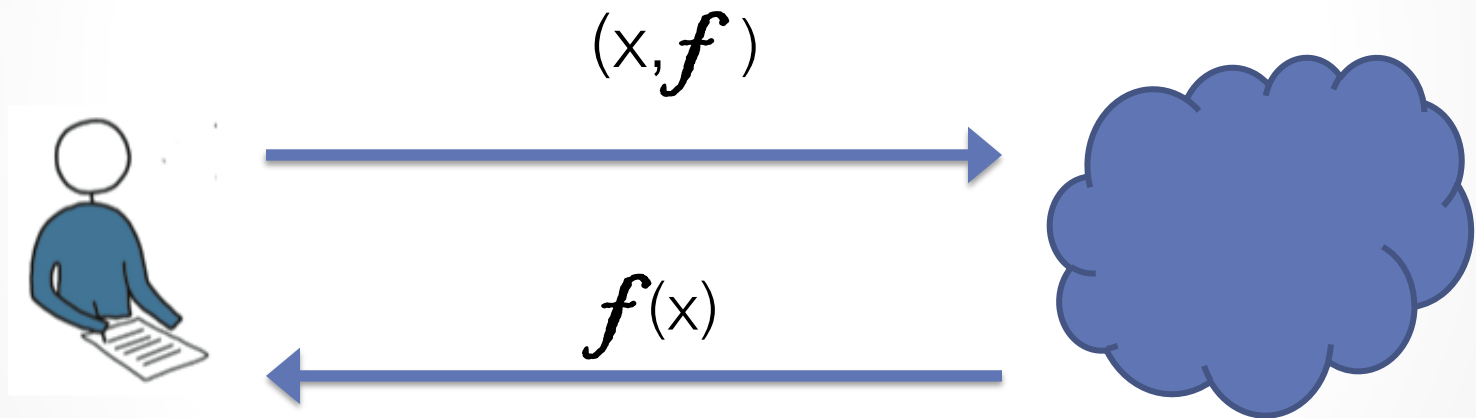


# Secure Outsourced Computation in a Multi-Tenant Cloud

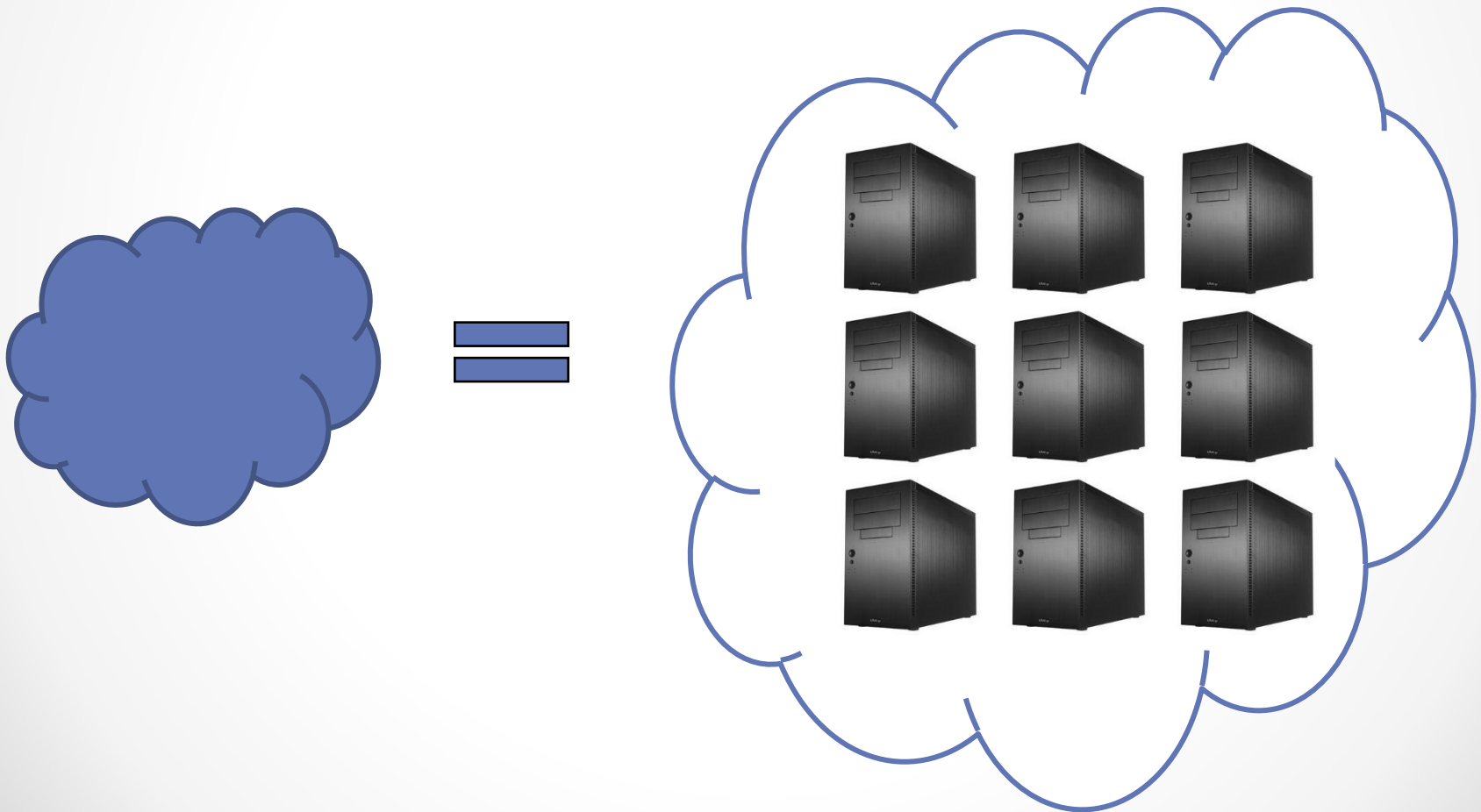
*Seny Kamara* - Microsoft Research

Mariana Raykova - Columbia

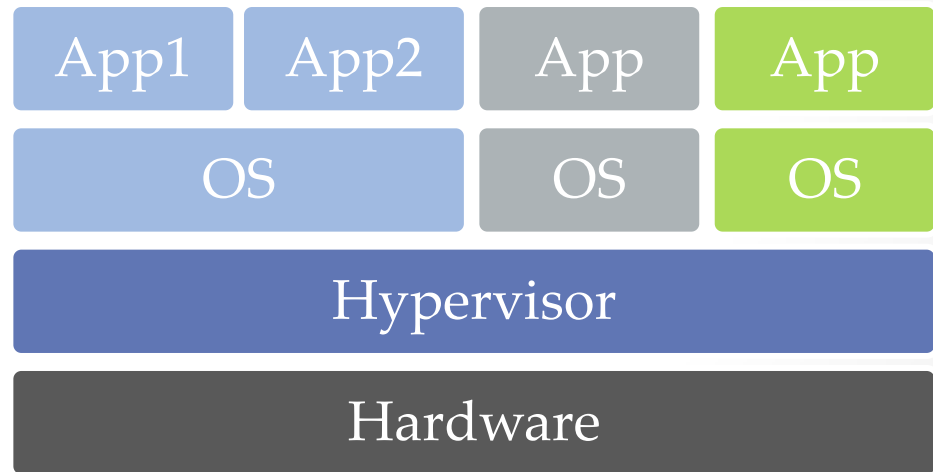
# Outsourced Computation



# The Cloud

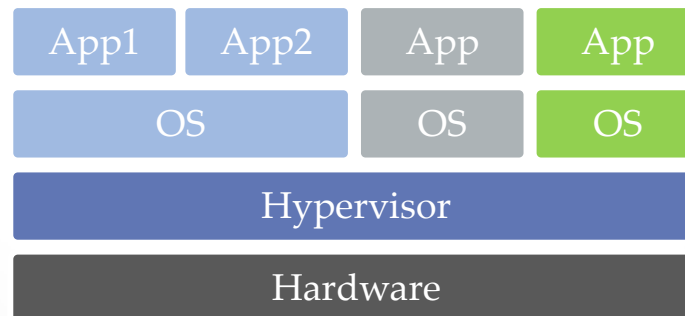


# Virtualized Servers



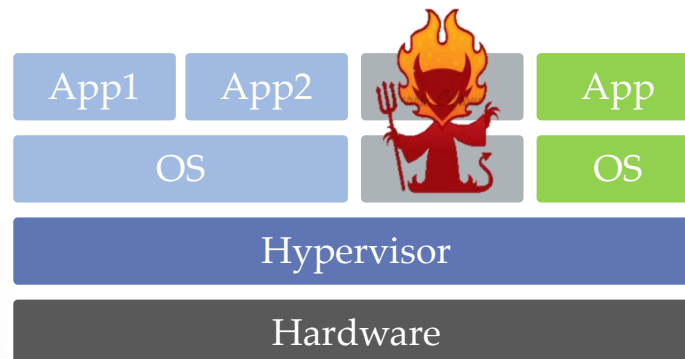
# Multi-Tenancy

- Virtualization enables multi-tenancy
  - VMs from different clients run on the same server
- Multi-tenancy allows cloud operator to
  - Optimize resources usage
- This all leads to \$ saved for clients



# Multi-Tenancy

- Multi-tenancy is indispensable to cloud computing...
  - This is where part of the economic incentives come from
- ...but it introduces security concerns
  - What if a co-located VM attacks my VM?
- Current solution is VM isolation
  - VMs cannot see each other's memory or state
  - Resources are appropriately shared

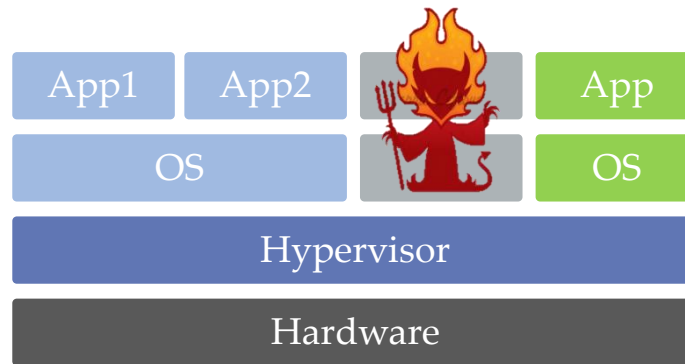


# Breaking Isolation

- Exploiting the hypervisor
  - Some attacks known against VMware's ESX, XBOX's hypervisor, ...
- Bypassing the hypervisor
  - [Ristenpart et al. 09] show that cross VM side-channels are possible
- Conclusion from [Ristenpart et al. 09]:

If security is a concern, use a single-tenant server.

# How do we Protect vs. Multi-Tenancy?



## VM Isolation

- ☹ vulnerabilities
- ☹ side-channels

## Cryptography

- ☺ strong security

## Single-Tenancy

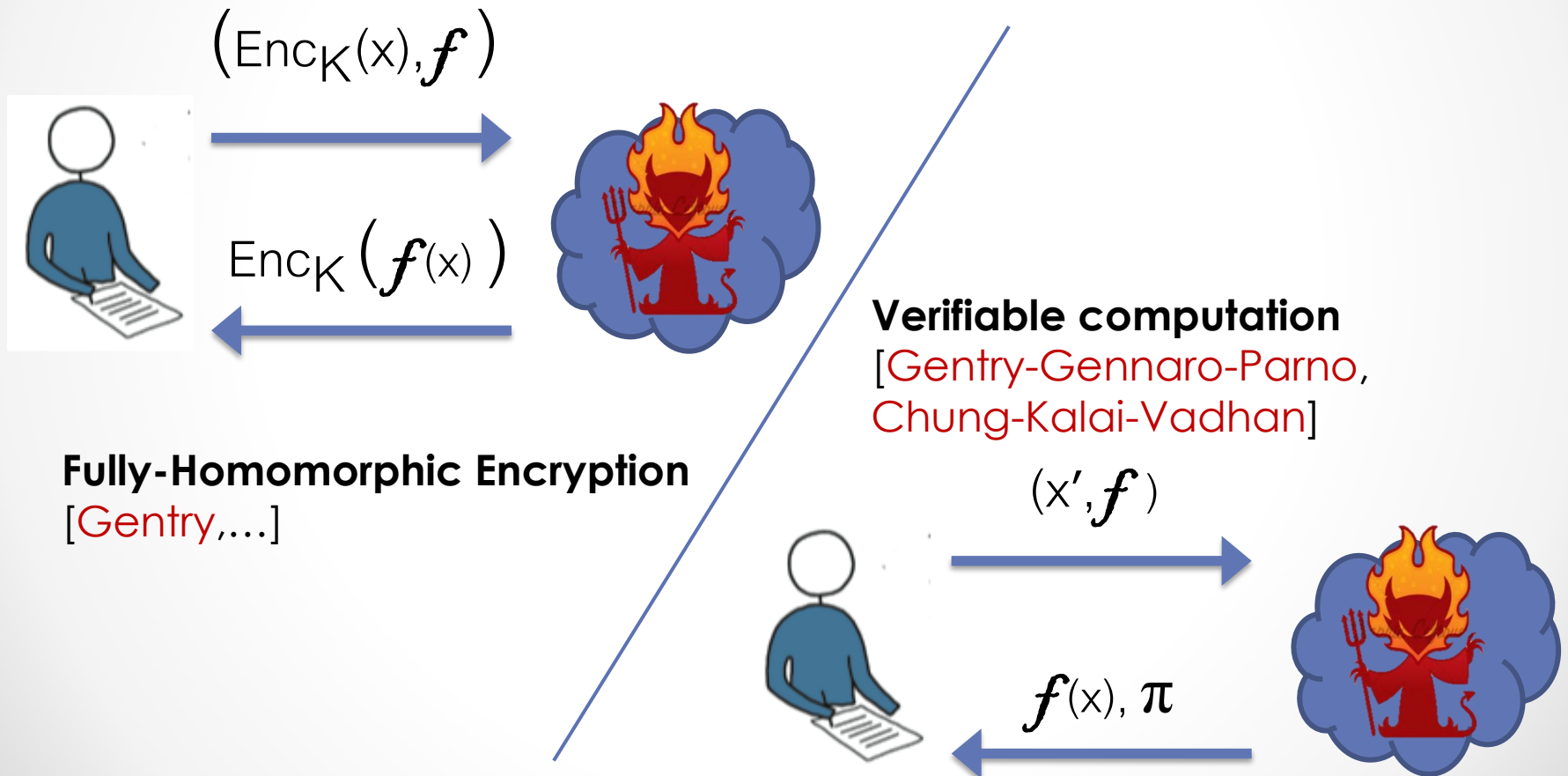
- ☺ Perfectly secure



# Outline

- Motivation
  - Secure outsourced computation in a multi-tenant cloud
- Delegation protocols
  - Security definition in ideal/real world paradigm
- General-purpose delegation protocol
  - Secret sharing & MPC
- Limitations of our approach

# A Possible Approach

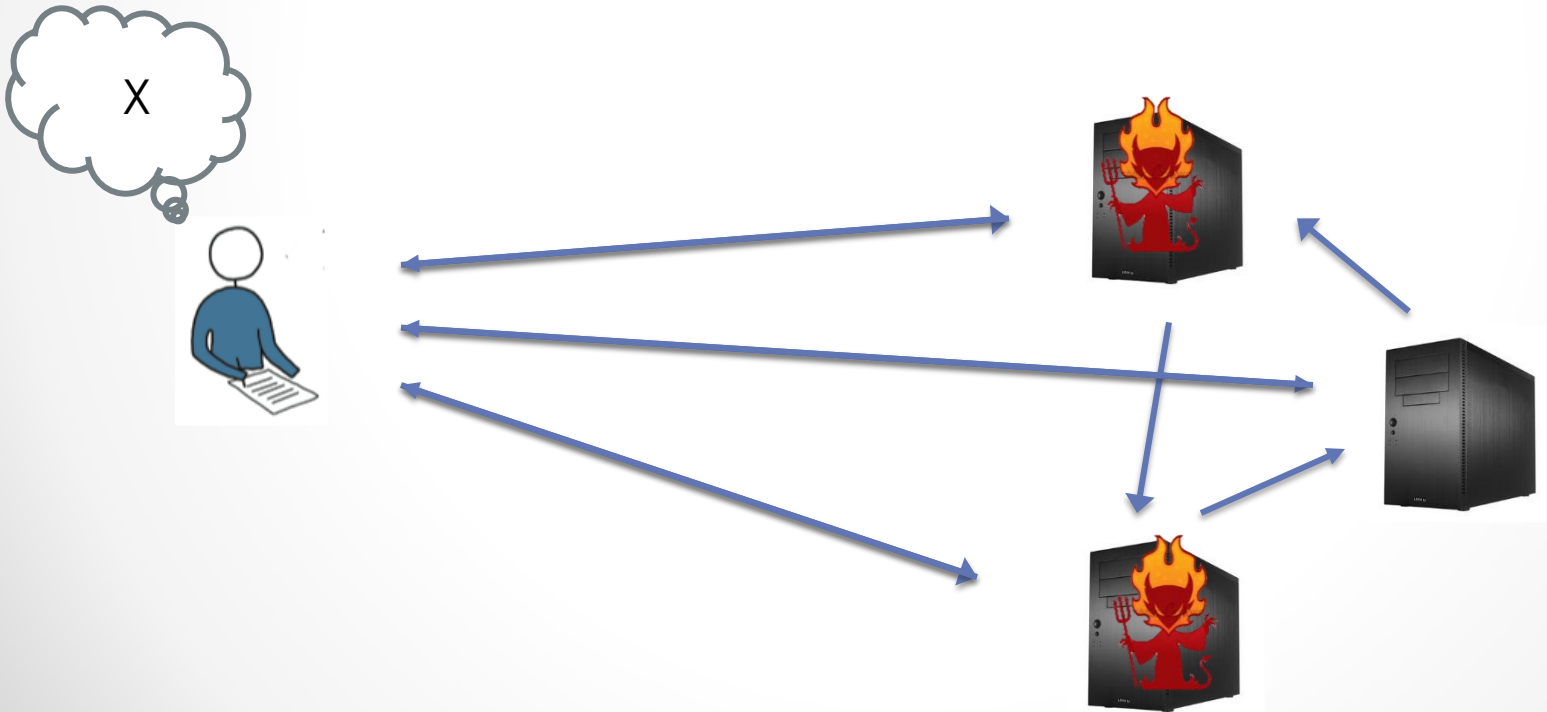


# FHE + VC

- Efficiency
  - FHE is not practical
  - VC is based on FHE
- Overkill
  - Interaction is OK
  - *Cloud is not a single-server environment*

# Delegation Protocol

- Protocol between
  - **C**: the client who provides an input
  - **VM<sub>1</sub>, ..., VM<sub>w</sub>**: VM workers who have no input but return an output



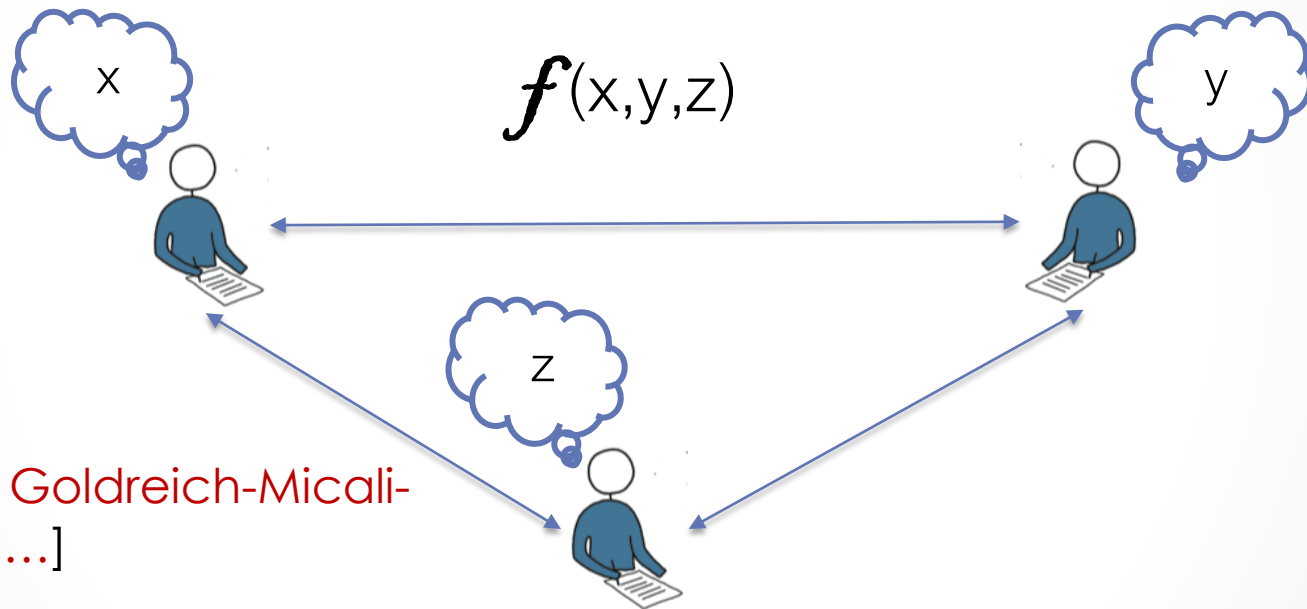
# Underlying Assumption

- Cross VM attacks always work
  - **Semi-honest**: if  $\mathcal{A}$  co-locates a VM then it recovers client VM's state
  - **Malicious**: if  $\mathcal{A}$  co-locates a VM then it controls client VM
- Worst-case assumption
  - Makes our results stronger
  - Captures concerns of highly sensitive clients (e.g., governments)
- Not essential to our model
  - probability of successful cross VM attack can be taken into account

# Security Definition

- Ideal/real world paradigm from MPC [...,[Canetti01](#)]
  - **Real execution:**  $\mathcal{C}$  and VMs run the real protocol in presence of  $\mathcal{A}$  that can co-locate adversarial VMs
  - **Ideal execution:**  $\mathcal{C}$  sends input to trusted party who returns  $f(\mathbf{x})$  in presence of  $\mathcal{A}$  that can co-locate adversarial VMs
  - **Security:** “every  $\mathcal{A}$  in the real world can be emulated by an  $\mathcal{A}'$  in the ideal world”
    - Note: If  $\mathcal{A}$  is malicious then it is allowed to abort during the executions
- Guarantees:
  - As long as  $\mathcal{A}$  co-locates at most  $(w - 1)$  adversarial VMs
  - **Privacy:**  $\mathcal{A}$  learns no information about  $\mathcal{C}$ 's input or output
  - **Correctness:**  $\mathcal{C}$  receives correct output

# Multi-Party Computation

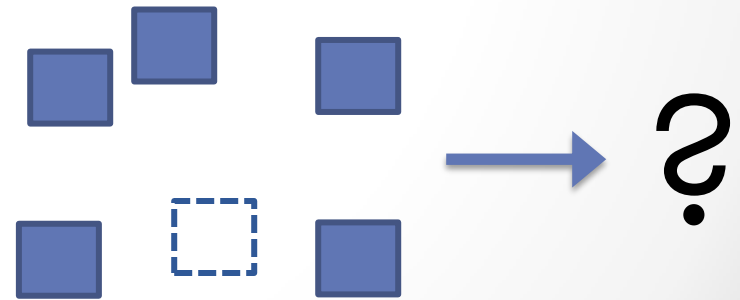
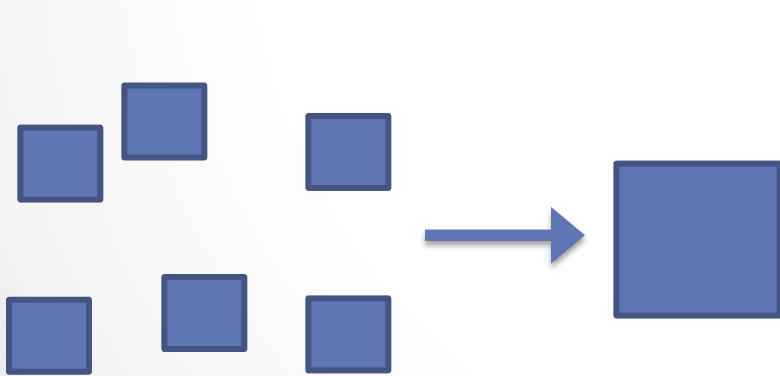
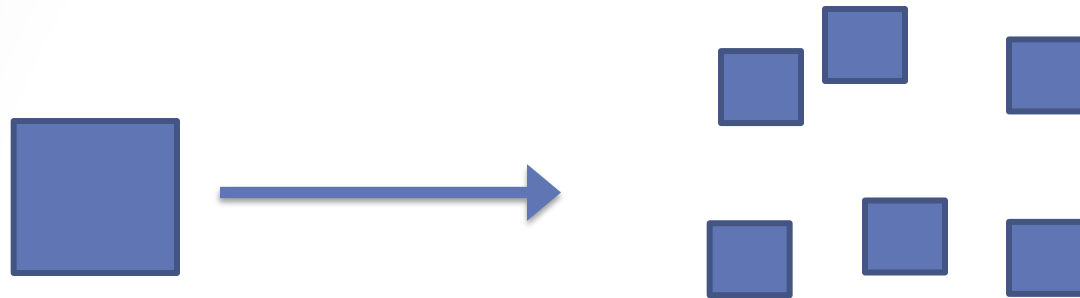


80's: [Yao, Goldreich-Micali-Wigderson,...]

Today: [Mohassel-Franklin, Lindell-Pinkas, Kolesnikov-Sadeghi-Schnedier,...]

[Shamir]

# Secret Sharing





# A General-Purpose Protocol

- The approach
  - Split input  $\mathbf{x}$  into  $w$  shares  $(\mathbf{s}_1, \dots, \mathbf{s}_n)$
  - Store each share in a *separate* VM
  - Make the VMs evaluate  $\mathbf{F}$  using MPC
  - $\mathbf{F}(\mathbf{s}_1, \dots, \mathbf{s}_n; \mathbf{r}_1 \oplus \dots \oplus \mathbf{r}_n)$ :
    - recovers the input  $\mathbf{x}$  from the shares
    - Evaluates  $\mathbf{y} = \mathbf{f}(\mathbf{x})$
    - Use  $\mathbf{r}_1 \oplus \dots \oplus \mathbf{r}_n$  to generate  $w$  shares of  $\mathbf{y}$
    - Output a share of  $\mathbf{y}$  to each VM
  - VMs send back their shares to  $\mathbf{C}$  who recovers  $\mathbf{y}$

# Intuition

- Secret sharing
  - $\mathcal{A}$  must corrupt each worker
- MPC
  - Enables VMs to securely compute on shared input
  - *Without revealing information about shares to other workers*
    - Prevents  $\mathcal{A}$  from learning about 2+ shares with a single corruption
- “Coin Tossing”
  - Coins will be uniform as long as at least one worker is uncorrupted
  - Guarantees sharing of output is secure
- Delegation is secure vs. malicious  $\mathcal{A}$  if MPC is

# Limitations of Delegation Protocols

- Efficiency
  - Overhead for recover & share
  - Overhead for MPC [+ ZKPs/C&C if  $\mathcal{A}$  is malicious]
- Cost
  - Requires an extra  $(n - 1)$  VMs
- Useful
  - if cost of protocol < cost of single-tenant server
- Ongoing work
  - *Efficient* delegation protocols for specific functionalities (e.g., polynomials)
  - Combining our approach with other techniques...

# Questions?