



# Introduction to Secure Multi-Party Computation

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# Secure Multi-Party Computation

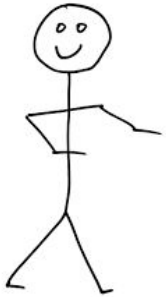
- Requirements
  - $n$  actors with private data  $x_1, x_2, \dots, x_n$
  - compute  $F(x_1, x_2, \dots, x_n)$
  - don't leak any other information
  - no trusted third parties
- Applications
  - Distributed voting
  - Private bidding and auctions



# The Millionaire Problem - Yao

Do you have more money?

- Don't leak any other information
- No trusted third-party



you, a multi-millionaire



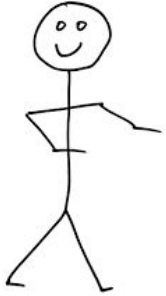
me, also a multi-millionaire



# The Millionaire Problem - Yao

Does Alice have more money? Effectively:  $A \geq B$

- Assume  $A, B \in \{1, 2, \dots, 10\}$
- Alice has public RSA key  $(e, n)$  and private  $(d, n)$



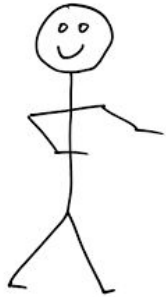
Alice, \$A Million



Bob, \$B Million



# The Millionaire Problem - Yao



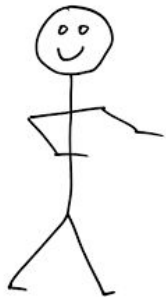
Alice, \$A Million

- choose random  $x$  such that  $|x| = |n|$
- $c = \text{encrypt}(x)$  using Alice's public key  $(e, n)$
- $m = c - B + 1 \bmod n$



Bob, \$B Million

# The Millionaire Problem - Yao



Alice, \$A Million

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←  $m$  looks random



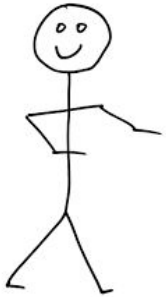
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$\leftarrow m$  looks random

- $X_i = \text{decrypt}(m + i - 1), i \in [1, 10]$   $X_B = x$ , but all  $X_i$  look random



Alice, \$A Million



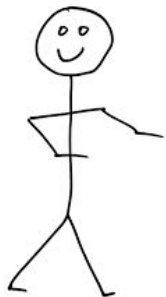
Bob, \$B Million

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- $X_i = \text{decrypt}(m + i - 1), i \in [1, 10]$   $X_B = x$ , but all  $X_i$  look random
- choose a random prime  $p$  such that  $|p| = |n|/2$  and calculate  $X_i \bmod p$   $X_i \bmod p$  all look random
- $W_i = (X_i \bmod p + (i > A)) \bmod p, i \in [1, 10]$   
add 1 (mod  $p$ ) iff  $i$  is greater than Alice's wealth



Alice, \$A Million



Bob, \$B Million



# The Millionaire Problem - Yao

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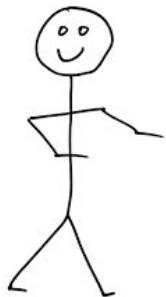
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add 1 (mod  $p$ ) iff  $i$  is greater than Alice wealth

1 was added to  $W_B$  iff  $B > A$

$W_i$  looks random and Bob can't  
tell when 1 was added

$p, W_1 \dots W_{10} \rightarrow$



Alice, \$A Million



Bob, \$B Million

# The Millionaire Problem - Yao

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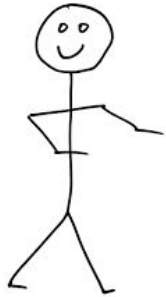
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tell when 1 was added

- result =  $(W_B \equiv x \pmod{p})$

$p, W_1 \dots W_{10} \rightarrow$



Alice, \$A Million



Bob, \$B Million

# The Millionaire Problem - Yao

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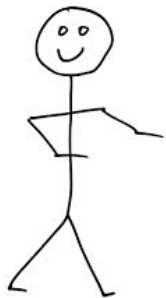
$p, W_1 \dots W_{10} \rightarrow$

