

CS783: Theoretical Foundations of Cryptography

Lecture 17 (08/Oct/24)

Instructor: Chethan Kamath

Recall from Last Three Lectures

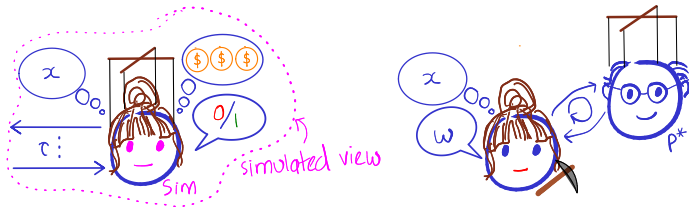
- Interactive proof
- Zero knowledge (ZK) proof
- ZK proof of knowledge

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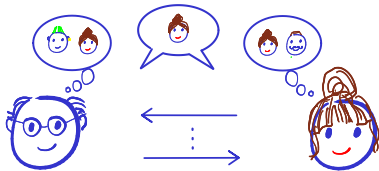
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- Simulators and extractors
 - Key tools: out-of-order sampling and rewinding

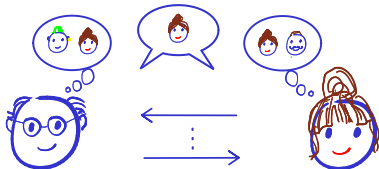
Plan for Today's Lecture...

- Main topic of Module III: private computation of functions



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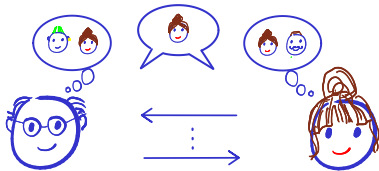
- Main topic of Module III: private computation of functions



- Define syntax and security for the *two-party* case (2PC)
 - Extends the simulation paradigm

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- Main topic of Module III: private computation of functions

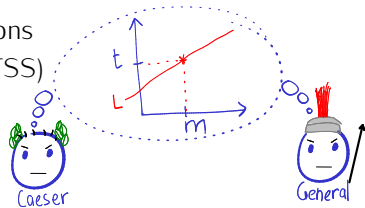


- Define syntax and security for the *two-party* case (2PC)

- Extends the simulation paradigm

- Perfectly-private 2PC for *linear* functions

- Key tool: threshold secret sharing (TSS)
- Shamir's TSS



Plan for Today's Lecture...





General *template*:

- 1 Identify the task
- 2 Come up with precise **threat model** M (a.k.a security model)
 - **Adversary/Attack**: What are the **adversary**'s capabilities?
 - **Security Goal**: What does it mean to be **secure**?
- 3 Construct a scheme Π
- 4 Formally prove that Π is **secure** in **model** M

↗ private computation of functions

Plan for Today's Lecture...

General *template*:

- 1 Identify the task  private computation of functions
- 2 Come up with precise threat model M (a.k.a security model)  semi-honest model
 - Adversary/Attack: What are the adversary's capabilities?  "static corruption"
 - Security Goal: What does it mean to be secure?  "perfect privacy"
- 3 Construct a scheme Π
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Plan for Today's Lecture...

General *template*:

- 1 Identify the task
 - 2 Come up with precise **threat model** M (a.k.a security model)
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- Handwritten notes and arrows:
- From "Identify the task" to "private computation of functions" (with "linear" written above it).
 - From "threat model M " to "semi-honest model".
 - From "Adversary/Attack" to "static corruption".
 - From "Security Goal" to "perfect privacy".
 - From "Construct a scheme Π " to "secret-sharing-based".
 - From "Formally prove that Π is secure in model M " to "construct simulator".

Private computation of functions is useful!

Apple's PSI

The Apple PSI System

Abhishek Bhowmick
Apple Inc.

Dan Boneh
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Steve Myers
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July 29, 2021



Mozilla's private aggregation

Mozilla Security Blog

Next steps in privacy-preserving Telemetry with Prio

Steven Englehardt | June 6, 2019

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Microsoft's EzPZ

EzPC system



Usability

Automatic compilation

- From TensorFlow/ONNX code to MPC protocols
- No cryptography expertise required



Security

Mathematical guarantees

- Only random bits exchanged
- Sensitive data provably secured



Performance

Real-world benchmarks

- Million-parameter networks
- Executable in minutes

MP-SPDZ



data61 / **MP-SPDZ** Public

forked from [bristolcrypto/SPDZ-2](https://github.com/bristolcrypto/SPDZ-2)

Plan for Today's Lecture

- 1 Private Computation of Functions
- 2 New Tool: (Threshold) Secret Sharing
- 3 Computing Any Linear Function with Perfect Privacy

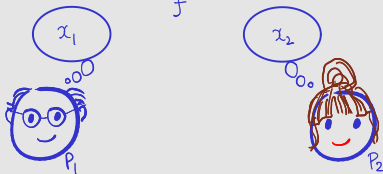
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Syntax of Two-Party Computation (2PC)

Definition 1 (2PC protocol Π for $f : \mathcal{D}^2 \rightarrow \mathcal{R}$)

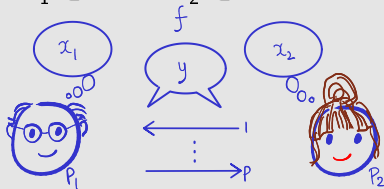
A ρ -round protocol $\Pi = (P_1, P_2)$ between two parties P_1 and P_2 with private input $x_1 \in \mathcal{D}$ and $x_2 \in \mathcal{D}$ and common output $y \in \mathcal{R}$



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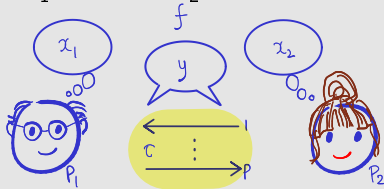
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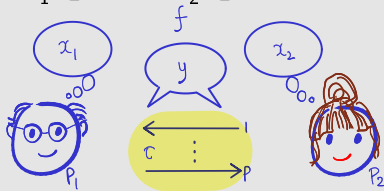
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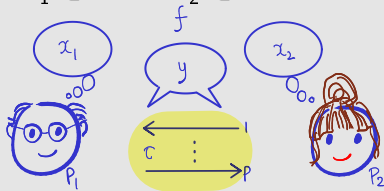


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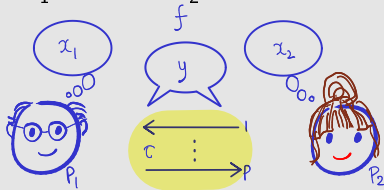
- Parties can have common input
- Each party's output can be different
- Two parties $\rightarrow n$ parties (MPC)

$P_2(x_2)$
 $(x_i) P_1$ (x) $P_i(x_i)$
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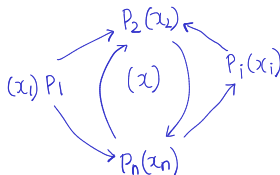
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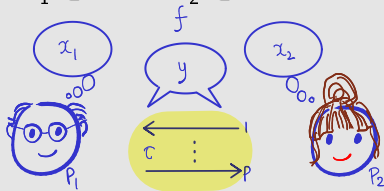
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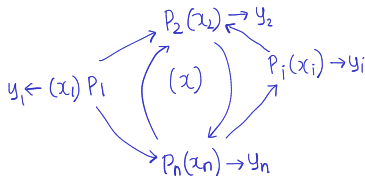
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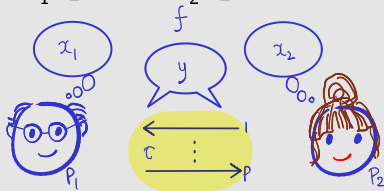
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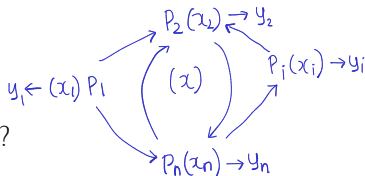


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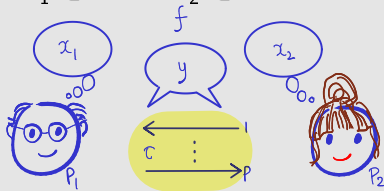
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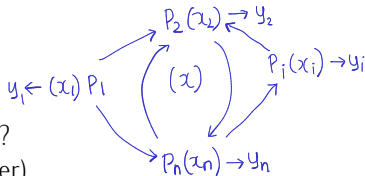
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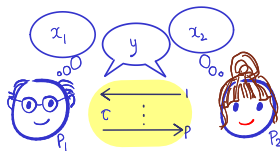
❓ How to frame ZKP as a 2PC protocol?

- $P_1 := P$ (prover) and $P_2 := V$ (verifier)
- $f := \mathcal{R}$, the NP relation \Rightarrow common input $= x$, $x_1 = w$, $x_2 = \perp$



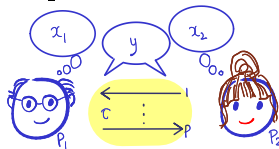
Let's Define Security...

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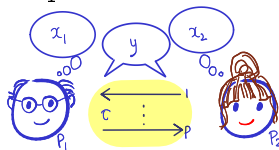
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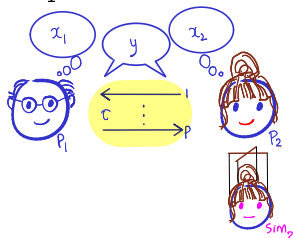
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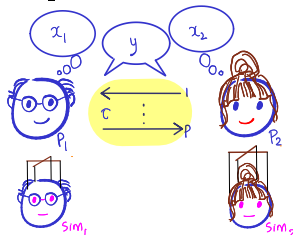
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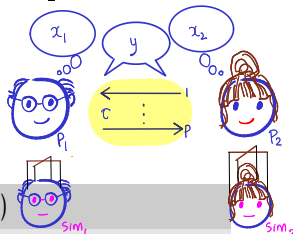
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Definition 2 (Semi-honest perfect security for 2PC)

Π computes f with perfect privacy if there exists 1) a PPT simulator Sim_2 such that for all distinguishers D and for all $x_1, x_2 \in \mathcal{D}$, the following is zero

$$\Pr[D(\text{View}_{P_2}(\langle P_1(x_1), P_2(x_2) \rangle) = 1] - \Pr[D(\text{Sim}_2)(x_2, y)) = 1]$$

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 - Semi-honest \rightarrow malicious
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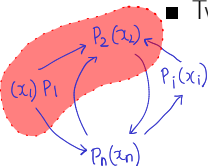
■ Semi-honest \rightarrow malicious

■ Honest $P_2/P_1 \rightarrow$ any malicious P_2^*/P_1^* (just as in ZK)

■ Two parties $\rightarrow n$ parties (MPC): t -privacy (for $t \leq n$)

■ Any fixed $(t - 1)$ -sized subset of parties $\mathcal{P}^* \subset [n]$ can be corrupt

■ There exists $\text{Sim}_{\mathcal{P}^*}$ that simulates views of all parties in \mathcal{P}^* given their inputs $\{x_i\}_{i \in \mathcal{P}^*}$ and the output y

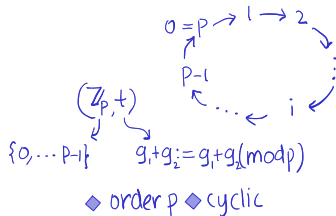


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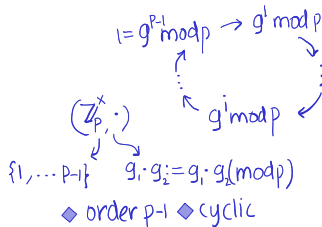
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Finite Fields

Addition modulo prime p



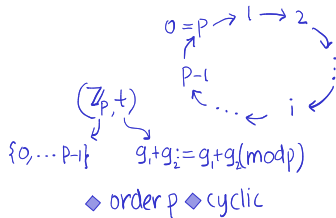
Multiplication modulo prime p



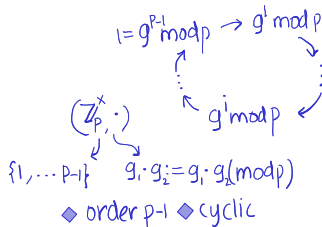
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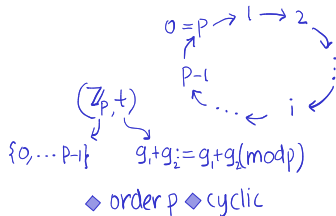
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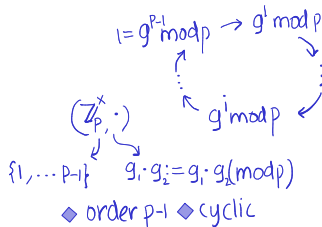
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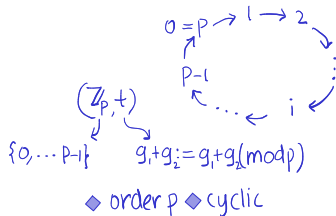
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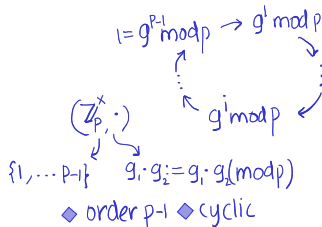
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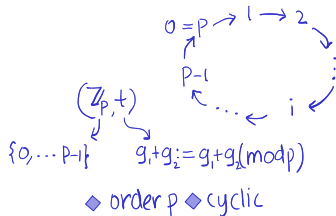
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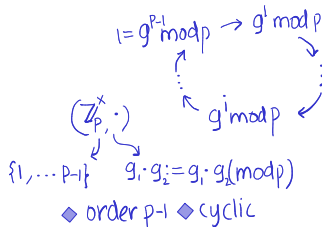
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- Finite counterpart of real numbers \mathbb{R}
 - $(\mathbb{R}, +)$ and $(\mathbb{R} \setminus \{0\}, \cdot)$ are groups
 - $+$ and \cdot are distributive

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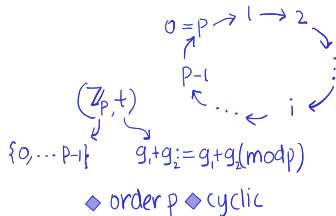
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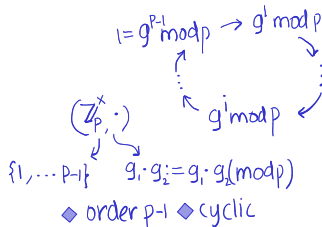
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- $\mathbb{F}_2 = (\mathbb{Z}_2, +, \cdot)$ corresponds to ?

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- $\mathbb{F}_2 = (\mathbb{Z}_2, +, \cdot)$ corresponds to Boolean algebra $(\{F, T\}, \oplus, \wedge)$

(t, n) -Threshold Secret Sharing (TSS)



Dealer



P_1



P_2

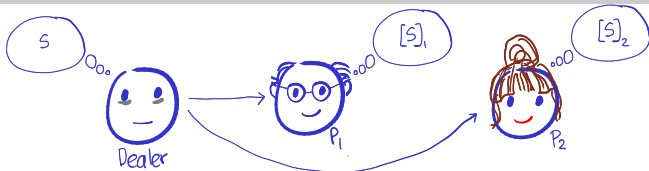
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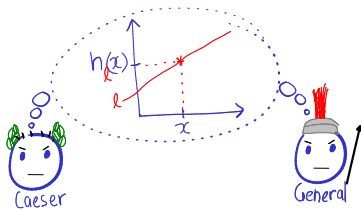
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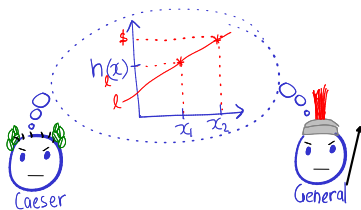
What happens when you extend 3 to construct (t, n) -TSS for arbitrary n and $t \leq n$?

Shamir's (t, n) -TSS...



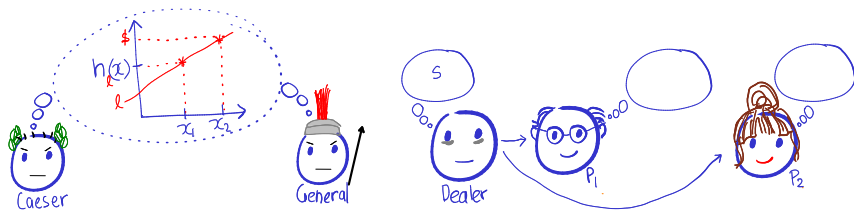
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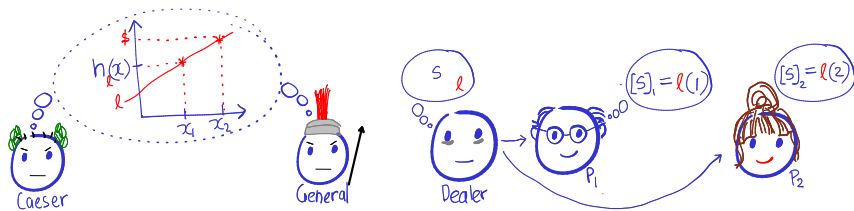
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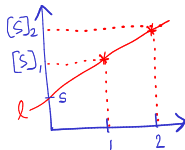


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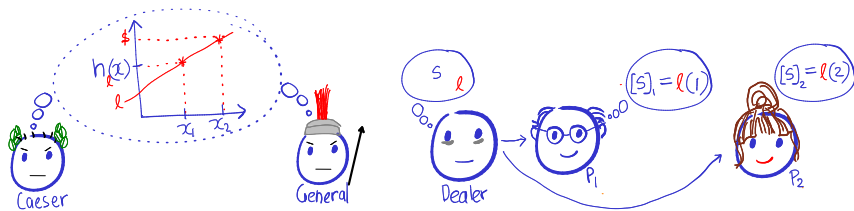
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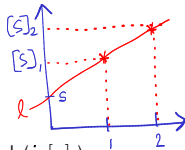


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 - 1 Reconstruct ℓ by drawing line through $(i, [s]_i)$ and $(j, [s]_j)$
 - 2 Output $\ell(0)$



Shamir's (t, n) -TSS...

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-
- All of the above ideas extend to arbitrary n and $t \leq n$

Exercise 2 (Hint: use a degree- t polynomial instead of line)

Formally describe and prove Shamir's (t, n) -TSS

Plan for Today's Lecture

- 1 Private Computation of Functions
- 2 New Tool: (Threshold) Secret Sharing
- 3 Computing Any Linear Function with Perfect Privacy

How to Privately Compute Linear Functions?...

Definition 3

A function $f : \mathbb{F}_p^n \rightarrow \mathbb{F}_p$ is linear if $\forall \bar{a}, \bar{b} \in \mathbb{F}_p^n : f(\bar{a} + \bar{b}) = f(\bar{a}) + f(\bar{b})$
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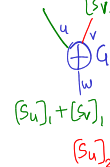
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- Warm-up: let's privately compute \oplus over \mathbb{F}_2

How to Privately Compute Linear Functions?...

Protocol 1 (Protocol Π for linear $f : \mathbb{F}_p^n \rightarrow \mathbb{F}_p$)

1 *Secret-share input:*

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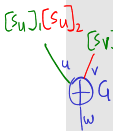
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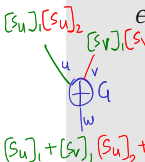
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3 Reconstruct output: each party P_i

- 1 Broadcasts its share of output wire to parties $P_j, j \neq i$
- 2 Reconstructs q_i from all shares of output wire
- 3 Outputs $q_i(0)$

Π Computes f with Perfect Secrecy

Theorem 1

Assuming (t, n) -linear TSS, Π computes f with t -privacy

Proof (Sketch).

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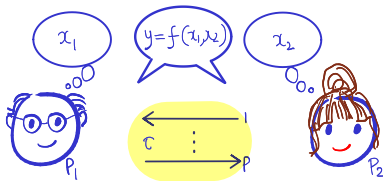
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 - Program output:
 - Set polynomial q_o of output gate consistently with its input wires and with $q_o(0) = y$

□

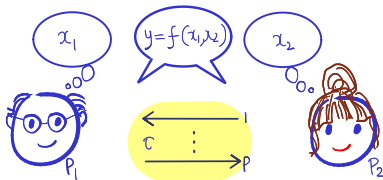
To Recap Today's Lecture

■ Task 6: Private computation of functions



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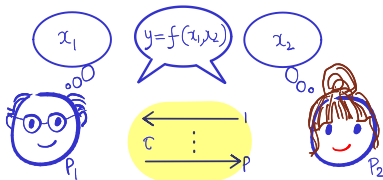
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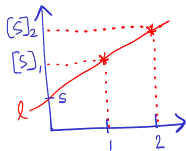
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To Recap Today's Lecture

■ Task 6: Private computation of functions



- Defined syntax and security for the *two-party* case (2PC)
 - Extends the simulation paradigm
- Perfectly-private MPC for *linear* functions
 - Key tool: threshold secret sharing (TSS)
 - Shamir's TSS
 - Key idea: "compute over shares"



Next Lecture

- Continue with Task 6
 - ⚠ Perfectly-private 2PC for *general* functions is impossible!
 - Counter-example: \wedge

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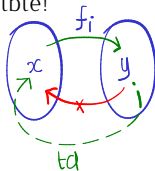
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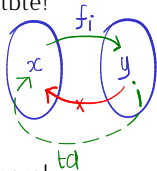
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- GMW protocol: computationally-private MPC for general functions



References

- 1 MPC was first studied in [GMW87], building on [GMR89]
- 2 Shamir's TSS is from [Sha79]
- 3 The perfectly-secure MPC protocol for linear functions described here is taken from [AL17, §4.2]



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