-chooser with choice bit  $y_i$

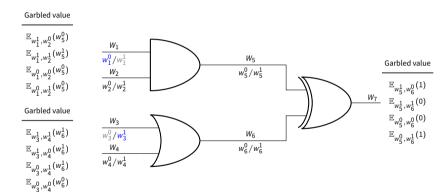
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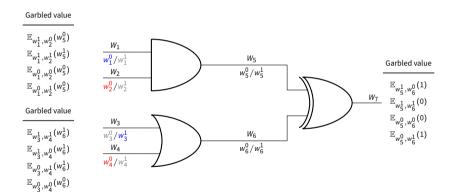
## **Output Values**

- After the evaluation Bob only has the output wire label  $o^x$
- Alice is the garbler, and therefore knows the corresponding value
  - Communicate so one or both parties learn the output
- Other possibility:
  - Do not assign wire labels to output values
  - Last garbled table decrypts directly to 0 or 1

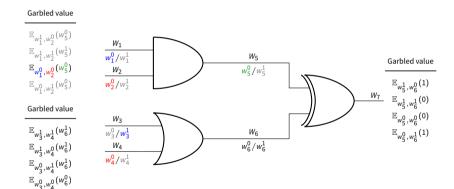
Bob receives the garbled circuit and Alice's input labels



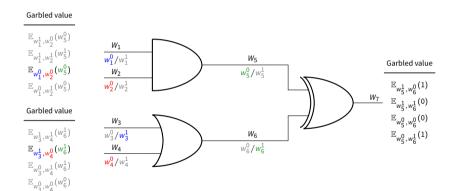
Bob uses  $\binom{2}{1}$ -OT to receive the wire labels for his input



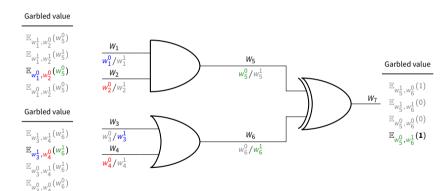
#### Bob evaluates the AND gate



### Bob evaluates the OR gate



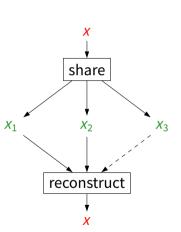
Bob evaluates the XOR gate and obtains the result



Goldreich-Micali-Wigderson

# **Recall: Secret Sharing**

- Split a secret x into shares
- Each party gets a share
- Individual shares give no information about x
- Parties combine their shares to reconstruct x
- Different instantiations of "share" and "reconstruct"
  - *n*-out-of-*n*: all *n* shares are needed to reconstruct
  - k-out-of-n: any k shares suffice to reconstruct



# Recall: Additive Secret Sharing

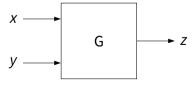
- For an arbitrary group  $\langle G, \circ \rangle$  we can share any  $x \in G$ :
  - Pick  $x_A \in G$  at random
  - Define  $x_B = x_A^{-1} \circ x$
  - Given only one of  $x_A$  or  $x_B$ , x is perfectly hidden
  - Given both,  $\mathbf{x}$  can be restored ( $\mathbf{x} = x_A \circ x_B$ )
  - Extends to arbitrary amount of shares by picking all but last share as random
- Example group  $\langle \{0,1\}, \oplus \rangle$ :
  - Shares of x are  $x_A \stackrel{\$}{\leftarrow} \{0,1\}$  and  $x_B = x \oplus x_A$
  - Reconstruct:  $\mathbf{x} = \mathbf{x}_A \oplus \mathbf{x}_B$

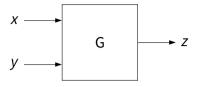
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#### **GMW Protocol**

- By Goldreich, Micali and Wigderson (1987)
- Basic Idea:
  - Secret-share all input with other party
  - Build logic circuit with 2-input gates (e.g., AND, XOR)
  - Jointly evaluate each gate (z = G(x, y))





- Additive Secret Sharing using XOR
- Alice knows  $x_A, y_A$ , Bob knows  $x_B, y_B$
- Alice samples  $z_A$  at random

$$\mathbf{z}_{B}=\mathbf{z}_{A}\oplus\mathbf{G}(\mathbf{x}_{A}\oplus\mathbf{x}_{B},\mathbf{y}_{A}\oplus\mathbf{y}_{B})$$

$$\mathbf{z}_{B} = \mathbf{z}_{A} \oplus \mathbf{G}(\mathbf{x}_{A} \oplus \mathbf{x}_{B}, \mathbf{y}_{A} \oplus \mathbf{y}_{B})$$

- Alice can use  $\binom{4}{1}$ -OT to give Bob his share of the result
- Due to properties of OT, Alice learns nothing about  $x_B, y_B$
- Due to properties of OT and secret sharing, Bob learns nothing about  $x_A$ ,  $y_A$
- Let's demonstrate for an AND gate:

<b>X</b> B	<b>У</b> В	$\nu$	$\mathbf{z}_{B}$
0	0	0	$((x_A \oplus 0)\&(y_A \oplus 0)) \oplus z_A$
0	1	1	$((x_A \oplus 0)\&(y_A \oplus 1)) \oplus z_A$
1	0	2	$((x_A \oplus 1)\&(y_A \oplus 0)) \oplus z_A$
1	1	3	$ \begin{vmatrix} ((x_A \oplus 0)\&(y_A \oplus 0)) \oplus z_A \\ ((x_A \oplus 0)\&(y_A \oplus 1)) \oplus z_A \\ ((x_A \oplus 1)\&(y_A \oplus 0)) \oplus z_A \\ ((x_A \oplus 1)\&(y_A \oplus 1)) \oplus z_A \end{vmatrix} $

- We can now efficiently handle one gate G
- Whole Circuit?
  - Each party secret-shares its input values with other party
  - Agree on order of the gates in the circuit
  - Alice evaluates each gate, acting as the OT-sender
  - Bob acts as the OT-chooser and gets his share of the output
  - Iteratively compute the whole circuit
  - Exchange shares of output gate(s) at the end

- Bonus: XOR gates do not require OT
  - Additive Secret Sharing!
  - Set  $z_A = x_A \oplus y_A$ ,  $z_B = x_B \oplus y_B$
- Proof:

$$z = z_A \oplus z_B = (x_A \oplus y_A) \oplus (x_B \oplus y_B)$$
  
=  $(x_A \oplus x_B) \oplus (y_A \oplus y_B) = x \oplus y$ .



## Summary

- MPC Protocols
  - Yao's Garbled Circuits [5]
  - GMW [3]
- Powered by OT
- Solution to Millionaires' Problem
  - Build boolean circuit to evaluate *x* < *y*
  - Use Yao or GMW to evaluate

# Questions you should be able to answer

- 1. What is oblivious transfer and what are the properties for the sender and receiver? Give an example for an OT protocol.
- 2. Describe the steps involved Yao's garbled circuit protocol. When do the parties need to interact with each other?
- 3. Describe the GMW protocol. When do the parties need to interact with each other? What needs to be done during this interaction?
- 4. Alice and Bob want to know which of them has more money, without disclosing their respective amounts. Give a detailed solution to this problem using either GMW or Yao.

# Bibliography I

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