- $\text{result} = (W_B \equiv x \bmod p)$

If  $A \geq B$ , then 0 added, so

$$W_B = X_B \bmod p = x \bmod p$$

← result 1 iff  $A \geq B$



Alice, \$A Million



Bob, \$B Million



# The Millionaire Problem - Yao

- Correctness
  - result is 1 iff  $A \geq B$
- Security
  - Alice learns random number  $m$
  - Bob learns random prime  $p$
  - Bob learns  $W_1 \dots W_{10}$ 
    - Bob can't calculate  $X_i$  except when  $i = B$ , so Bob can't calculate other  $W_i$
    - Bob can't recover  $X_i$  from  $W_i$  due to loss of information with mod  $p$



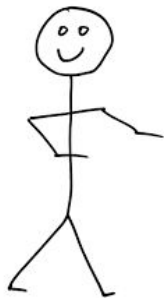
# The Millionaire Problem - Yao

- Assumptions
  - Actors will follow protocol
  - Actors won't lie about wealth
  - Actors won't broadcast their wealth
- Ideal vs. Real World
  - Ideal has a trusted third-party
  - Real world must mimic ideal level of security



# Oblivious Transfer (OT)

- Alice offers  $n$  messages, Bob selects and receives one
  - Alice doesn't know which Bob chose
  - Bob doesn't know the other messages
  - Without loss of generality, we will assume single-bit messages

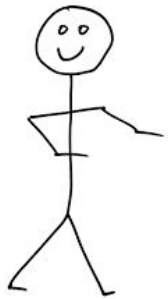


Alice, has  $b_1, b_2, \dots, b_n$



Bob, wants  $b_i$

# OT - Goldreich, Micali, Wigderson



Alice, has  $b_1, b_2, \dots, b_n$

- choose  $(f, f^{-1}, B_f)$  **random trapdoor permutation**  
(function, inverse function, hard-core bit)

$f, B_f \rightarrow$



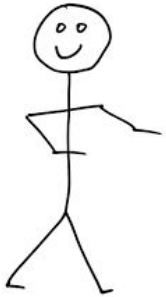
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- choose  $(f, f^{-1}, B_f)$  **random trapdoor permutation**  
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$f, B_f \rightarrow$

- choose random  $x_1, x_2, \dots, x_n$
  - $(y_1, y_2, \dots, y_n) = (x_1, x_2, \dots, f(x_i), \dots, x_n)$
- $\leftarrow (y_1, \dots, y_n)$  **looks random**



Alice, has  $b_1, b_2, \dots, b_n$



Bob, wants  $b_i$



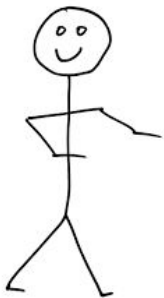
# OT - Goldreich, Micali, Widgerson

- choose  $(f, f^{-1}, B_f)$  **random trapdoor permutation**  
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$$f, B_f \rightarrow$$

- choose random  $x_1, x_2, \dots, x_n$
- $(y_1, y_2, \dots, y_i, \dots, y_n) = (x_1, x_2, \dots, f(x_i), \dots, x_n)$   
 $\leftarrow (y_1, \dots, y_n)$  **looks random**

- compute  $(c_1, \dots, c_n) = (B_f(f^{-1}(y_1)), \dots, B_f(f^{-1}(y_n)))$   **$c_i = B_f(x_i)$**
- compute  $(d_1, \dots, d_n) = (b_1 \oplus c_1, \dots, b_n \oplus c_n)$   **$d_i = b_i \oplus x_i$**   
**looks random**  $(d_1, \dots, d_n) \rightarrow$



Alice, has  $b_1, b_2, \dots, b_n$



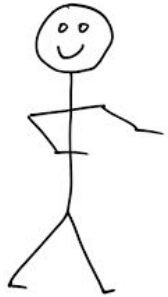
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 $\leftarrow (y_1, \dots, y_n)$  **looks random**



Alice, has  $b_1, b_2, \dots, b_n$

- compute  $(c_1, \dots, c_n) = (B_f(f^{-1}(y_1)), \dots, B_f(f^{-1}(y_n)))$   $c_i = x_i$
- compute  $(d_1, \dots, d_n) = (b_1 \oplus c_1, \dots, b_n \oplus c_n)$   $d_i = b_i \oplus x_i$   
**looks random**  $(d_1, \dots, d_n) \rightarrow$

- result**  $= d_i \oplus x_i$  **result**  $= b_i$



Bob, wants  $b_i$



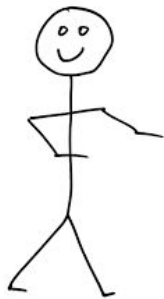
# OT - Goldreich, Micali, Widgerson

- Correctness
  - result is  $b_i$
- Security
  - Alice learns  $(y_1, \dots, y_n)$  which all look random
  - Alice doesn't learn anything about  $i$
  - Bob learns  $(d_1, \dots, d_n)$  which all look random except  $d_i$
  - Bob can't calculate any other  $b_j$ 
    - $d_j = b_j \oplus c_j$
    - $c_j$  calculated with inverse of trapdoor function
    - xor with random loses all information



## OT used for simple SMPC

- Alice and Bob have private inputs  $x$  and  $y$  respectively
- Want to compute boolean function  $F(x, y)$



Alice, has  $x$

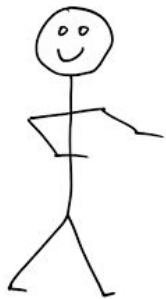


Bob, has  $y$



## OT used for simple SMPC

- Alice computes  $b_0 = F(x, 0)$  and  $b_1 = F(x, 1)$
- Bob uses OT to learn  $b_y = F(x, y)$
- Bob shares the answer with Alice



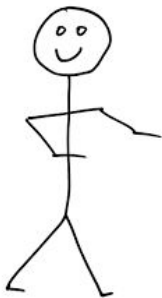
Alice, has  $x$



Bob, has  $y$

# OT used for simple SMPC

- Alice computes  $b_0 = F(x, 0)$  and  $b_1 = F(x, 1)$
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- Bob shares the answer with Alice



Alice, has  $x$

- Consider  $F(x, y) = x \wedge y$ 
  - Alice has  $x = 0$ :  $F(0, y)$  doesn't leak  $y$
  - Bob has  $y = 0$ :  $F(x, 0)$  doesn't leak  $x$
  - Alice has  $x = 1$ :  $F(1, y)$  leaks  $y$
  - Holds up to security of ideal world

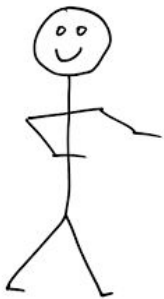


Bob, has  $y$



## OT used for simple SMPC

- Alice computes  $b_0 = F(x, 0)$  and  $b_1 = F(x, 1)$
- Bob uses OT to learn  $b_y = F(x, y)$
- Bob shares the answer with Alice
- Single-gate, single-bit boolean functions only
  - Otherwise Alice would gain information at each individual OT



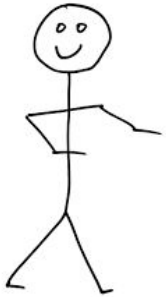
Alice, has  $x$



Bob, has  $y$

# OT used for SMPC

- Alice and Bob have private inputs  $x$  and  $y$  respectively
- Want to compute boolean function  $F(x, y)$  where  $F$  consists of multiple gates and  $x$  and  $y$  are multiple bits
  - Each step will consider a single gate with single-bit inputs  $f(a, b)$  with the output encoded



Alice, has  $x$



Bob, has  $y$



# OT used for SMPC

- create encryption schemes  $S_1 = (E_1, D_1)$  to  $S_6$
- randomly select  $p, s, m$ , and  $u$
- randomly assign  $S_3$  and  $S_4$  complimentary bits
- randomly assign  $S_5$  and  $S_6$  complimentary bits
- create table for  $f(a, b)$

← table with rows permuted and no private values  
 ←  $D_3$  or  $D_4$  dependent on  $b$



Alice, has  $a$

0:  $S_1$   
1:  $S_2$

0:  $S_3$   
1:  $S_4$

$S_1$	$E_1(p)$	$S_3$	$E_3(q)$
$S_1$	$E_1(s)$	$S_4$	$E_4(t)$
$S_2$	$E_2(m)$	$S_3$	$E_3(n)$
$S_2$	$E_2(u)$	$S_4$	$E_4(v)$

0:  $S_5$   
1:  $S_6$

Example:  $F(a, b) = a \wedge b$

$$p \oplus q = D_5 \quad (0 \wedge 0 = 0)$$

$$s \oplus t = D_5 \quad (0 \wedge 1 = 0)$$

$$m \oplus n = D_5 \quad (1 \wedge 0 = 0)$$

$$u \oplus v = D_6 \quad (1 \wedge 1 = 1)$$



Bob, has  $b$

# OT used for SMPC

- create encryption schemes  $S_1 = (E_1, D_1)$  to  $S_6$
- randomly select  $p, s, m$ , and  $u$
- randomly assign  $S_3$  and  $S_4$  complimentary bits
- randomly assign  $S_5$  and  $S_6$  complimentary bits
- create table for  $f(a, b)$

- ← table with rows permuted and no private values
- ←  $D_3$  or  $D_4$  dependent on  $b$
- ←  $D_1$  or  $D_2$  sent using OT dependent on  $a$

Example:  $F(a, b) = a \wedge b$

$$p \oplus q = D_5 \quad (0 \wedge 0 = 0)$$

$$s \oplus t = D_5 \quad (0 \wedge 1 = 0)$$

$$m \oplus n = D_5 \quad (1 \wedge 0 = 0)$$

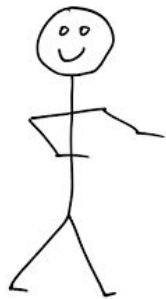
$$u \oplus v = D_6 \quad (1 \wedge 1 = 1)$$

$S_1$	$E_1(p)$	$S_3$	$E_3(q)$
$S_1$	$E_1(s)$	$S_4$	$E_4(t)$
$S_2$	$E_2(m)$	$S_3$	$E_3(n)$
$S_2$	$E_2(u)$	$S_4$	$E_4(v)$

0:  $S_1$   
1:  $S_2$

0:  $S_3$   
1:  $S_4$

0:  $S_5$   
1:  $S_6$



Alice, has  $a$

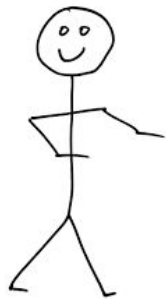


Bob, has  $b$

# OT used for SMPC

- use the pair of decryption keys to decode the pair of values  $k, l$  in a row
- $D_i = k \oplus l$   **$D_i = D_5$  or  $D_6$**
- result = 0 if  $D_5$ , 1 otherwise **result =  $f(a, b)$**

result  $\rightarrow$



Alice, has  $a$

$a = 0: S_1$   
 $a = 1: S_2$

$S_1$	$E_1(p)$	$S_3$	$E_3(q)$
$S_1$	$E_1(s)$	$S_4$	$E_4(t)$
$S_2$	$E_2(m)$	$S_3$	$E_3(n)$
$S_2$	$E_2(u)$	$S_4$	$E_4(v)$

0:  $S_5$   
 1:  $S_6$

**$b = 0: S_3$**   
 **$b = 1: S_4$**



Bob, has  $b$

- create encryption schemes and table

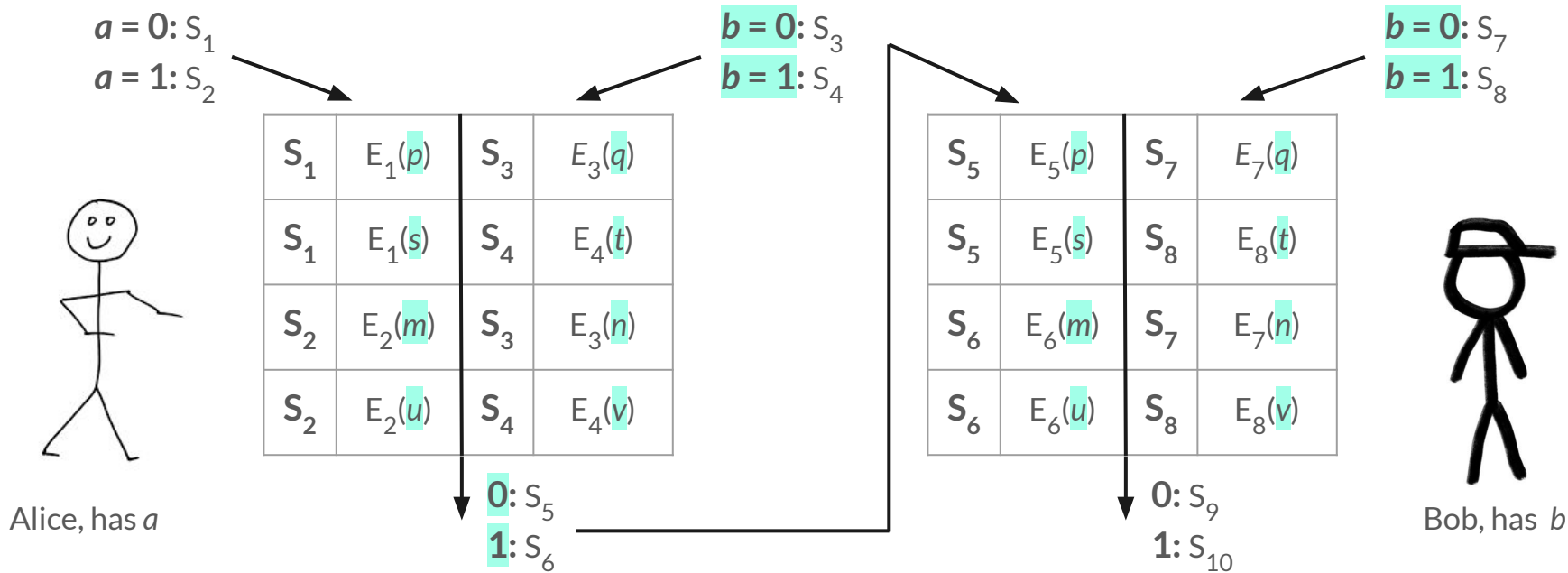
$\leftarrow$  table with rows permuted and no private values

$\leftarrow D_3$  or  $D_4$  dependent on  $b$

$\leftarrow D_1$  or  $D_2$  sent using OT dependent on  $a$

# OT used for SMPC

- combine single-bit, single-gate steps
  - keep intermediate output assignments private
  - Use intermediate outputs as inputs





# OT used for SMPC

- Correctness
  - result of each step is  $f(x, y)$ 
    - final result is  $F(a, b)$
  - any boolean function can be composed with  $\wedge$  and  $\neg$
- Security
  - Alice learns either  $D_3$  or  $D_4$ , uncorrelated with  $b$
  - Alice learns only  $D_1$  or  $D_2$ , according to  $a$
  - Alice can only compute either  $D_5$  or  $D_6$  with both  $k$  and  $l$ 
    - xor with random renders partial information useless
  - Alice doesn't learn intermediate outputs because correlation is private
  - Bob learns only the final result
  - Bob doesn't learn intermediate outputs because no information transfer



# Secure Multi-Party Computation

- Recap
  - we've shown any boolean function can be securely computed
  - constraints - two actors, passive adversaries
- Goldreich, Micali, and Widgerson proved completeness for  $n$  actors
  - can have malicious adversaries provided at least  $n/2$  are honest



## Works Cited

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- M. J. Fischer, "Lecture Notes: CPSC 461b: Foundations of Cryptography." *Yale University Department of Computer Science*, 2009.