

# Towards Robust Computation on Encrypted Data

Manoj Prabhakaran & Mike Rosulek



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# Computing on Encrypted Data

Conflicting demands in crypto protocols:

Data Privacy

Parties should only see data they're allowed to see

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Conflicting demands in crypto protocols:

## Data Privacy

Parties should only see data they're allowed to see

## Functionality

Data needs to be manipulated, used for computation

## Data Robustness

Data should only be manipulatable in allowed ways

# Homomorphic Encryption

## Definition: Homomorphic encryption

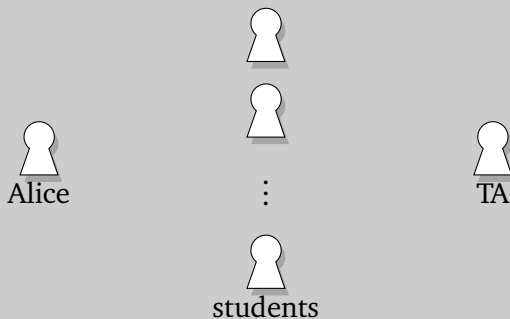
Scheme is **homomorphic with respect to  $f$**  if anyone can take  $\text{Enc}(x_1), \dots, \text{Enc}(x_n)$  and produce (fresh)  $\text{Enc}(f(\vec{x}))$ .

- ▶ Example:  $f$  is addition

Natural ingredient to achieve demands of protocols?

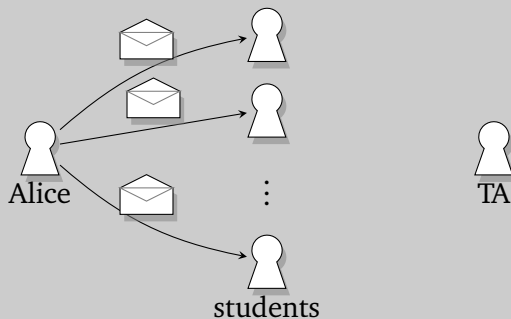
# Motivating Example: Teaching evaluations

Alice teaches a wildly popular crypto course:



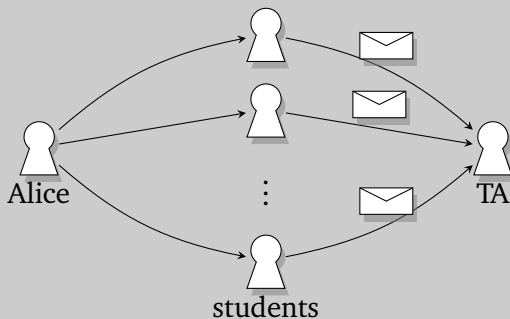
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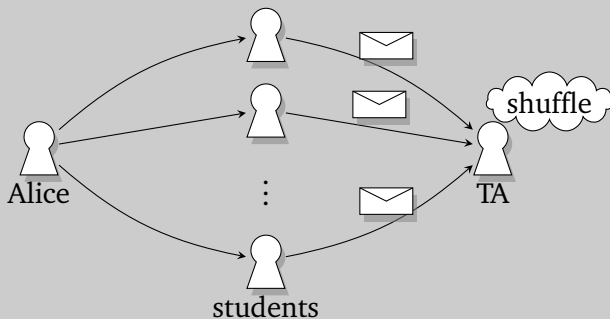
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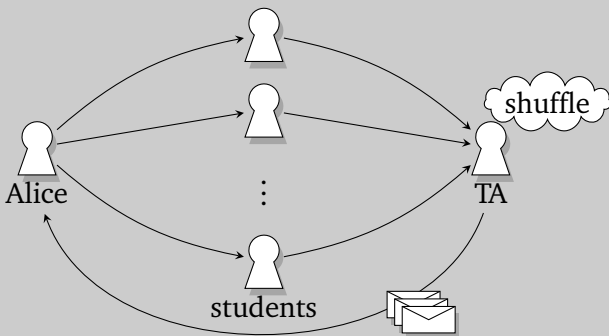
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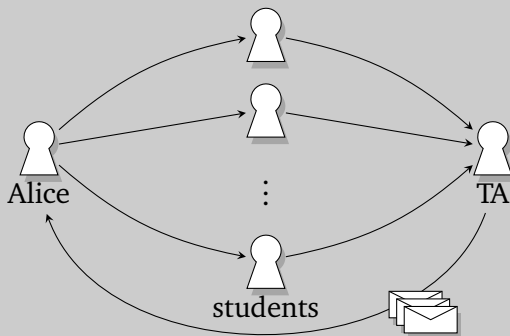
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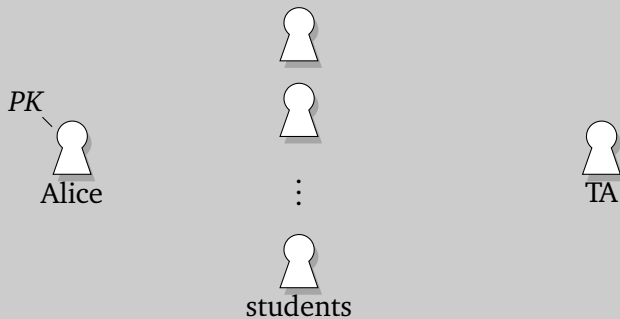


**Privacy:** TA can't see responses

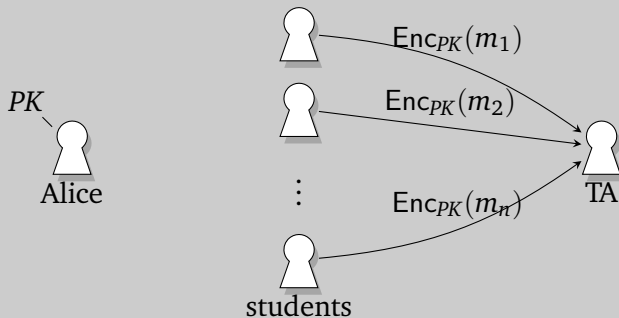
**Functionality:** TA must be able to anonymize (shuffle)

**Robustness:** TA can't modify/replace responses

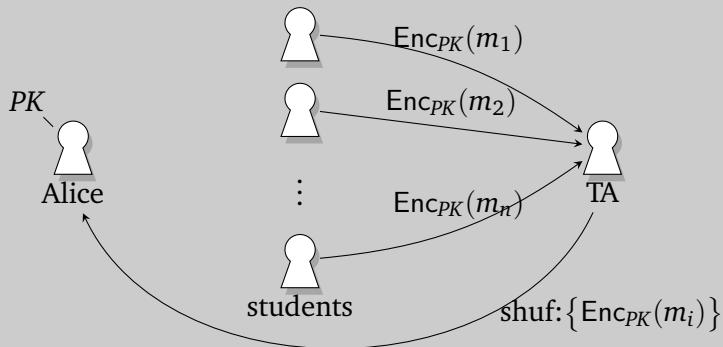
# Towards a protocol



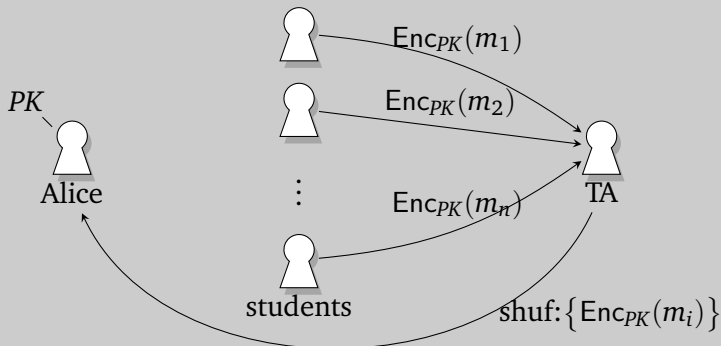
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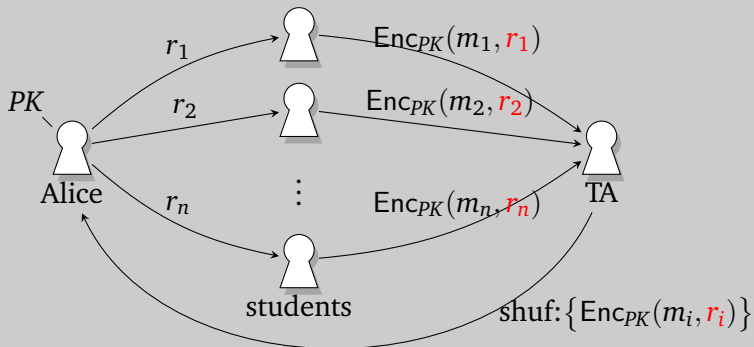


## Problem:

TA could omit someone's response & insert his own.

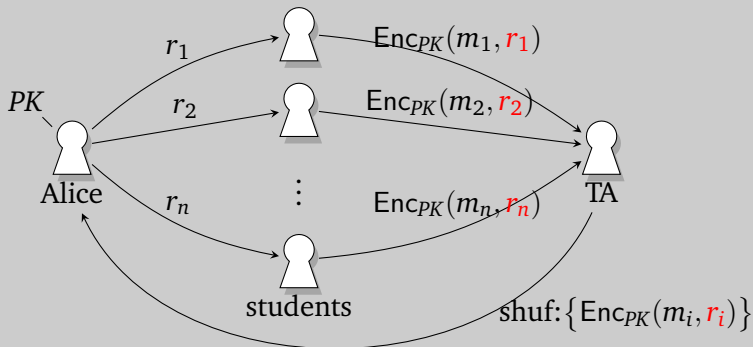
- ▶ Need some shared secret between Alice & students

# Towards a protocol





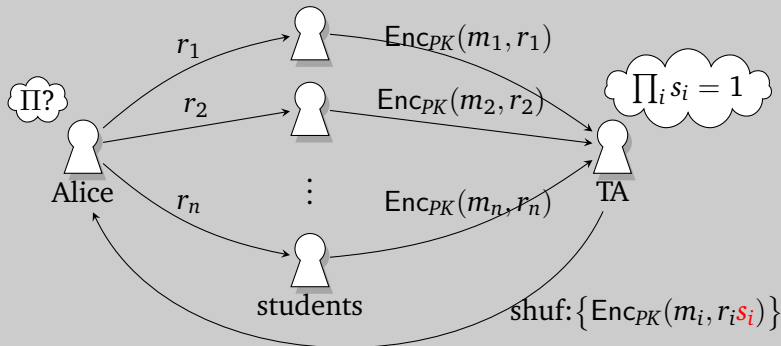
# Towards a protocol



## Problem:

Alice can associate  $m_i$  with the student to whom she sent  $r_i$ .

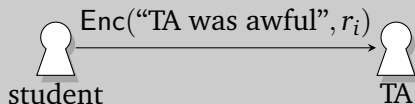
## Towards a protocol



## Solution:

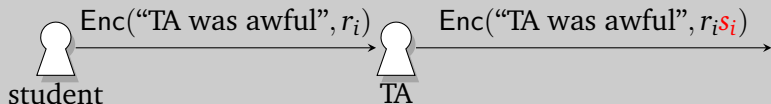
- ▶ Scheme is **homomorphic** via  $\text{Enc}(m, r) \rightsquigarrow \text{Enc}(m, rs)$
- ▶ Alice verifies  $\prod_i r_i = \prod_i (r_i s_i)$
- ▶ TA can't throw out anyone's response.

# Not all homomorphic operations created equal



Two classes of homomorphic operations:

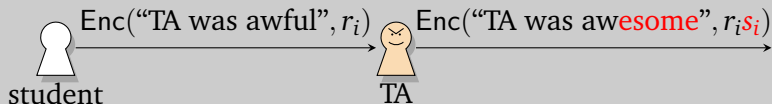
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Two classes of homomorphic operations:

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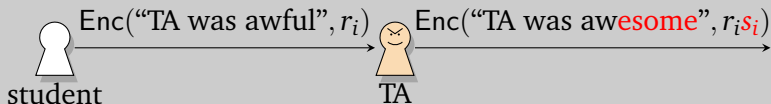
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Problem of **robustness** against unwanted manipulation.

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Existing work-arounds:

- ▶ TA gives zero-knowledge proof
  - ▶ Inefficient, complex, impossible in UC model
- ▶ Other ad-hoc band-aids [KKLZ'06]
- ▶ Avoid homomorphic encryption altogether?

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**Privacy:** CPA security

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- ▶ Avoid homomorphic encryption altogether?

Can't we do better?

- ▶ Encryption scheme itself should have some robustness mechanism

# Previous work

## “Non-malleable homomorphic encryption” [PR08]

Formal definitions demanding that scheme is simultaneously:

- ▶ **homomorphic** with respect to certain operations
  - ▶  $\text{Enc}(x) \rightsquigarrow \text{Enc}(f(x))$ , for specific  $f$ 's.
- ▶ but **non-malleable** with respect to *all other operations*
  - ▶ Infeasible to make ciphertexts related in any other way

## Previous work

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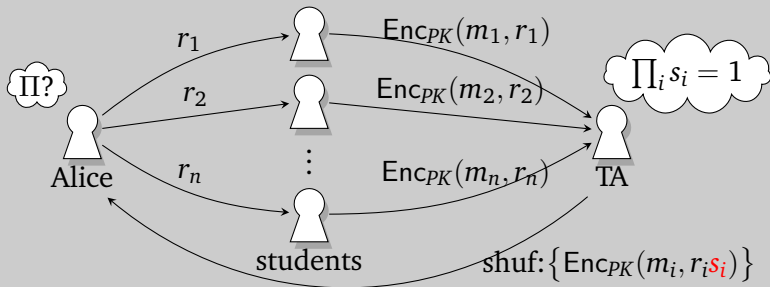
### Parameterized Construction [PR08]

Non-malleable homomorphic scheme can be instantiated to support (only) operations:

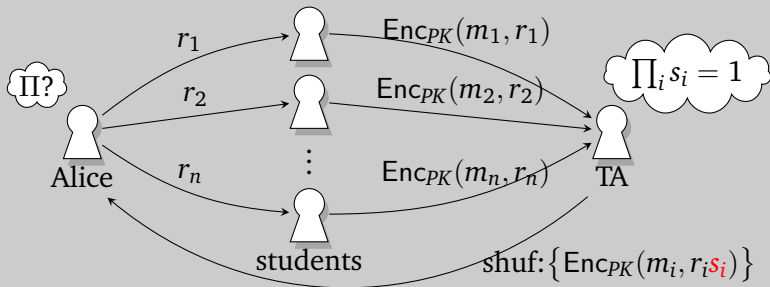
$$\text{Enc}(m, r) \rightsquigarrow \text{Enc}(m, rs)$$

where  $m, r, s$  are cyclic group elements.

# Using construction



# Using construction



## Theorem

*Teaching evaluations protocol is UC-secure when using the [PR08] encryption scheme, appropriately instantiated.*

- ▶ [PR08] encryption secure under DDH assumption
- ▶ Protocol needs no additional hardness assumption

# Implications

Encryption schemes can provide privacy, functionality, *and* robustness in a protocol.

- ▶ Intuitively simple protocols (minimal round complexity)
- ▶ Secure even in UC model (ZK proofs impossible)



# Binary Homomorphic Operations

[PR08] scheme supports certain unary homomorphic operations

$$\text{Enc}(x) \rightsquigarrow \text{Enc}(f(x))$$

Binary/ $n$ -ary operations also useful, natural, e.g.:

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Unfortunately,

## Theorem (PR'08)

*Impossible to achieve new notions of security, if any allowed  $f$  is a group operation.*

# What about relaxed requirements?

Relaxed requirements for homomorphic encryption:

- ▶ Ciphertexts have “length” parameter
- ▶ Length parameter increases when combining ciphertexts
- ▶ Ciphertexts leak length parameter but *nothing else*

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- ▶ Ciphertexts have “length” parameter
- ▶ Length parameter increases when combining ciphertexts
- ▶ Ciphertexts leak length parameter but *nothing else*

## Theorem (SYY99)

*Given relaxed requirements, can construct homomorphic scheme supporting certain boolean operations:*

- ▶  $\text{Enc}(x; \ell), \text{Enc}(y; \ell') \rightsquigarrow \text{Enc}(x \vee y; 8 \max\{\ell, \ell'\})$
- ▶  $\text{Enc}(x; \ell) \rightsquigarrow \text{Enc}(\neg x; \ell)$

“Can evaluate any circuit on encrypted bits, with exponential blowup in length parameter”

# Cryptocomputing

## Cryptocomputing approach [SYY99]

- ▶ Encode  $X$  into several component ciphertexts:

$$\text{Enc}(X; \ell) := (E(x_1), \dots, E(x_\ell))$$

where  $x_i$ 's are some randomized encoding of  $X$

- ▶ Use **unary** operations of  $E$  to manipulate encodings.

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“Use unary operations to achieve (relaxed) binary operations”

- ▶ [SYY99] considers only honest-but-curious adversaries
- ▶ Can we do something similar, but with robustness?

# Overview of our result

SY99	this work
any boolean operations on encrypted bits	group operation on encrypted group elements
length parameter increases exponentially	length parameter increases linearly
no “non-malleability” guarantee against malicious manipulation	malicious parties can manipulate ciphertexts no more than honest parties can

Recall: binary group operation impossible without some relaxation of requirements.

# First attempt at binary group operation

## First Idea

Encode  $X$  into random (multiplicative) sharing. I.e:

$$\text{Enc}(X; n) := (E(x_1), \dots, E(x_n))$$

where  $x_i$  random subject to  $\prod_i x_i = X$ .



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How to “multiply”  $\text{Enc}(X; n)$  and  $\text{Enc}(Y; m)$ :

1. Concatenate encrypted shares

$$\left( E(x_1), \dots, E(x_n), E(y_1), \dots, E(y_m) \right)$$

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How to “multiply”  $\text{Enc}(X; n)$  and  $\text{Enc}(Y; m)$ :

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$$\left( E(x_1 r_1), \dots, E(x_n r_n), E(y_1 r_{n+1}), \dots, E(y_m r_{n+m}) \right)$$

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**Result is distributed as  $\text{Enc}(XY; n + m)$ .**

# Binary group operation

## Problem

Given  $\text{Enc}(X; \ell)$ , can derive “shorter” related ciphertexts:

$$\text{Enc}(X; \ell) := \left( \underbrace{E(x_1), \dots, E(x_k)}_{\text{legitimate Enc}(S; k)}, \underbrace{E(x_{k+1}), \dots, E(x_\ell)}_{\text{legitimate Enc}(T; \ell - k)} \right)$$

where  $S, T$  unknown, but  $ST = X$ .

Want “non-malleability w.r.t. shorter ciphertexts”.

# Binary group operation

## Solution:

Encode  $X$  into two **independent** sharings (“top”, “bottom”)

$$\text{Enc}(X; n) := \left( E \begin{pmatrix} x_1 \\ x'_1 \end{pmatrix}, \dots, E \begin{pmatrix} x_n \\ x'_n \end{pmatrix} \right)$$

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How to “multiply”  $\text{Enc}(X; n)$  and  $\text{Enc}(Y; m)$ :

1. Concatenate encrypted share-pairs
2. Use unary operations of  $E$  to re-randomize “top” and “bottom” sharings **independently**

$$\left( E \begin{pmatrix} x_1 r_1 \\ x'_1 r'_1 \end{pmatrix}, \dots, E \begin{pmatrix} x_n r_n \\ x'_n r'_n \end{pmatrix}, E \begin{pmatrix} y_1 r_{n+1} \\ y'_1 r'_{n+1} \end{pmatrix}, \dots, E \begin{pmatrix} y_m r_{n+m} \\ y'_m r'_{n+m} \end{pmatrix} \right)$$

where  $r_i$  and  $r'_i$  random subject to  $\prod_i r_i = \prod_i r'_i = 1$ .

# Binary operations

Previous “attack” thwarted:

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“Top” and “bottom” sharings do not encode same value, with overwhelming probability.



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“Top” and “bottom” sharings do not encode same value, with overwhelming probability.

Still other unwanted malleabilities?

- ▶ maybe split each  $x_i$  from  $x'_i$ ?

# Our results

## Theorem

*If component scheme is non-malleable & homomorphic with respect to  $E(x, x') \rightsquigarrow E(xr, x'r')$ , then compound scheme is non-malleable & homomorphic with respect to operations:*

- ▶  $\text{Enc}(X; \ell), \text{Enc}(Y; \ell') \rightsquigarrow \text{Enc}(XY; \ell + \ell')$ , and
- ▶  $\text{Enc}(X; \ell) \rightsquigarrow \text{Enc}(rX; \ell)$

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## Observations:

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## Observations:

- ▶ [PR08] scheme can be so instantiated under DDH assumption.
- ▶ Crucially use non-malleability of component scheme
  - ▶ “top” share can’t be separated from its “bottom” partner

# Conclusion

## Take-home message:

With appropriate requirements on an encryption scheme, can achieve robust computation on encrypted data

- ▶ Intuitively simple protocols (no ZK!)
- ▶ Security even in UC model against malicious adversaries

# Open questions

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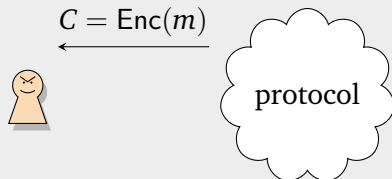
- ▶ Weaker requirements that provide robustness in protocols?
  - ▶ Existing definitions very strong, thus
  - ▶ Existing non-malleable homomorphic encryption construction is complicated
- ▶ Support/applications for other kinds of unary homomorphic operations?
- ▶ Can we achieve more robust cryptocomputing?
  - ▶ Both binary operations in **ring** (not just one group)?
  - ▶ [SYY99] do, but without robustness
  - ▶ Their encoding too fragile to immediately work, even with strong component encryption

Thanks for your attention! Any questions?

*fin.*

# How to Define “Non-malleable Homomorphic”

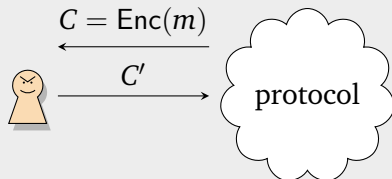
Essence of a malleability attack:





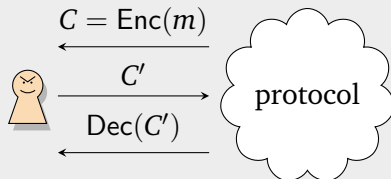
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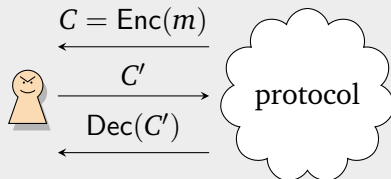
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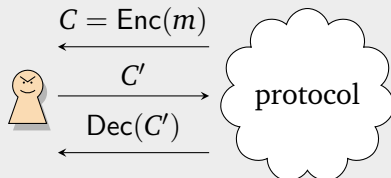
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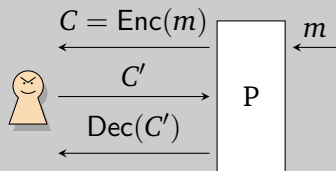
Non-malleability defined in terms of this kind of interaction

Now, it's **legitimate** if  $C'$  related to  $C$  in certain ways.

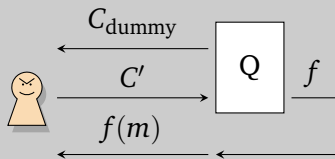
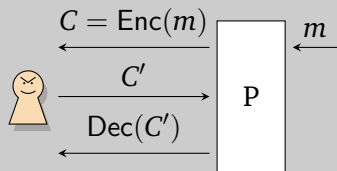
## Idea:

Design a game where adversary wins by making bad related ciphertexts.

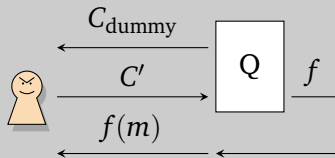
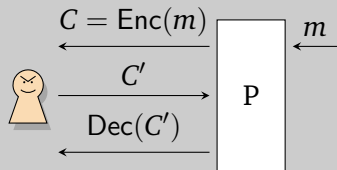
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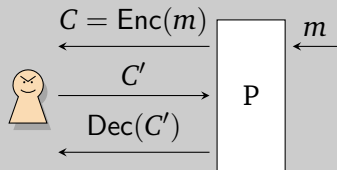
## Games Cryptographers Play (simplified)



Adversary's goal: Determine whether talking to  $P$  or  $Q$ .

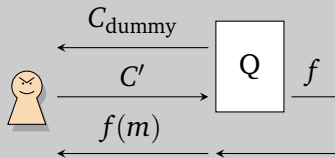
- ▶ Distinguish  $C_{\text{dummy}}$  from  $\text{Enc}(m)$
- ▶ Generate confounding  $C'$

# Games Cryptographers Play (simplified)



Adversary's goal: Determine whether talking to  $P$  or  $Q$ .

- ▶ Distinguish  $C_{\text{dummy}}$  from  $\text{Enc}(m)$
- ▶ Generate confounding  $C'$

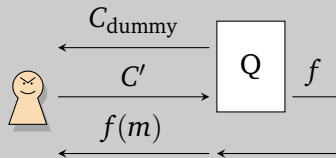
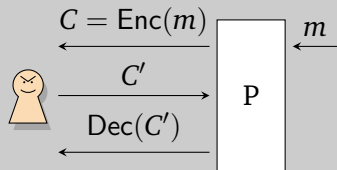


$Q$ 's goal: Make two worlds look indistinguishable.

- ▶ Generate  $C_{\text{dummy}}$  that looks like  $\text{Enc}(m)$
- ▶ Determine how  $C'$  related.



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### Observation

If  $Q$  restricted to output  $\{f_1, \dots, f_n\}$ , then adversary can always win by making  $C'$  related to  $C/C_{\text{dummy}}$  in some other way.

# The “Right” Definition

## Contrapositive

If  $Q$  restricted to output  $\{f_1, \dots, f_n\}$ , but adversary still can't win, then it must be impossible to make  $C'$  related to  $C/C_{\text{dummy}}$  in some other way.

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## New Security Definition [PR '08]

Scheme is **non-malleable except for operations**  $\{f_1, \dots, f_n\}$  if there is a strategy  $Q$  that only outputs  $f \in \{f_1, \dots, f_n\}$ , and no adversary ever wins.