



# Worst-case side-channel security: from evaluation of countermeasures to new designs

## Public Defense

Olivier Bronchain

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European Research Council  
Established by the European Commission



# Contenu de la présentation

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1. Résumé vulgarisé de ma thèse (en français).
2. Contenu technique (en anglais).

# Content

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Ma thèse en quelques mots

Technical introduction

Evaluations

Proof-based

Attack-based

New designs

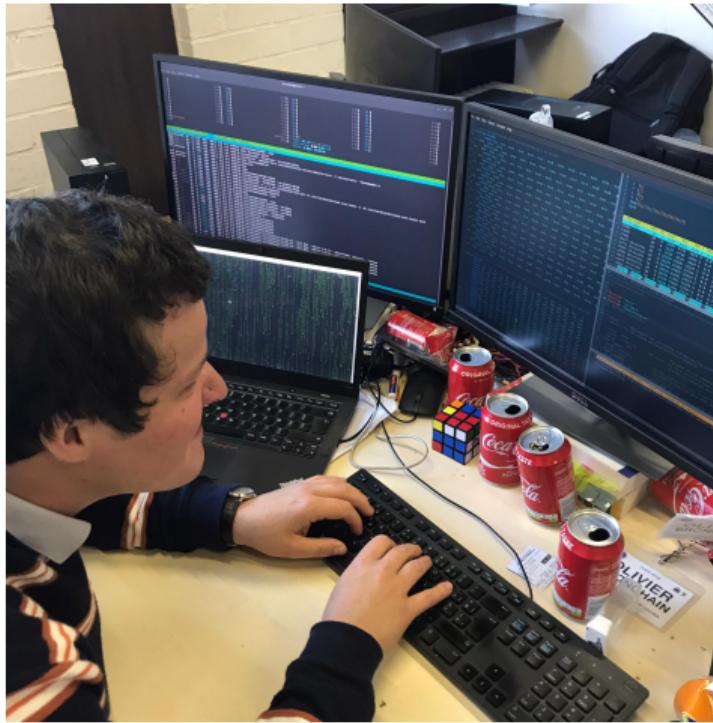
Conclusion

# Qu'est-ce qu'une thèse ?

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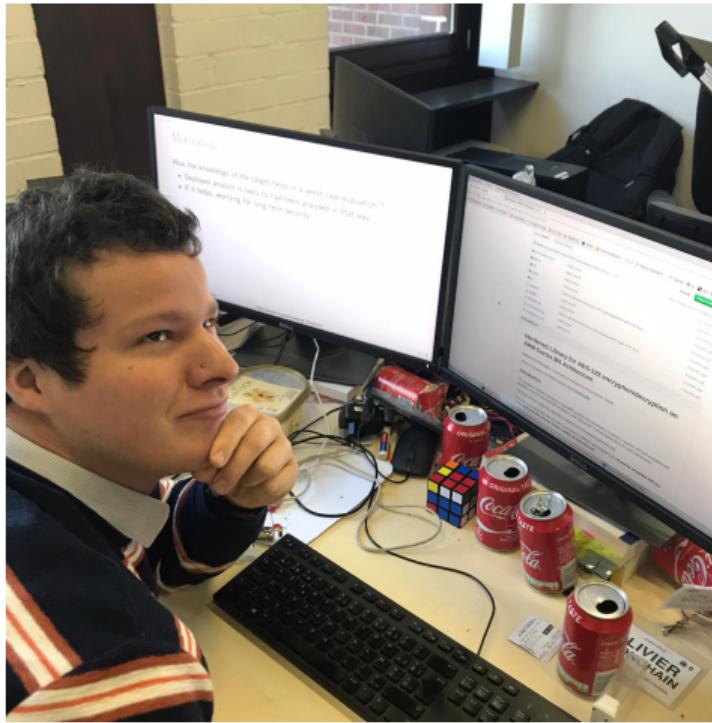
# Qu'est-ce qu'une thèse ?

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*"Coder des trucs ?"*

# Qu'est-ce qu'une thèse ?



Chercher une bonne idée ?

# Qu'est-ce qu'une thèse ?

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Souder ?

# Qu'est-ce qu'une thèse ?

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Bidouiller des cartes électroniques ?

# Qu'est-ce qu'une thèse ?

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Ecouter de la musique à fond ?

# Qu'est-ce qu'une thèse ?

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## **Side-Channel Countermeasures' Dissection and the Limits of Closed Source Security Evaluations**

Olivier Bronchain and François-Xavier Standaert

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[{olivier.bronchain,fstandae}@uclouvain.be](mailto:{olivier.bronchain,fstandae}@uclouvain.be)

**Abstract.** We take advantage of a recently published open source implementation of the AES protected with a mix of countermeasures against side-channel attacks to discuss both the challenges in protecting COTS devices against such attacks and the limitations of closed source security evaluations. The target implementation has been proposed by the French ANSSI (Agence Nationale de la Sécurité des Systèmes d'Information) to stimulate research on the design and evaluation of side-channel secure implementations. It combines additive and multiplicative secret sharings into an affine masking scheme that is additionally mixed with a shuffled execution. Its preliminary leakage assessment did not detect data dependencies with up to 100,000 measurements. We first exhibit the gap between such a preliminary leakage assessment and advanced attacks by demonstrating how a countermeasures' dissection exploiting a mix of dimensionality reduction, multivariate information extraction and key enumeration can recover the full key with less than 2,000 measurements. We then discuss the relevance of open source evaluations to analyze such implementations efficiently, by pointing out that certain steps of the attack are hard to automate without implementation knowledge (even with machine learning tools), while performing them manually is straightforward. Our findings are not due to design flaws but from the general difficulty to prevent side-channel attacks in COTS devices with limited noise. We anticipate that high security on such devices requires significantly more shares.

**Keywords:** Side-Channel Attacks · Security Evaluations · Certification · Affine Masking · Shuffling · Worst-Case (Multivariate) Analysis · Open Source Design

## Ecrire des articles de recherche ?

# Qu'est-ce qu'une thèse ?

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Voyager pour présenter des travaux ?

# Qu'est-ce qu'une thèse ?

---



Une thèse: c'est un peu tout cela à la fois ...

... et c'est ce que je vais essayer de vous expliquer!

# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

## Ma thèse en quelques mots

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# Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

1. Security

# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

1. Security
2. Side-channel

# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

1. Security
2. Side-channel
3. Countermeasures

# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

1. Security
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# Ma thèse en quelques mots

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## Worst-case side-channel security: from evaluation of countermeasures to new designs

Décryptons le titre mot par mot:

1. Security
2. Side-channel
3. Countermeasures
4. Evaluation
5. Worst-case

# Worst-case side-channel **security**: from evaluation of countermeasures to new designs



O. Bronchain



Worst-case side-channel security: from evaluation of countermeasures to new designs

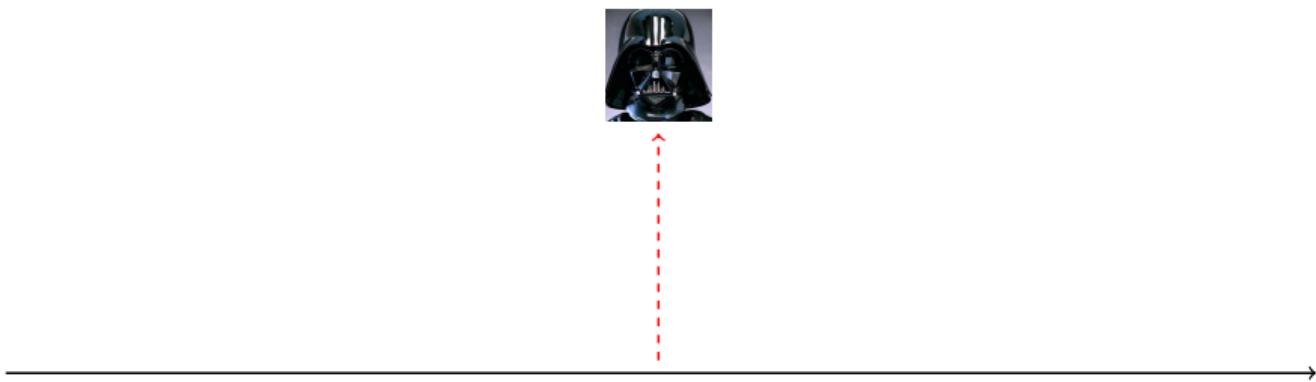
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*J'ai une super idée!!!*



# Worst-case side-channel **security**: from evaluation of countermeasures to new designs



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*J'ai une super idée!!!*

$$E(\cdot)$$

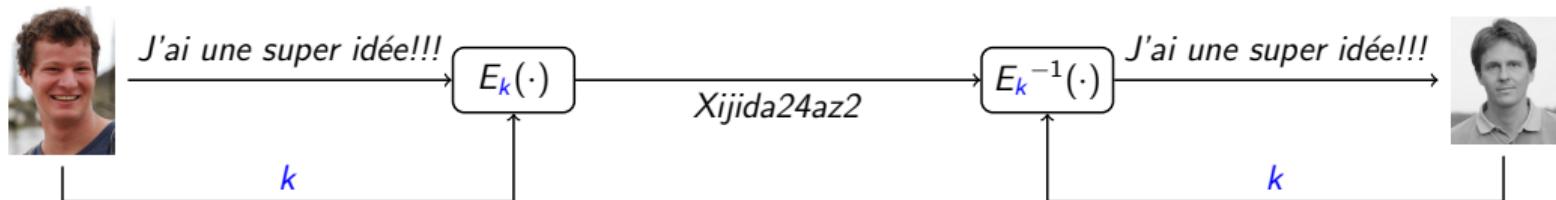
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$$E^{-1}(\cdot)$$

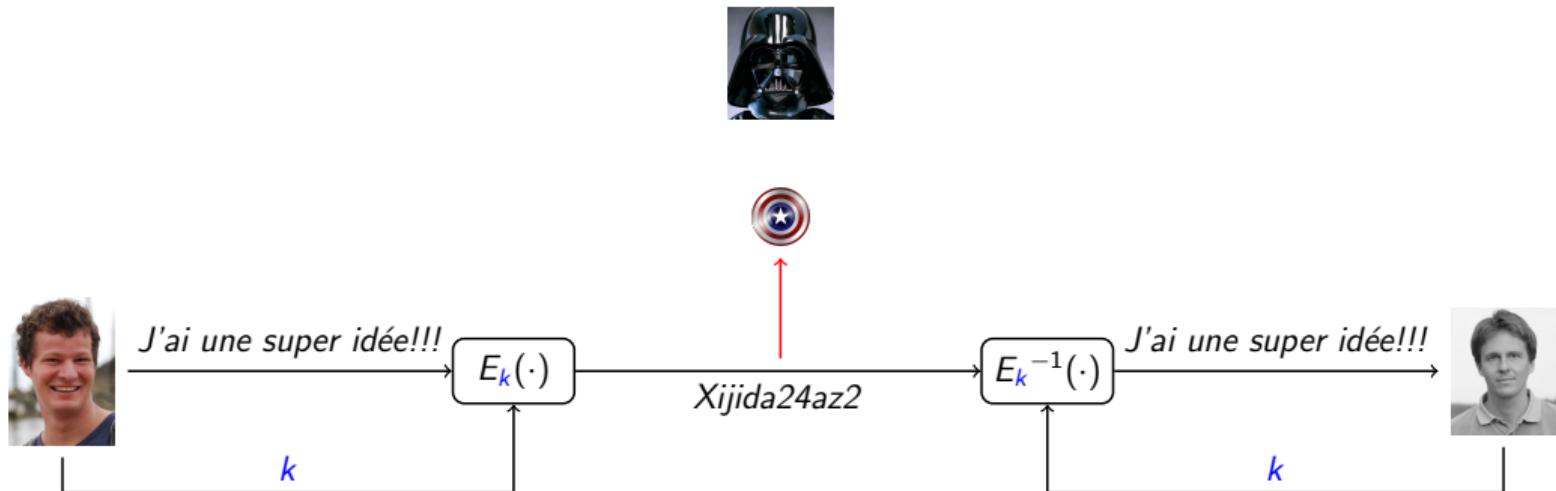
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# Worst-case side-channel security: from evaluation of countermeasures to new designs



# Worst-case side-channel security: from evaluation of countermeasures to new designs



# Essayons une analogie

---

Le but de cette partie est de décrire une analogie entre la sécurité contre les canaux latéraux et la sécurité contre les attaques par voie de réseau.

# Essayons une analogie

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- ▶ La sécurité: le digipass.
  - ▶ La clé: un code à 4 chiffres.
-

# Essayons une analogie

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- ▶ La sécurité: le digipass.
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Un adversaire devine la clé:

# Essayons une analogie

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- ▶ La sécurité: le digipass.
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Un adversaire devine la clé:

- ▶ 4953 ?

# Essayons une analogie

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Un adversaire devine la clé:

- ▶ 4953 ?
- ▶ 2391 ?

# Essayons une analogie

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Un adversaire devine la clé:

- ▶ 4953 ?
- ▶ 2391 ?
- ▶ 1234 ?

# Essayons une analogie

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Un adversaire devine la clé:

- ▶ 4953 ?
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  - ▶ 1234 ?
- Il teste une à une chacune des possibilités.

# Worst-case side-channel security: from evaluation of countermeasures to new designs



O. Bronchain



Worst-case side-channel security: from evaluation of countermeasures to new designs

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# Worst-case side-channel security: from evaluation of countermeasures to new designs



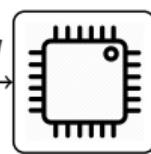
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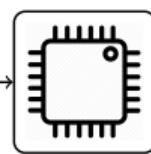
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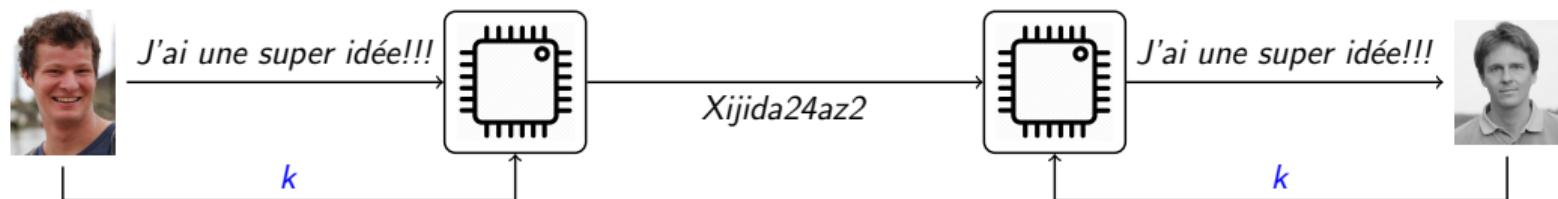
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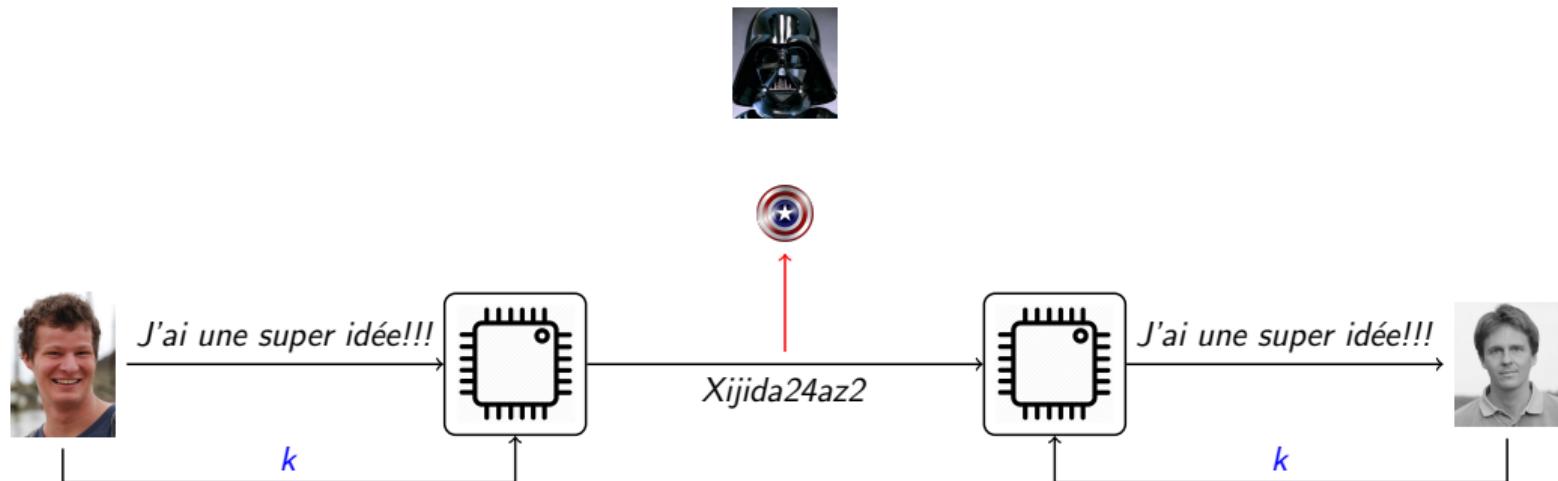
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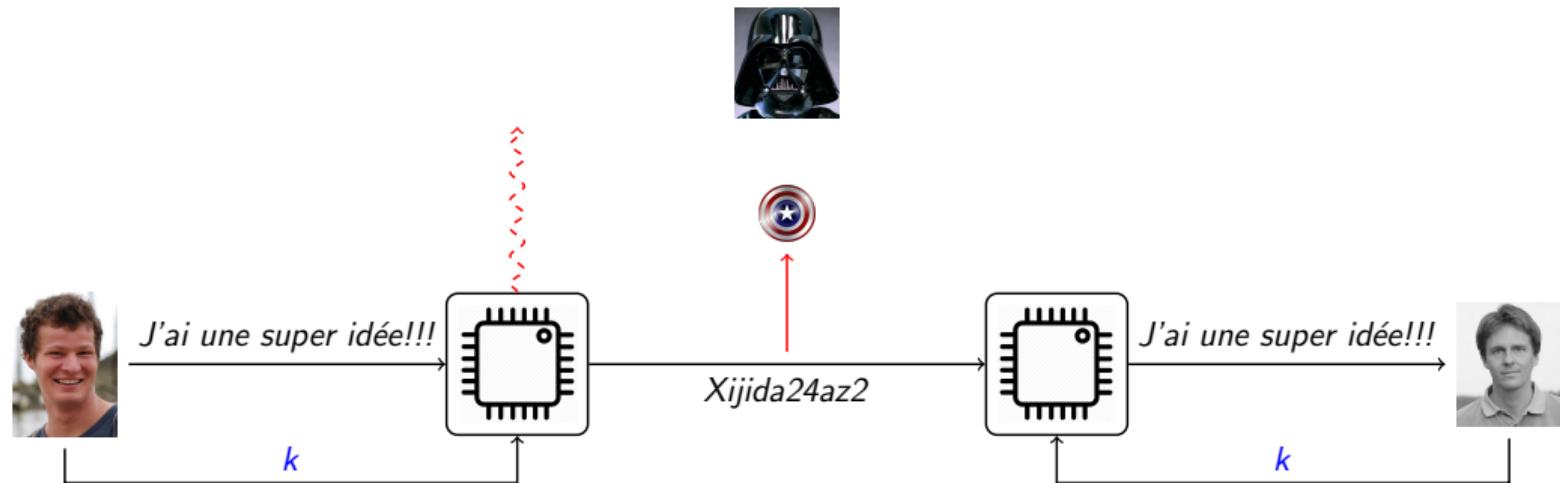
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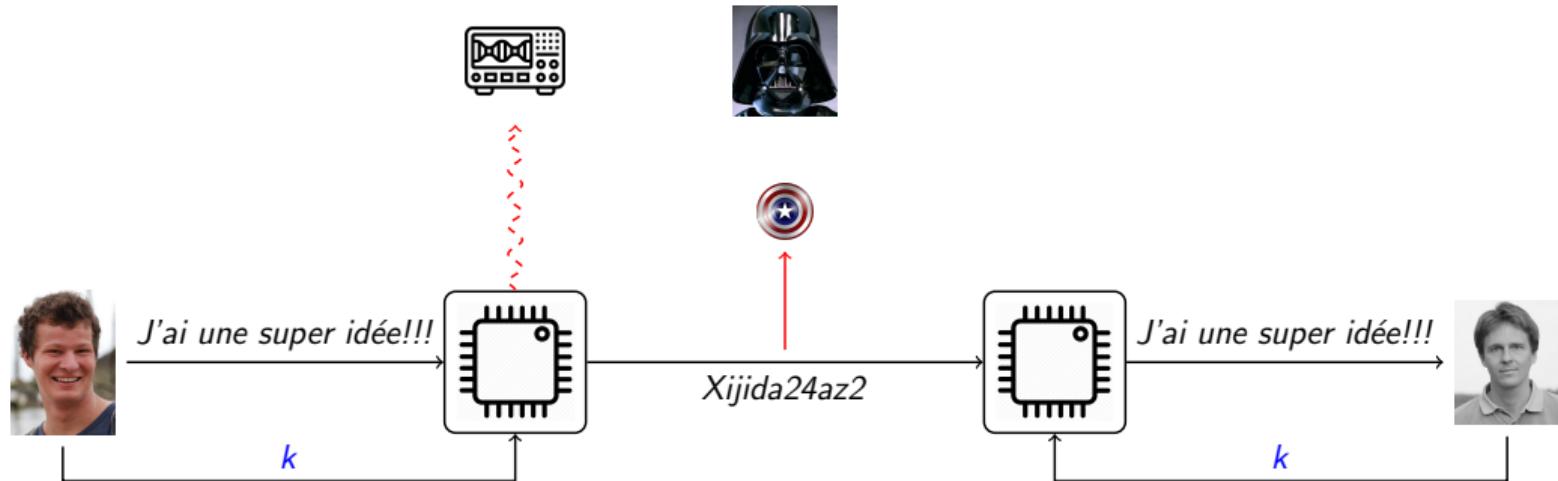
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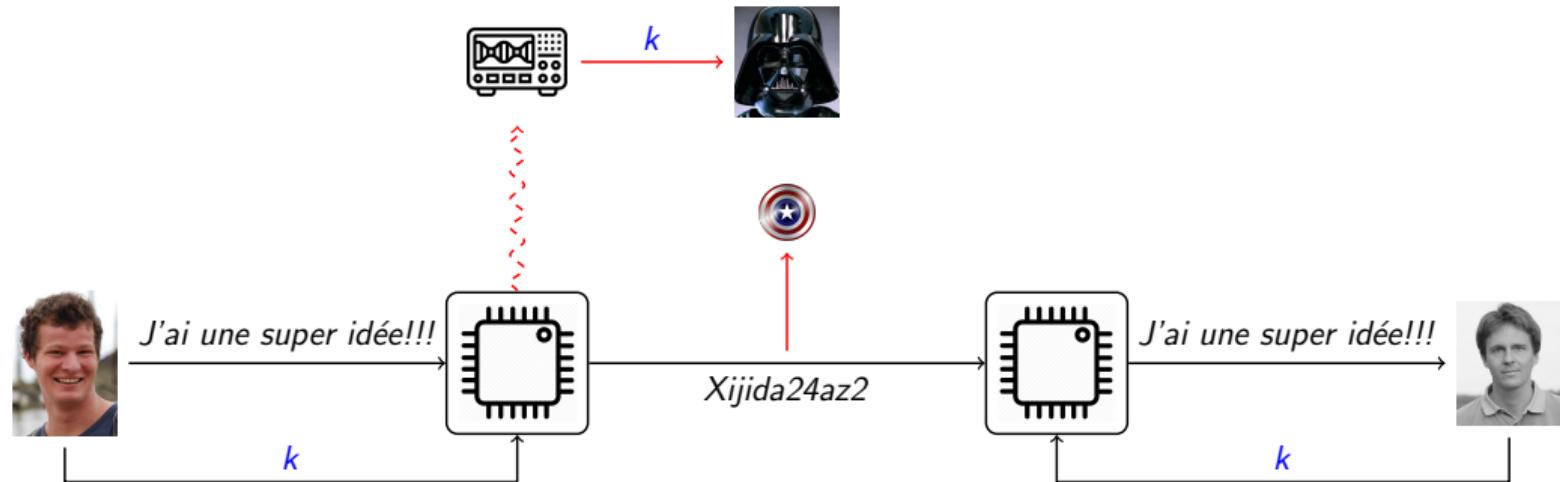
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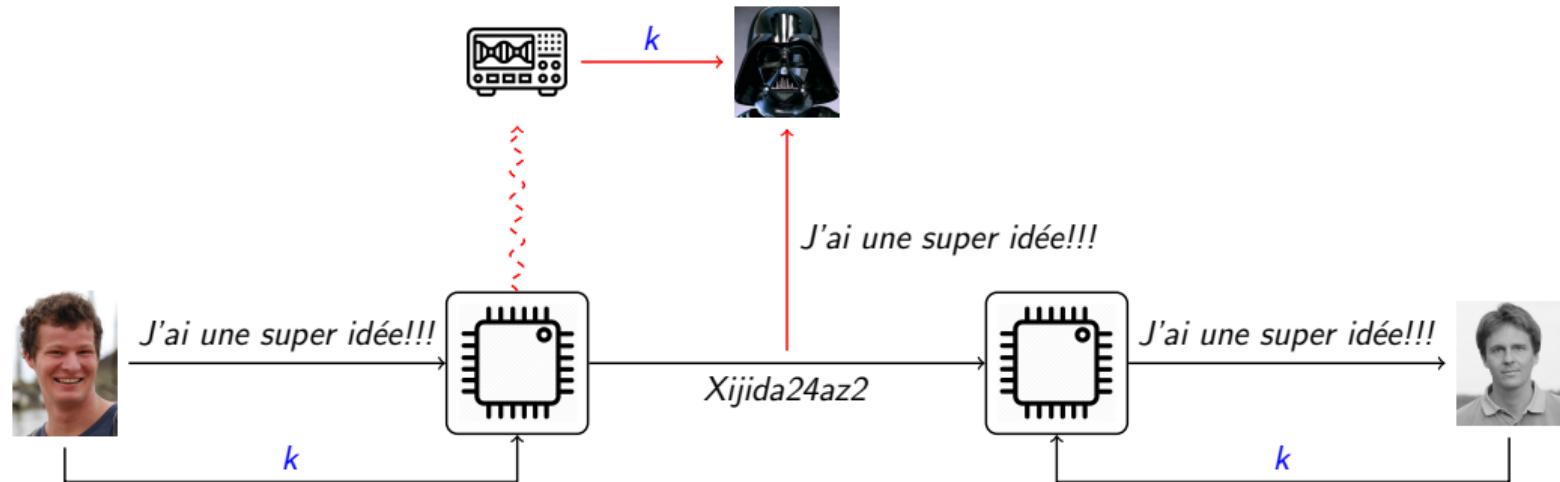
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# Essayons une analogie

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# Essayons une analogie

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# Essayons une analogie

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- ▶ La sécurité: le digipass.
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Un adversaire devine la clé:

- ▶ 2268 ?

# Essayons une analogie

---



- ▶ La sécurité: le digipass.
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Un adversaire devine la clé:

- ▶ 2268 ?
- ▶ 6628 ?

# Essayons une analogie

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- ▶ La sécurité: le digipass.
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Un adversaire devine la clé:

- ▶ 2268 ?
- ▶ 6628 ?
- ▶ 8826 ?

# Essayons une analogie



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- Il teste une à une chacune des possibilités, avec uniquement des 2, des 6 ou des 8.

# Essayons une analogie



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- Moins de sécurité.

# Essayons une analogie



- ▶ La sécurité: le digipass.
- ▶ La clé: un code à 4 chiffres.
- ▶ Side-Channel: le chocolat.

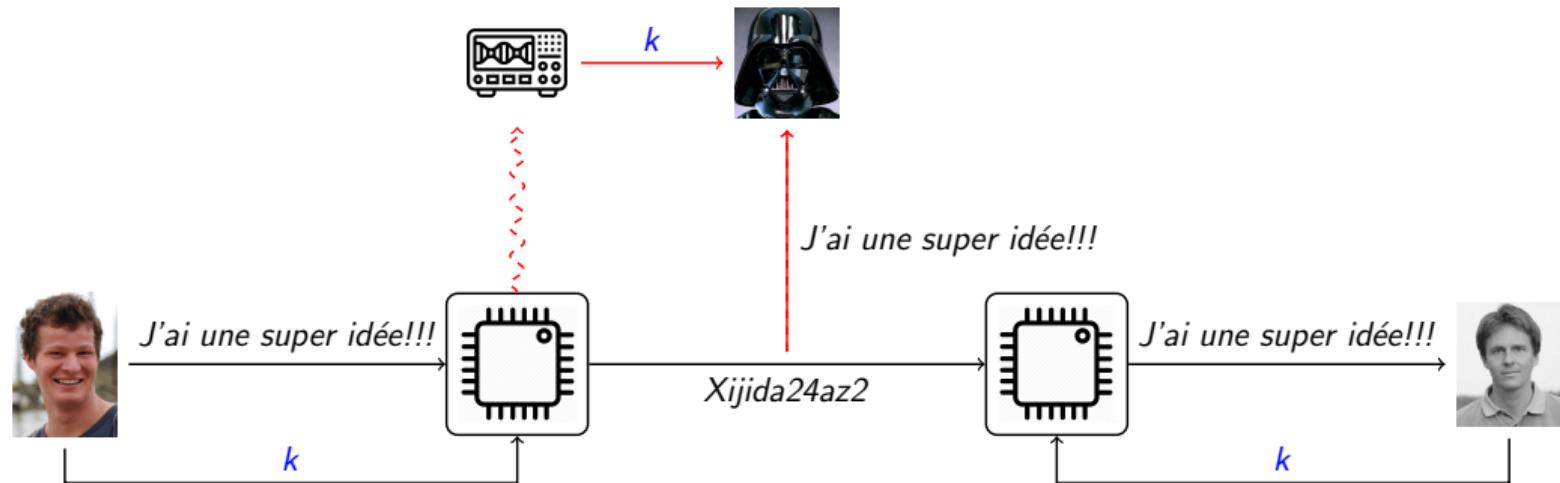
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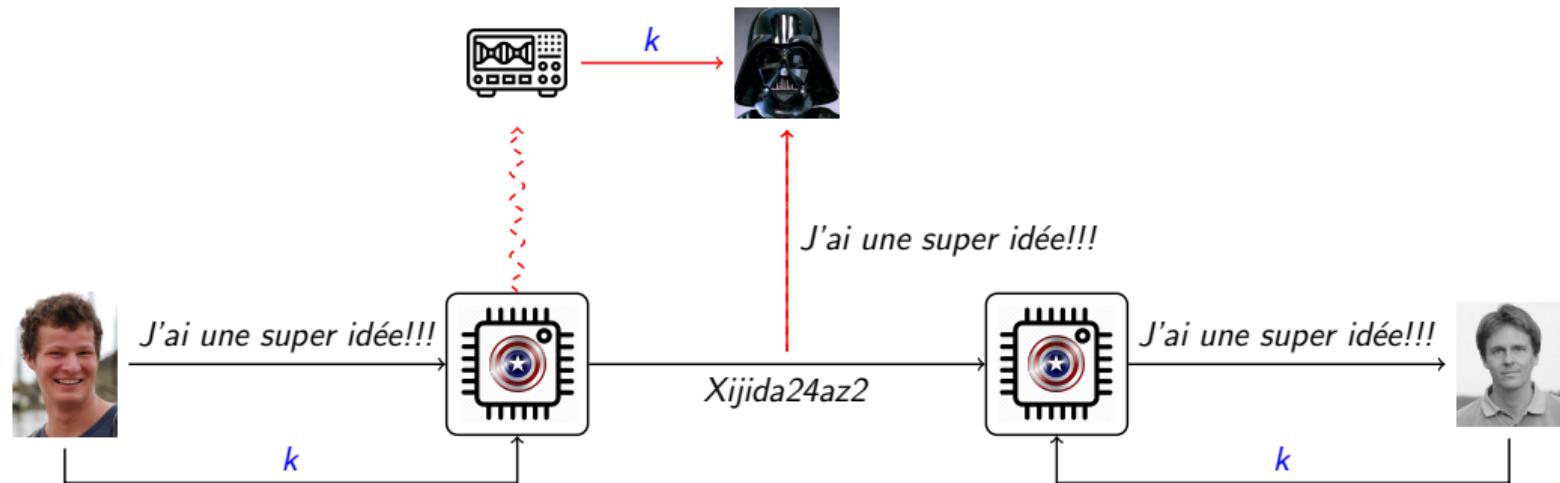
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→ Moins de sécurité.

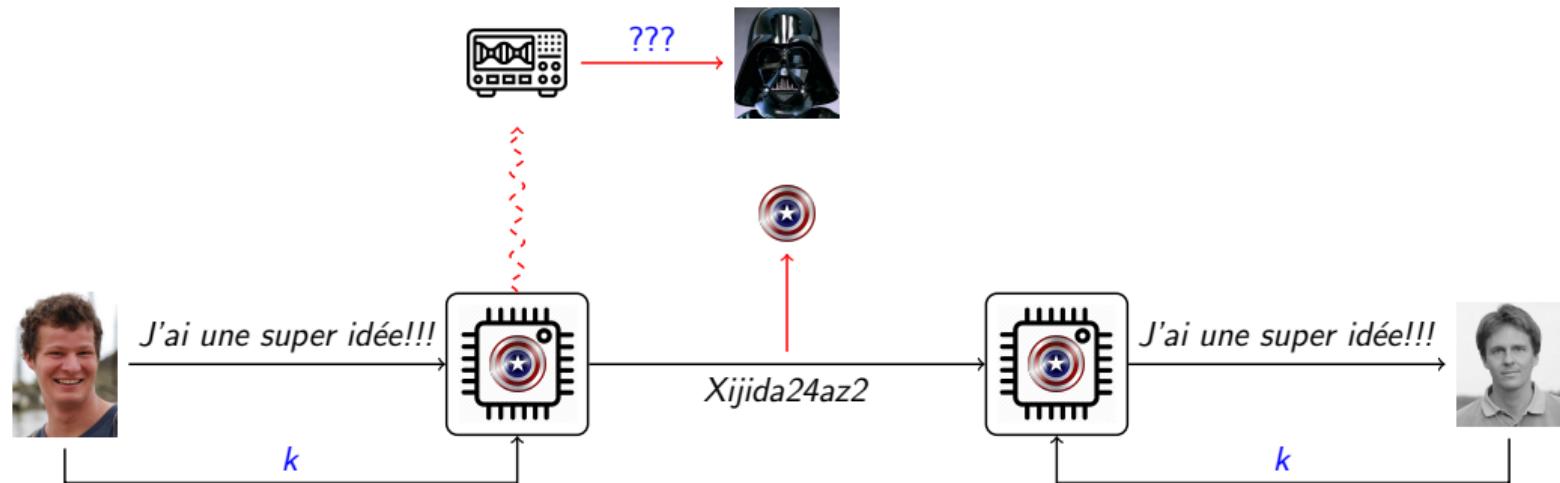
# Worst-case side-channel security: from evaluation of **countermeasures** to new designs



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# Essayons une analogie

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- ▶ La sécurité: le digipass.
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# Essayons une analogie

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- ▶ La sécurité: le digipass.
  - ▶ Side-channel: → sécurité réduite.
  - ▶ Contre-mesure:...
-

# Essayons une analogie

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- ▶ La sécurité: le digipass.
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  - ▶ Contre-mesure:... se laver les mains!
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# Essayons une analogie

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# Essayons une analogie

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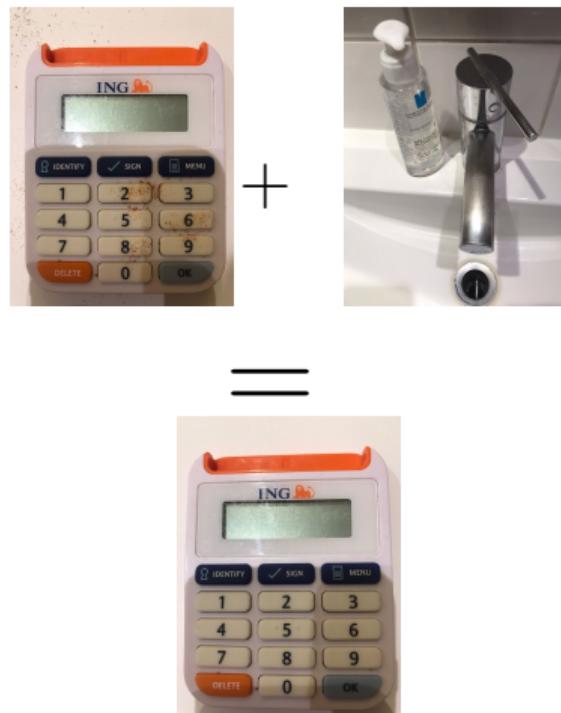
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- ▶ 1028 ?



# Essayons une analogie

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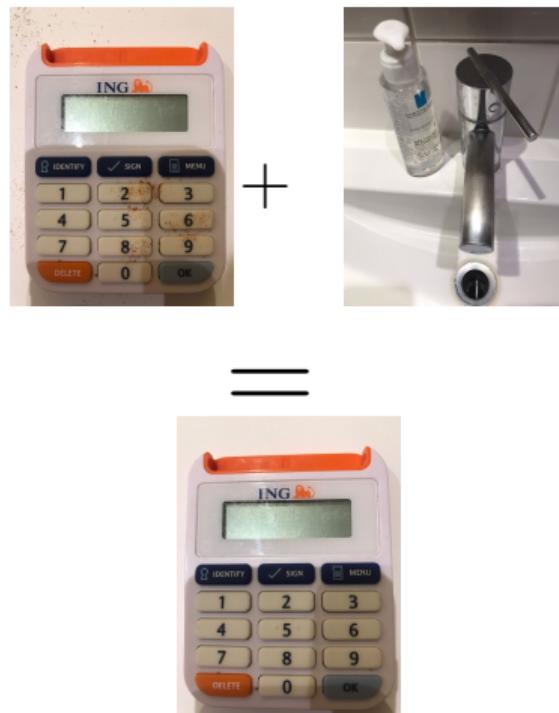
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Un adversaire devine la clé:

- ▶ 1028 ?
- ