

MIT 6.875

Foundations of Cryptography

Lecture 18

New Topic:
Secure Computation

Secure Two-Party Computation

Input: x



Alice

Output: $F_A(x, y)$

Input: y



Bob

Output: $F_B(x, y)$



Secure Two-Party Computation

Input: x



Alice

Input: y



Bob



Output: $F_A(x, y)$

Output: $F_B(x, y)$

Security:

- Alice should not learn anything more than x and $F_A(x, y)$.
- Bob should not learn anything more than y and $F_B(x, y)$.

Secure Two-Party Computation

Input: x



Alice

Output: $F_A(x, y)$

Input: y



Bob

Output: $F_B(x, y)$



Malicious Security:

- No (PPT) Alice* can learn anything more than x^* and $F_A(x^*, y)$.
- No (PPT) Bob* can learn anything more than y^* and $F_B(x, y^*)$.

Tool 1: Secret Sharing

secret b

Secret Sharing



Dealer

share s_1



P_1

share s_2



P_2

share s_3



P_3

share s_4



P_4

share s_n



P_n

- ❑ Any **“authorized”** subset of players **can recover** b .
- ❑ No other subset of players **has any info** about b .
- Threshold (or t -out-of- n) SS [Shamir'79, Blakley'79]:
 - “authorized” subset = has size $\geq t$.

secret $b \in Z_p$

2-out-of-n Secret Sharing?



Dealer



P_1



P_2



P_3



P_4

...



P_n

Here is a solution.

Repeat for every two-person subset $\{P_i, P_j\}$:

- Generate a 2-out-of-2 secret sharing (s_i, s_j) of b .
- Give s_i to P_i and s_j to P_j

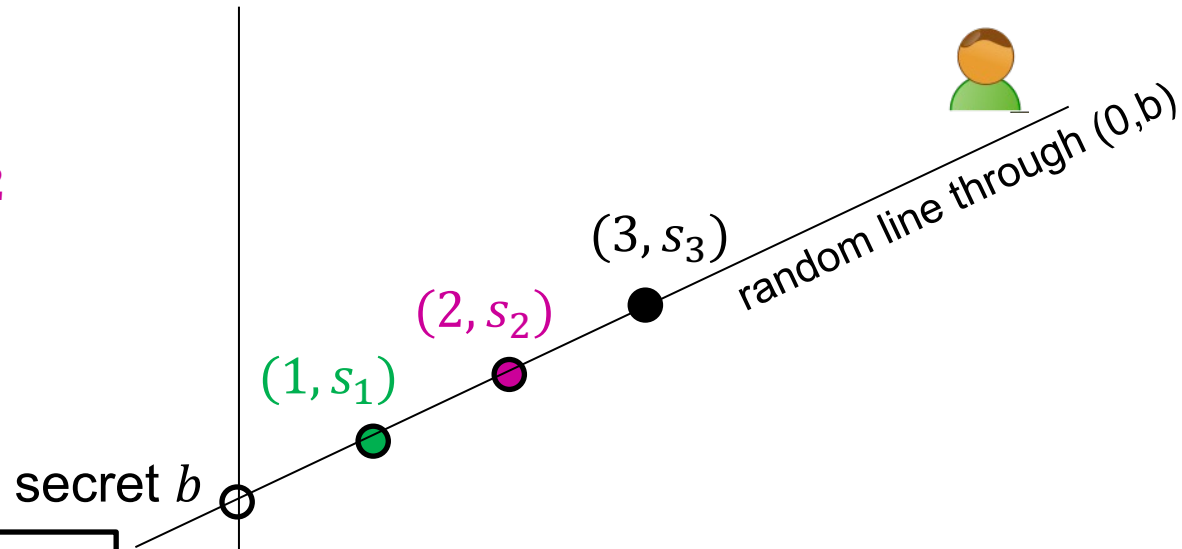
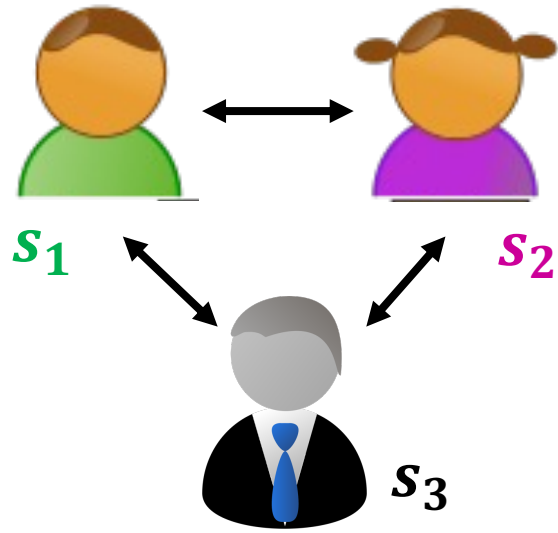
What is the size of shares each party gets?

How does this scale to t -out-of- n ?

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

Shamir's 2-out-of-n Secret Sharing



Each share s_i is truly random (independent of secret b)
Any two shares uniquely determine b .

Shamir's 2-out-of-n Secret Sharing

1. The dealer picks a uniformly random line (**mod p**) whose constant term is the secret b .

$$f(x) = ax + b \text{ where } a \text{ is uniformly random mod } p$$

2. Compute the shares:

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Correctness: can recover secret from any two shares.

Proof: Parties i and j , given shares $s_i = ai + b$ and $s_j = aj + b$ can solve for b ($= \frac{js_i - is_j}{j-i}$).

Shamir's 2-out-of-n Secret Sharing

1. The dealer picks a uniformly random line (**mod p**) whose constant term is the secret b .

$$f(x) = ax + b \text{ where } a \text{ is uniformly random mod } p$$

2. Compute the shares:

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Security: any single party has no information about the secret.

Proof: Party i 's share $s_i = a * i + b$ is uniformly random, independent of b , as a is random and so is $a * i$.

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

1. The dealer picks a uniformly random degree-(t-1) polynomial (**mod p**) whose constant term is the secret b .

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

2. Compute the shares:

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Correctness: can recover secret from any t shares.

Security: the distribution of *any* $t - 1$ shares is independent of the secret.

Note: need p to be larger than the number of parties n .

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Correctness: *via Vandermonde matrices.*

Let's look at shares of parties P_1, P_2, \dots, P_t .

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \\ \dots \\ s_t \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & \dots & 1 \\ 1 & 2 & 2^2 & \dots & 2^{t-1} \\ 1 & 3 & 3^2 & \dots & 3^{t-1} \\ \dots & \dots & \dots & \dots & \dots \\ 1 & t & t^2 & \dots & t^{t-1} \end{bmatrix} \begin{bmatrix} b \\ a_1 \\ a_2 \\ \dots \\ a_{t-1} \end{bmatrix} \pmod{p}$$

*t-by-t Vandermonde matrix which is **invertible***

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Correctness: Alternatively, *Lagrange interpolation* gives an explicit formula that recovers b .

$$b = f(0) = \sum_{i=1}^t f(i) \left(\prod_{1 \leq j \leq t, j \neq i} \frac{-x_j}{x_i - x_j} \right)$$

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Security:

Let's look at shares of parties P_1, P_2, \dots, P_{t-1} .

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \\ \dots \\ s_{t-1} \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & \dots & 1 \\ 1 & 2 & 2^2 & \dots & 2^{t-1} \\ 1 & 3 & 3^2 & \dots & 3^{t-1} \\ \dots & \dots & \dots & \dots & \dots \\ 1 & t-1 & (t-1)^2 & \dots & (t-1)^{t-1} \end{bmatrix} \begin{bmatrix} b \\ a_1 \\ a_2 \\ \dots \\ a_{t-1} \end{bmatrix} \pmod{p}$$

(t-1)-by-t Vandermonde matrix

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Security: For every value of b there is a unique polynomial with constant term b and shares s_1, s_2, \dots, s_{t-1} .

$$\begin{bmatrix} s_1 \\ s_2 \\ s_3 \\ \dots \\ s_{t-1} \end{bmatrix} = \begin{bmatrix} 1 & 1 & 1 & \dots & 1 \\ 1 & 2 & 2^2 & \dots & 2^{t-1} \\ 1 & 3 & 3^2 & \dots & 3^{t-1} \\ \dots & \dots & \dots & \dots & \dots \\ 1 & t-1 & (t-1)^2 & \dots & (t-1)^{t-1} \end{bmatrix} \begin{bmatrix} b \\ a_1 \\ a_2 \\ \dots \\ a_{t-1} \end{bmatrix} \pmod{p}$$

(t-1)-by-t Vandermonde matrix

Shamir's t-out-of-n Secret Sharing

Key Idea: Polynomials are Amazing!

$$f(x) = a_{t-1}x^{t-1} + \dots + a_1x + b$$

where a_i are uniformly random mod p

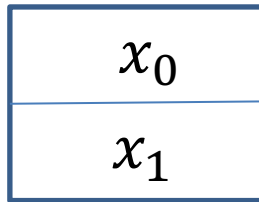
$$s_1 = f(1), s_2 = f(2), \dots, s_i = f(i), \dots, s_n = f(n)$$

Security: For every value of b there is a unique polynomial with constant term b and shares s_1, s_2, \dots, s_{t-1} .

Corollary: for every value of the secret b is equally likely given the shares s_1, s_2, \dots, s_{t-1} . In other words, the secret b is perfectly hidden given $t - 1$ shares.

Tool 2: Oblivious Transfer

Oblivious Transfer (OT)



Sender



Receiver

Choice bit: b

- Sender holds two bits/strings x_0 and x_1 .
- Receiver holds a choice bit b .
- Receiver should learn x_b , sender should learn nothing.

(We will consider **honest-but-curious** adversaries; formal definition in a little bit...)

Why OT? The Dating Problem

$\alpha \in \{0,1\}$

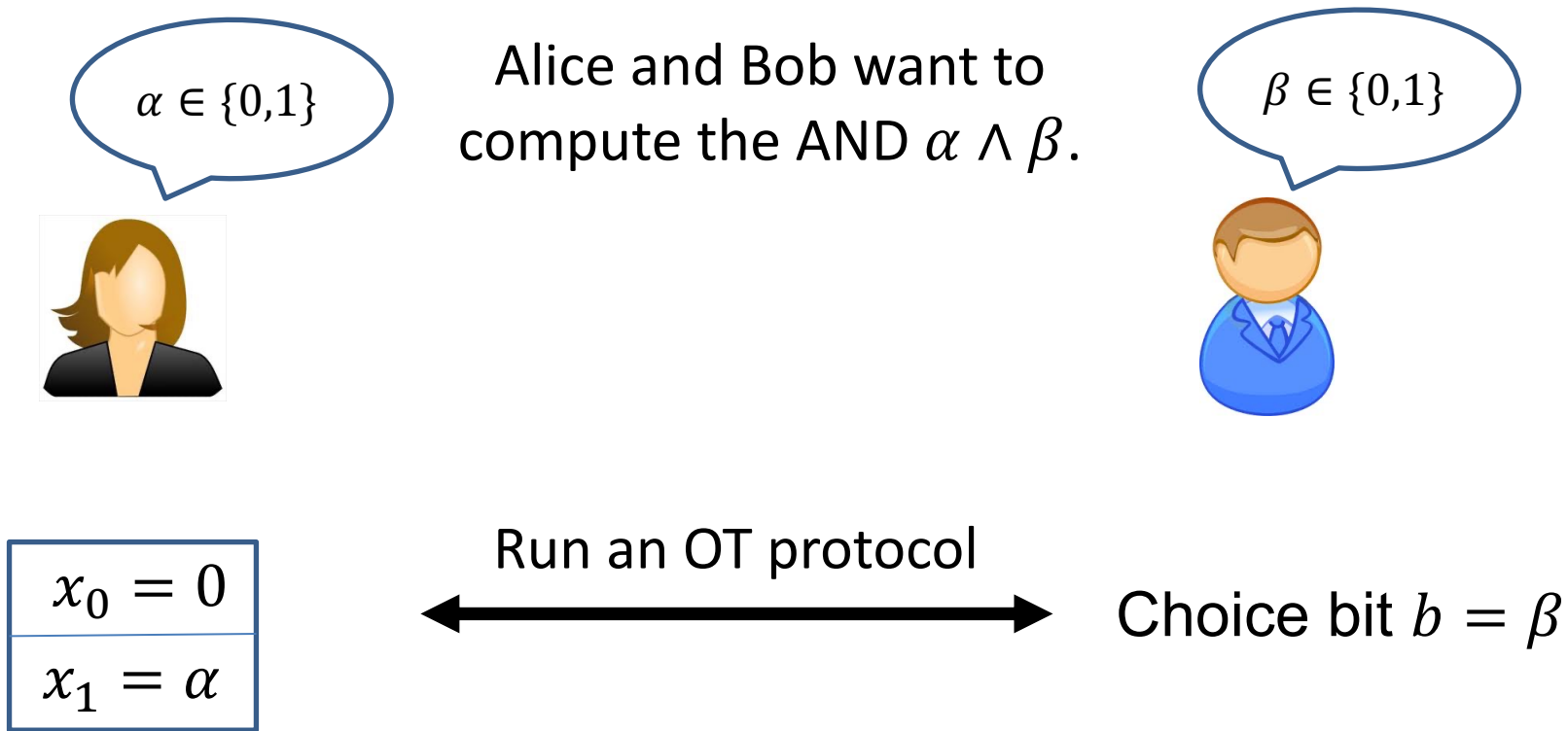


Alice and Bob want to compute the AND $\alpha \wedge \beta$.

$\beta \in \{0,1\}$



Why OT? The Dating Problem



Bob gets α if $\beta=1$, and 0 if $\beta=0$

Here is a way to write the OT selection function: $x_1 b + x_0(1 - b)$

which, in this case is $= \alpha\beta$.

The Billionaires' Problem

Net worth:
\$X



Net worth:
\$Y



Who is richer?

The Billionaires' Problem

$$f(X, Y) = 1$$

if and only if $X > Y$



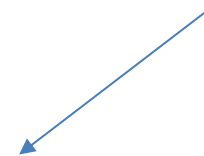
X



Unit Vector $u_X = 1$ in the X^{th} location and 0 elsewhere



Y



Vector $v_Y = 1$ from the $(Y + 1)^{th}$ location onwards

$$f(X, Y) = \langle u_X, v_Y \rangle = \sum_{i=1}^U u_X[i] \wedge v_Y[i]$$

~~Compute each AND individually and sum it up?~~

Detour: OT \Rightarrow Secret-Shared-AND

$\alpha \in \{0,1\}$



Output: γ

Alice gets random γ , Bob gets random δ s.t. $\gamma \oplus \delta = \alpha\beta$.

$\beta \in \{0,1\}$



Output: δ

$x_0 = \gamma$
$x_1 = \alpha \oplus \gamma$

Run an OT protocol



Choice bit $b = \beta$

Alice outputs γ .

Bob gets $x_1 b + x_0(1 \oplus b) = (x_1 \oplus x_0)b + x_0 = \alpha\beta \oplus \gamma := \delta$

The Billionaires' Problem



$$f(X, Y) = 1 \\ \text{if and only if } X > Y$$



...	0	1	0	0	...
-----	---	---	---	---	-----

Unit Vector u_X

...	0	1	1	1	1	1	1
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Vector v_Y

$$f(X, Y) = \langle u_X, v_Y \rangle = \sum_{i=1}^U u_X[i] \wedge v_Y[i]$$

1. Alice and Bob run many OTs to get (γ_i, δ_i) s.t.

$$\gamma_i \oplus \delta_i = u_X[i] \wedge v_Y[i]$$

2. Alice computes $\gamma = \bigoplus_i \gamma_i$ and Bob computes $\delta = \bigoplus_i \delta_i$.

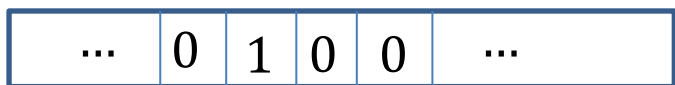
3. Alice reveals γ and Bob reveals δ .

Check (correctness): $\gamma \oplus \delta = \langle u_X, v_Y \rangle = f(X, Y)$.

The Billionaires' Problem



$$f(X, Y) = 1 \\ \text{if and only if } X > Y$$



Unit Vector u_X



Vector v_Y

$$f(X, Y) = \langle u_X, v_Y \rangle = \sum_{i=1}^U u_X[i] \wedge v_Y[i]$$

1. Alice and Bob run many OTs to get (γ_i, δ_i) s.t.

$$\gamma_i \oplus \delta_i = u_X[i] \wedge v_Y[i]$$

2. Alice computes $\gamma = \bigoplus_i \gamma_i$ and Bob computes $\delta = \bigoplus_i \delta_i$.

Check (privacy): Alice & Bob get a bunch of random bits.

“OT is Complete”

Theorem (lec18-19): OT can solve not just love and money, but **any** two-party (and multi-party) problem efficiently.



Defining Security: The Ideal/Real Paradigm

Secure Two-Party Computation

**REAL
WORLD:**

Input: x

Input: y



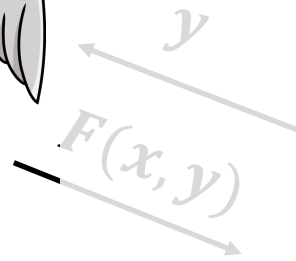
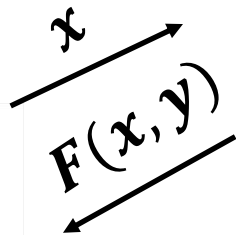
Alice



Bob



**IDEAL
WORLD:**



Secure Two-Party Computation

Input: x



Alice



Input: y



Bob

There exists a PPT simulator SIM_A such that for any x and y :

$$SIM_A(x, F(x, y)) \cong View_A(x, y)$$

Secure Two-Party Computation

Input: x



Alice



Input: y

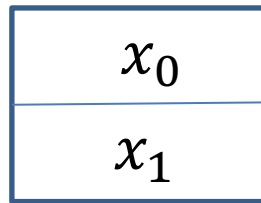


Bob

There exists a PPT simulator SIM_B such that for any x and y :

$$SIM_B(y, F(x, y)) \cong View_B(x, y)$$

OT Definition



Sender



Choice bit: b

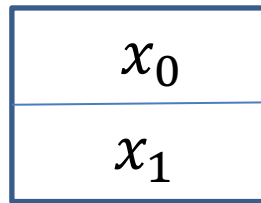


Receiver

Receiver Security: Sender should not learn b .

Define Sender's view $View_S(x_0, x_1, b)$ = her random coins and the protocol messages.

OT Definition



Sender



Receiver

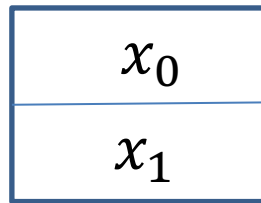
Choice bit: b

Receiver Security: Sender should not learn b .

There exists a PPT simulator SIM_S such that for any x_0, x_1 and b :

$$SIM_S(x_0, x_1) \cong View_S(x_0, x_1, b)$$

OT Definition



Sender



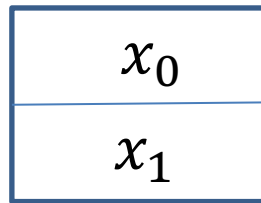
Receiver

Choice bit: b

Sender Security: Receiver should not learn x_{1-b} .

Define Receiver's view $View_R(x_0, x_1, b)$ = his random coins and the protocol messages.

OT Definition



Sender



Receiver

Choice bit: b

Sender Security: Receiver should not learn x_{1-b} .

There exists a PPT simulator SIM_R such that for any x_0, x_1 and b :

$$SIM_R(b, x_b) \cong View_R(x_0, x_1, b)$$

OT Protocols

OT Protocol 1: Trapdoor Permutations

For concreteness, let's use the RSA trapdoor permutation.



Input bits: (x_0, x_1)



Choice bit: b

Pick $N = PQ$ and
RSA exponent e .

N, e



Choose random r_b and
set $s_b = r_b^e \pmod N$

s_0, s_1



Choose random s_{1-b}

Compute r_0, r_1 and
one-time pad x_0, x_1
using hardcore bits

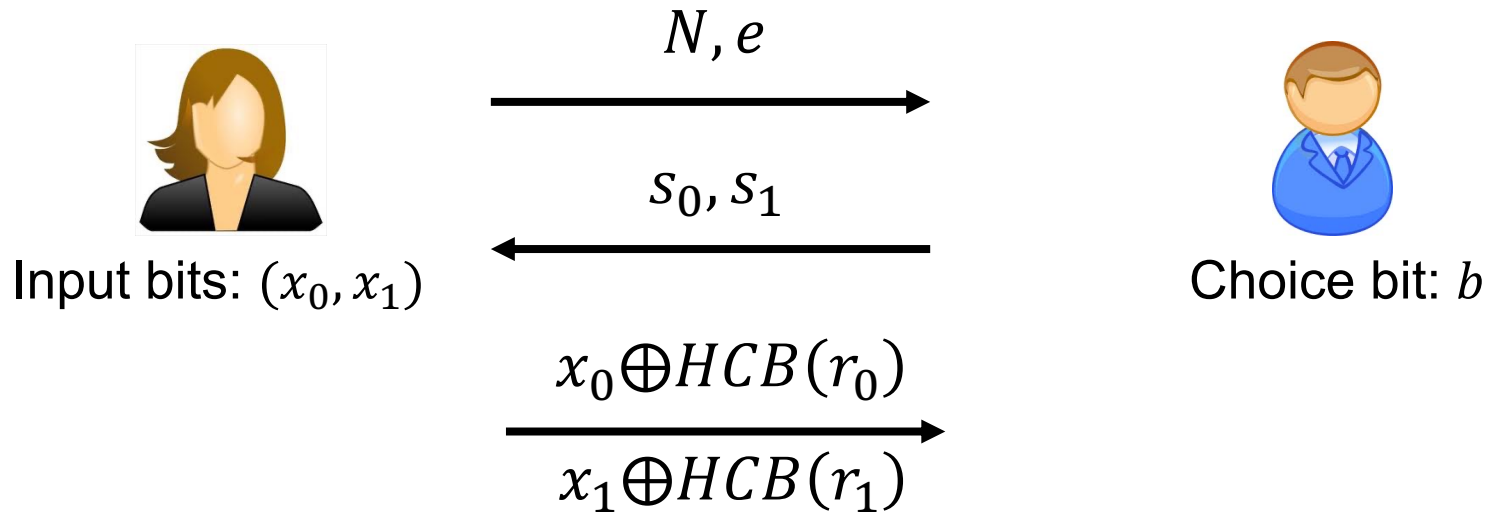
$x_0 \oplus HCB(r_0)$



$x_1 \oplus HCB(r_1)$

Bob can recover x_b
but not x_{1-b}

OT Protocol 1: Trapdoor Permutations

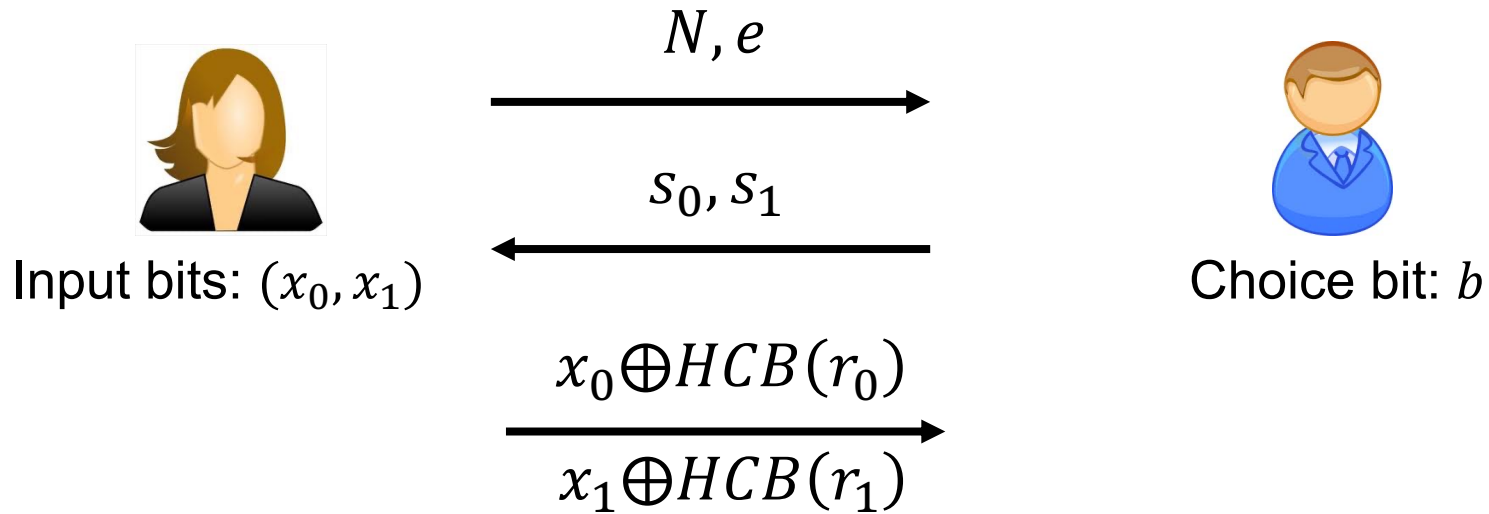


How about Bob's security

(a.k.a. Why does Alice not learn Bob's choice bit)?

Alice's view is s_0, s_1 one of which is chosen randomly from Z_N^* and the other by raising a random number to the e -th power. They look exactly the same!

OT Protocol 1: Trapdoor Permutations

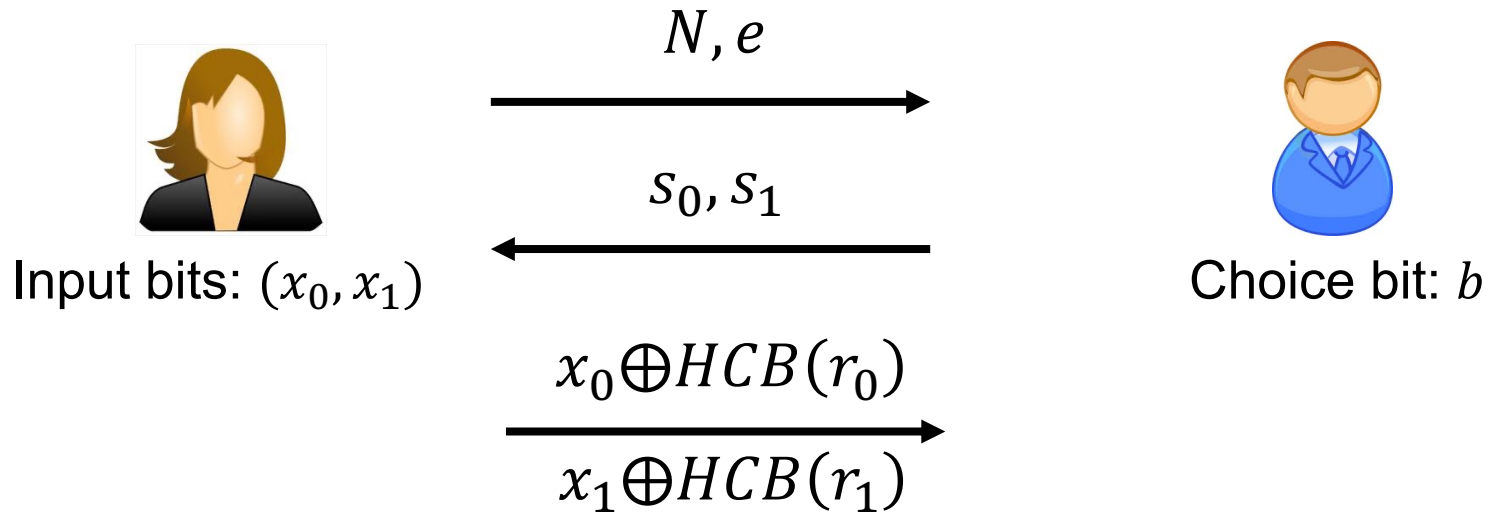


How about Bob's security

(a.k.a. Why does Alice not learn Bob's choice bit)?

Exercise: Show how to construct the simulator.

OT Protocol 1: Trapdoor Permutations

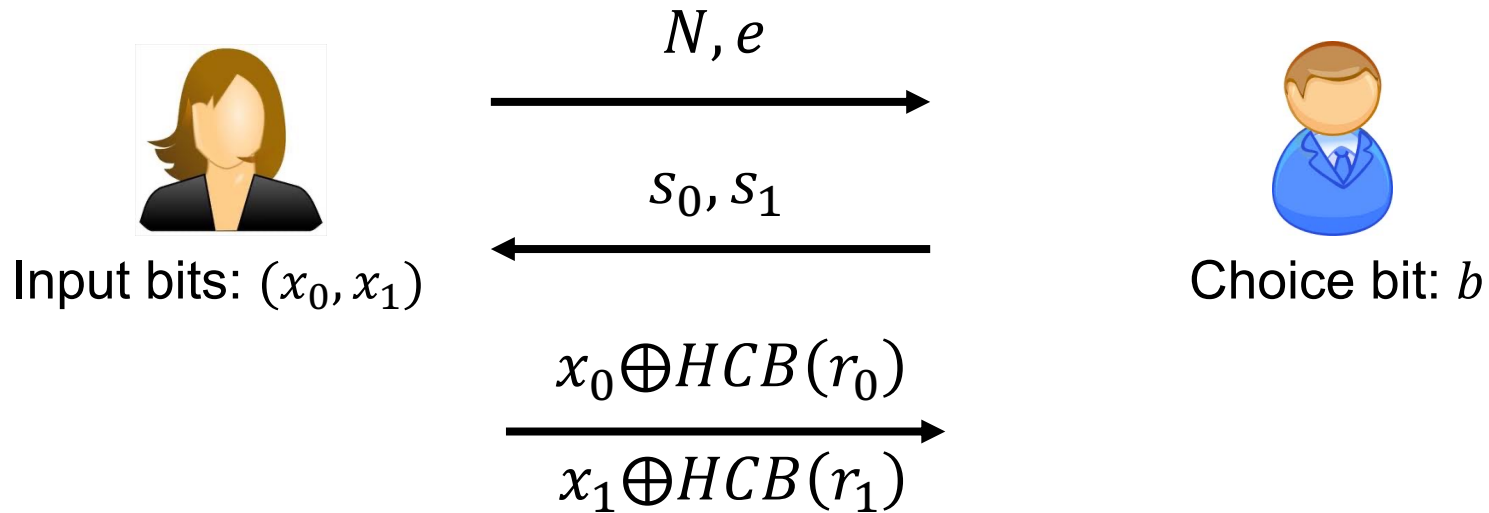


How about Alice's security

(a.k.a. Why does Bob not learn both of Alice's bits?)

Assuming Bob is semi-honest, he chose s_{1-b} uniformly at random, so the hardcore bit of $s_{1-b} = r_{1-b}^d$ is computationally hidden from him.

OT Protocol 1: Trapdoor Permutations



How about Alice's security

(a.k.a. Why does Bob not learn both of Alice's bits)?

Exercise: Show how to construct the simulator.

OT Protocol 2: from Oblivious PKE

A public-key encryption scheme (PKE) where there is an oblivious public-key generation algorithm that outputs a random public key “without knowing” the secret key.

$$pk \leftarrow \text{OblivGen}(1^n; r)$$

Security: IND-CPA holds even given the randomness used by OblivGen.

Example: for El Gamal encryption where the public key is a pair $(g, h = g^x)$ and the private key is x , OblivGen simply outputs two random elements from the group.

OT Protocol 2: from Oblivious PKE



Input bits: (x_0, x_1)



Choice bit: b

pk_0, pk_1



Generate random pk_b with sk_b by running Gen. and pk_{1-b} by running OblivGen

$c_0 \leftarrow Enc(pk_0, x_0)$



$c_1 \leftarrow Enc(pk_1, x_1)$

Decrypt c_b using sk_b

OT Protocol 3: Additive HE



Input bits: (x_0, x_1)



Choice bit: b

Encrypt choice bit b

$$c \leftarrow \text{Enc}(sk, b)$$

c



Homomorphically
evaluate the
selection function

$$SEL_{x_0, x_1}(b) = (x_1 \oplus x_0)b \oplus x_0$$

$$c' = \text{Eval}(SEL_{x_0, x_1}(b), c)$$



Decrypt to get x_b

Bob's security: computational, from CPA-security of Enc.

Alice's security: statistical, from function-privacy of Eval.

Many More Constructions of OT

Theorem: OT protocols can be constructed based on the hardness of the Diffie-Hellman problem, factoring, quadratic residuosity, LWE, elliptic curve isogeny problem etc. etc.

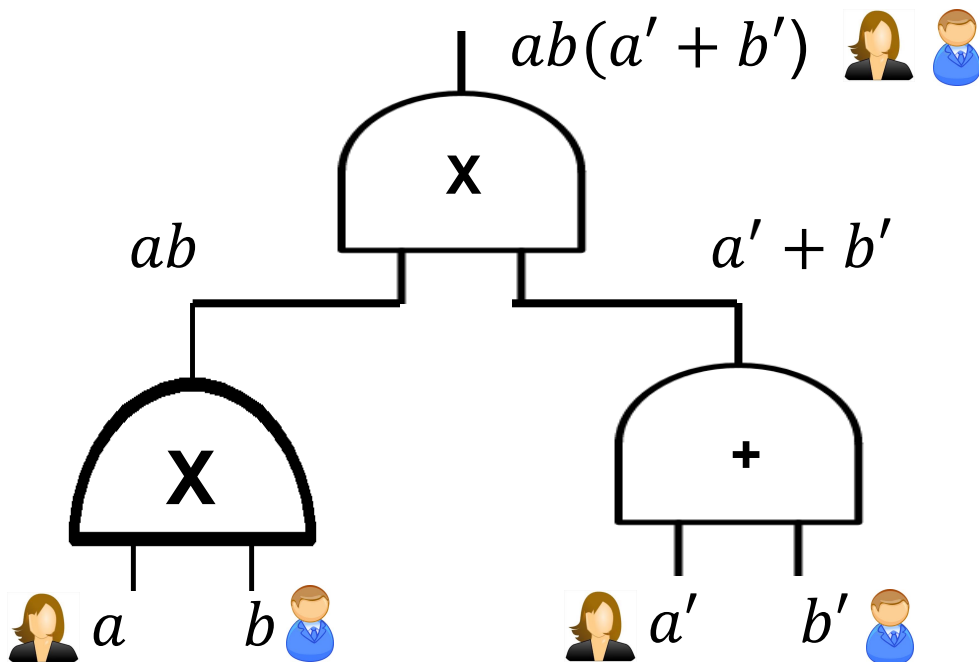
Secure 2PC from OT

Theorem [Goldreich-Micali-Wigderson'87]:
OT can solve *any* two-party computation problem.



How to Compute Arbitrary Functions

For us, programs = functions = Boolean circuits with XOR ($+ \text{ mod } 2$) and AND ($\times \text{ mod } 2$) gates.



Want: If you can compute XOR and AND *in the appropriate sense*, you can compute everything.

Recap: OT \Rightarrow Secret-Shared-AND

$a \in \{0,1\}$



Output: γ

Alice gets random γ , Bob gets random δ s.t. $\gamma \oplus \delta = ab$.

$b \in \{0,1\}$



Output: δ

Choice bit b

Run an OT protocol



$x_0 = \gamma$
$x_1 = a \oplus \gamma$

Alice outputs γ .

Bob gets $x_1 b + x_0(1 \oplus b) = (x_1 \oplus x_0)b + x_0 = ab \oplus \gamma := \delta$

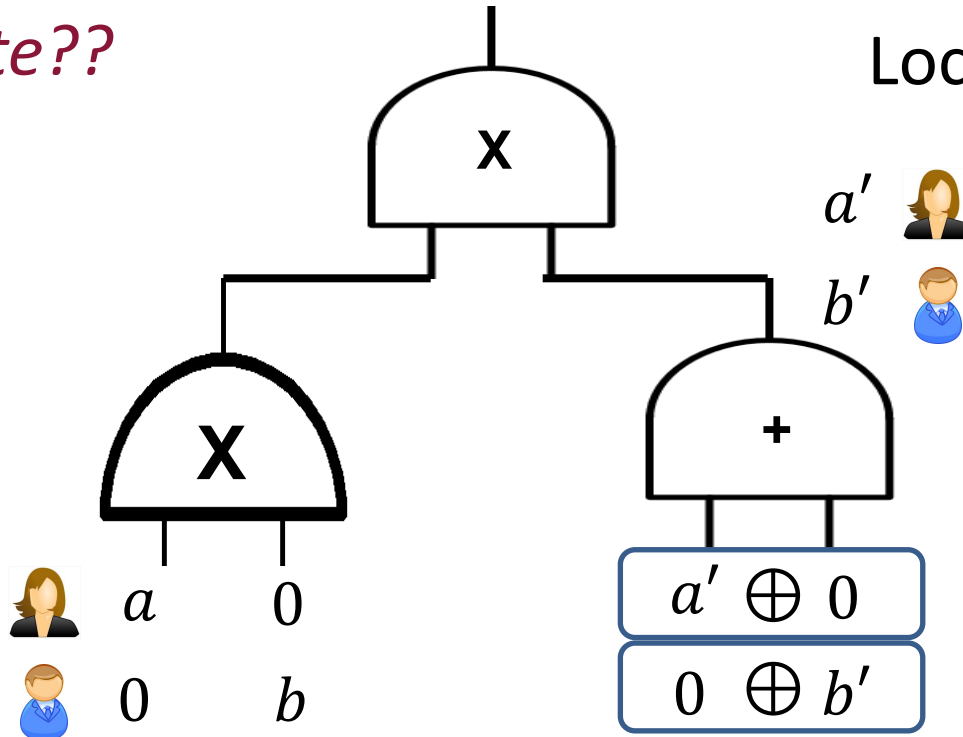
How to Compute Arbitrary Functions

Secret-sharing Invariant: For each wire of the circuit, Alice and Bob each have a bit whose XOR is the value at the wire.

AND gate??

XOR gate:

Locally XOR the shares



Base Case: Input wires

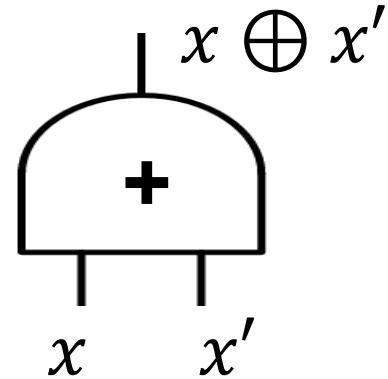
Recap: XOR gate

Alice has α and Bob has β s.t.

$$\alpha \oplus \beta = x$$

Alice has α' and Bob has β' s.t.

$$\alpha' \oplus \beta' = x'$$



Alice computes $\alpha \oplus \alpha'$ and Bob computes $\beta \oplus \beta'$.

So, we have:

$$\begin{aligned} & (\alpha \oplus \alpha') \oplus (\beta \oplus \beta') \\ &= (\alpha \oplus \beta) \oplus (\alpha' \oplus \beta') = x \oplus x' \end{aligned}$$

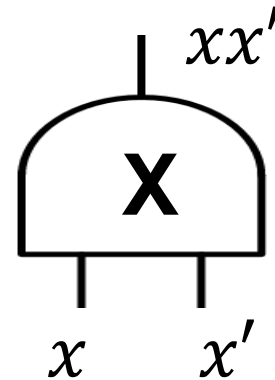
AND gate

Alice has α and Bob has β s.t.

$$\alpha \oplus \beta = x$$

Alice has α' and Bob has β' s.t.

$$\alpha' \oplus \beta' = x'$$



Desired output (to maintain invariant):

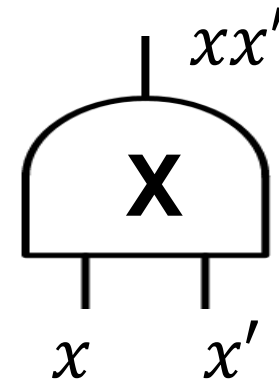
Alice wants α'' and Bob wants β'' s.t. $\alpha'' \oplus \beta'' = xx'$

AND gate

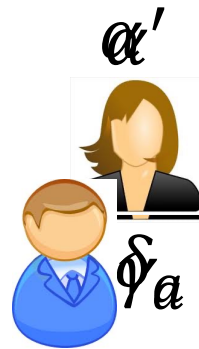
$$xx' = (\alpha \oplus \beta)(\alpha' \oplus \beta')$$

$$= \alpha\alpha' \oplus \gamma_a \oplus \delta_a \oplus \beta\beta'$$


 \oplus
 \oplus

 \oplus
 γ_b
 \oplus
 δ_b


$$\alpha'' = \alpha\alpha' \oplus \gamma_a \oplus \delta_a$$



SS=AND
 \longleftrightarrow

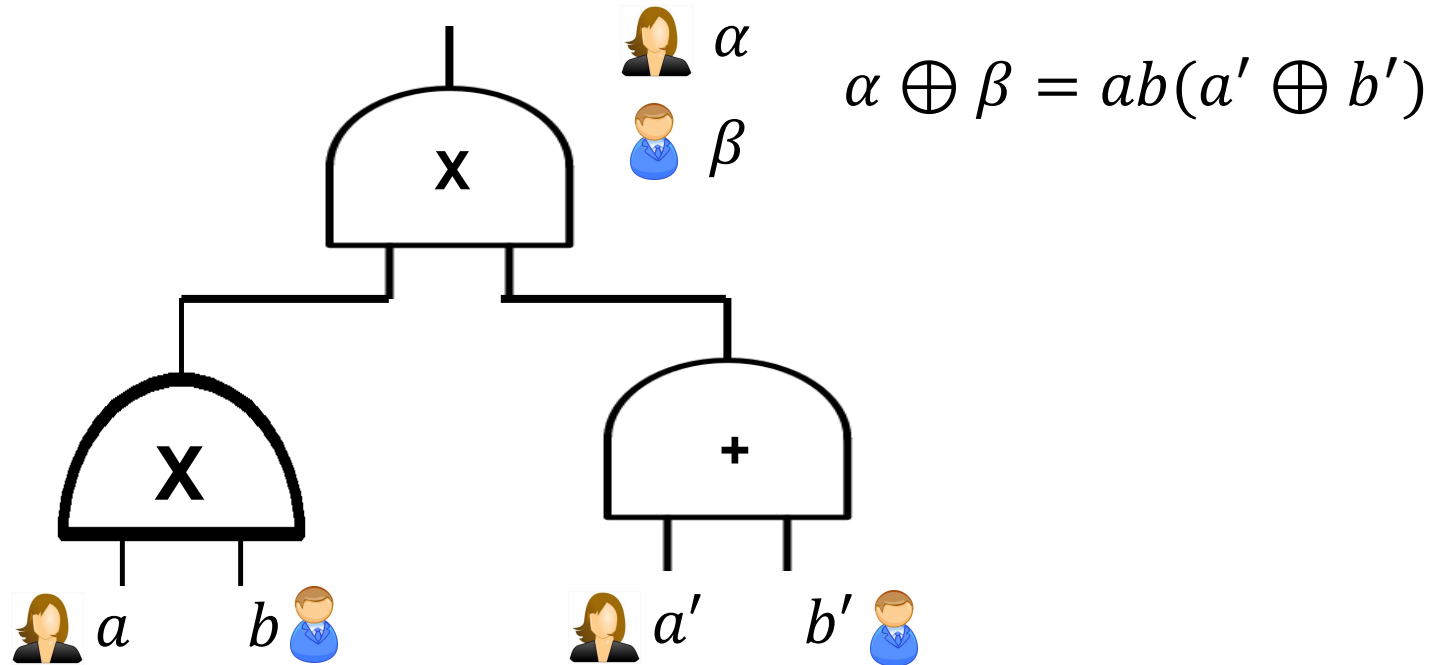


$$\beta'' = \beta\beta' \oplus \gamma_b \oplus \delta_b$$

How to Compute Arbitrary Functions

Secret-sharing Invariant: For each wire of the circuit, Alice and Bob each have a bit whose XOR is the value at the wire.

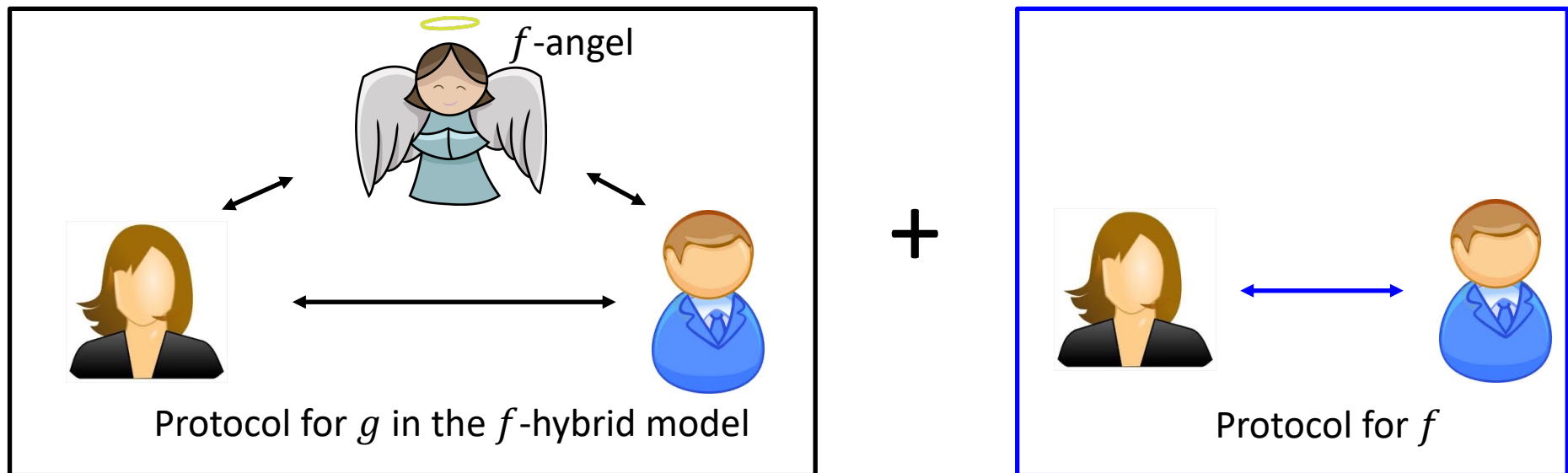
Finally, Alice and Bob exchange the shares at the output wire, and XOR the shares together to obtain the output.



Security by Composition

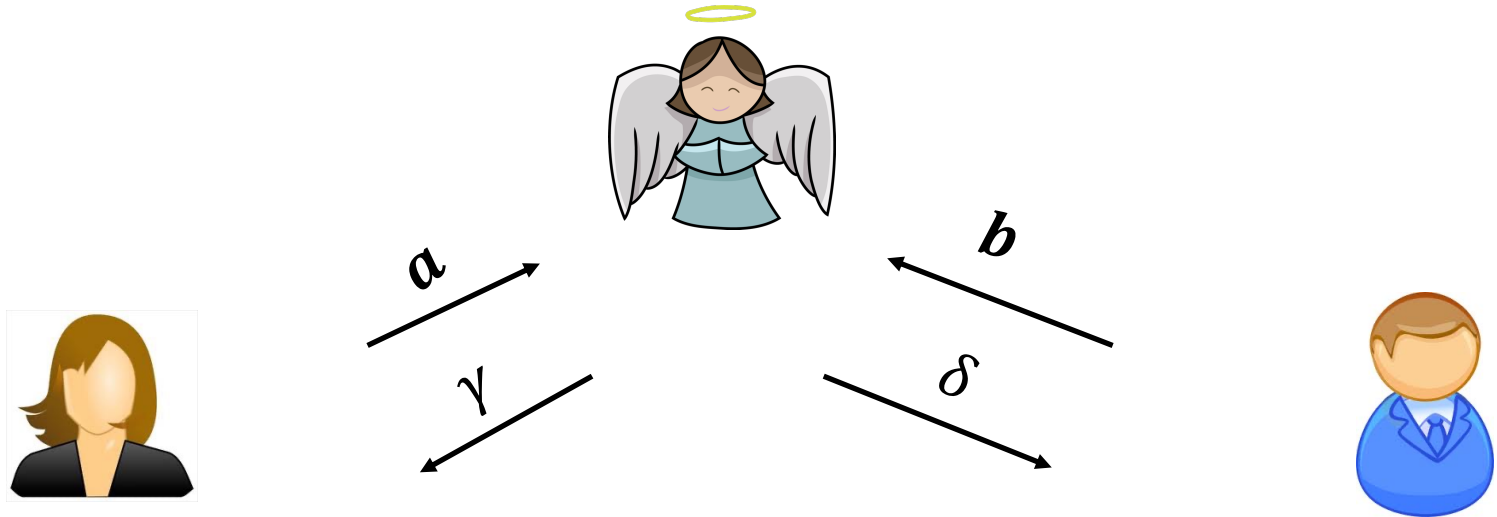
Theorem:

If protocol Π securely realizes a function g in the “ f -hybrid model” and protocol Π' securely realizes f , then $\Pi \circ \Pi'$ securely realizes g .



Security: Intuition (ss-AND hybrid model)

Imagine that the parties have access to an ss-AND angel.



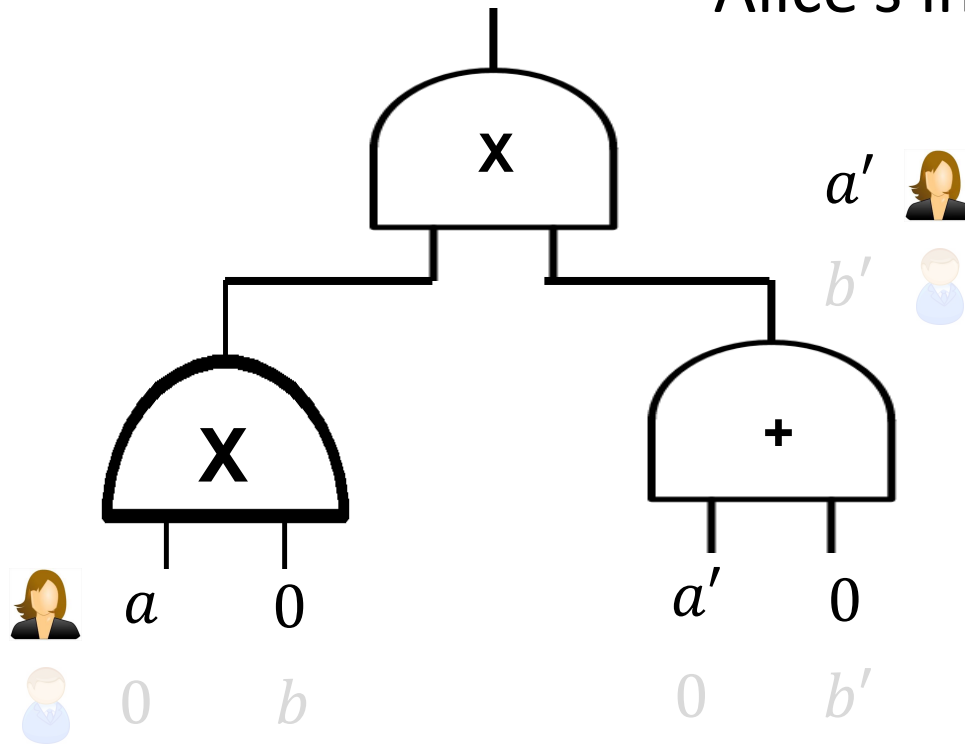
$$\gamma \oplus \delta = ab$$

Security: Intuition (ss-AND hybrid model)

Imagine that the parties have access to an ss-AND angel.

Simulator for Alice's view:

XOR gate: simulate given Alice's input shares



Input wires: can be simulated given Alice's input

Security: Intuition (ss-AND hybrid model)

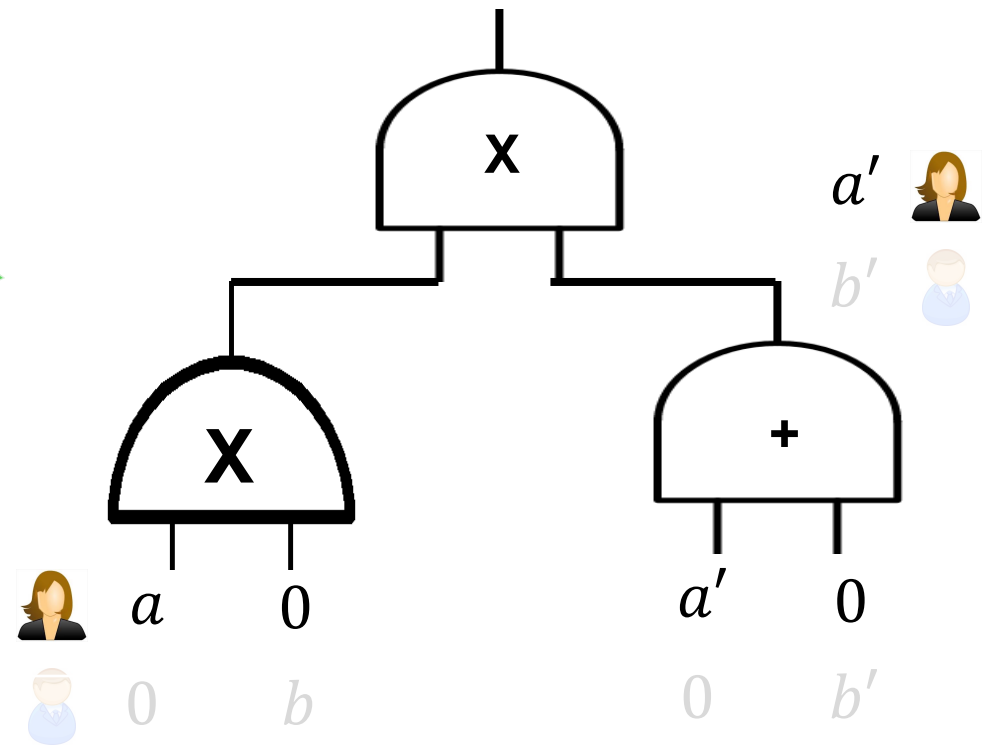
Simulator for Alice's view:

AND gate: simulate given Alice's input shares & outputs from the ss-AND angel.



Alice's share

$$\begin{aligned} &= a \cdot 0 \quad \checkmark \\ &+ \gamma_{alice} \quad \checkmark \\ &+ \delta_{alice} \quad \checkmark \end{aligned}$$



γ_{alice} and δ_{alice} are random, independent of b

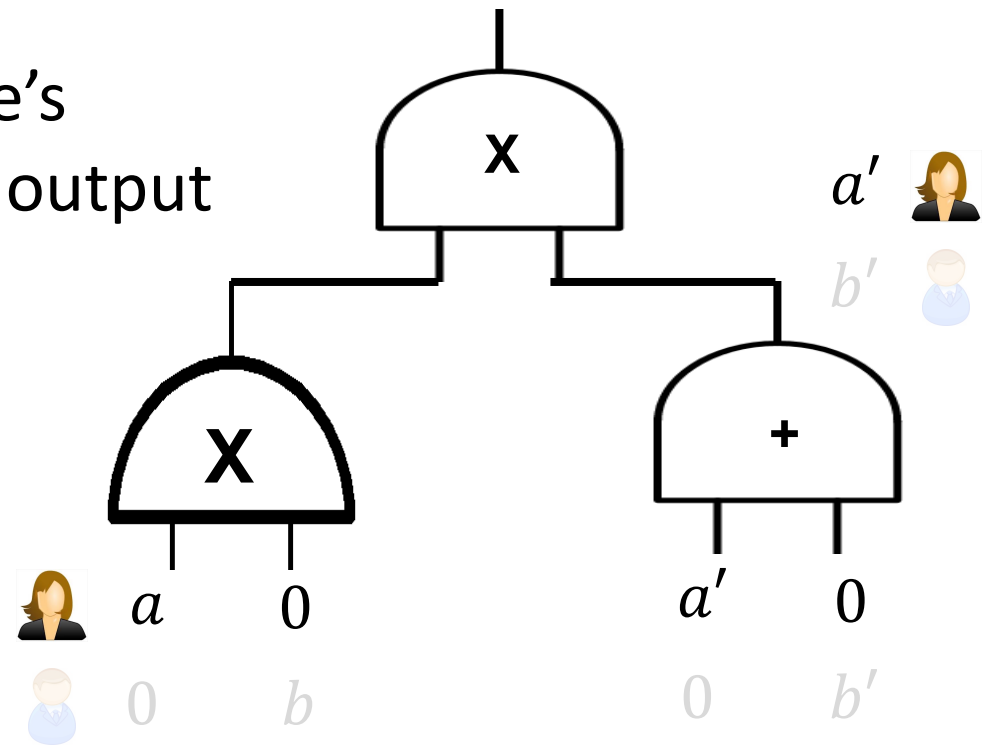
Security: Intuition (ss-AND hybrid model)

Simulator for Alice's view:

Output wire: need to know both Alice and Bob's output shares.

Bob's output share = Alice's output share \oplus function output

Simulator knows the function output, and can compute Bob's output share given Alice's output share.



Secret-Shared AND protocol

Using the RSA trapdoor permutation.

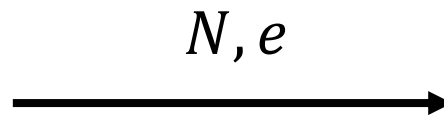


Input bit: a

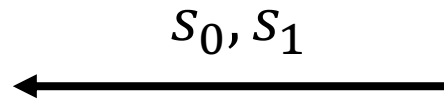


Input bit: b

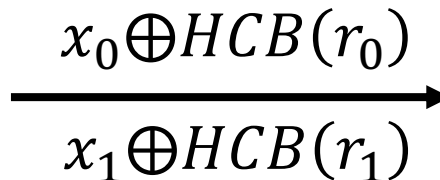
Pick $N = PQ$ and
RSA exponent e .



Let x_0 be random
and $x_1 = x_0 \oplus a$.



Compute r_0, r_1 and
one-time pad x_0, x_1
using hardcore bits



Choose random r_b and
set $s_b = r_b^e \pmod N$

Choose random s_{1-b}

Alice outputs x_0

Bob outputs x_b

Secret-Shared AND protocol

Using the RSA trapdoor permutation.



Input bit: a



Input bit: b

Exercise: Construct simulators for Alice and Bob.

In summary: Secure 2PC from OT

***Theorem* [Goldreich-Micali-Wigderson'87]:**
Assuming OT exists, there is a protocol that solves *any* two-party computation problem against semi-honest adversaries.

In fact, GMW does more:

Theorem [Goldreich-Micali-Wigderson'87]:
Assuming OT exists, there is a protocol that solves any *multi-party* computation problem against semi-honest adversaries.

MPC Outline

Secret-sharing Invariant: For each wire of the circuit, **the n parties have a bit each**, whose XOR is the value at the wire.

Base case: input wires.

XOR gate: given input shares $(\alpha_1, \dots, \alpha_n)$ s.t. $\bigoplus_{i=1}^n \alpha_i = a$ and $(\beta_1, \dots, \beta_n)$ s.t. $\bigoplus_{i=1}^n \beta_i = b$, compute the shares of the output of the XOR gate:

$$(\alpha_1 + \beta_1, \dots, \alpha_n + \beta_n)$$

AND gate: given input shares as above, compute the shares of the output of the XOR gate:

$$(o_1, \dots, o_n) \text{ s.t. } \bigoplus_{i=1}^n o_i = ab$$

Exercise!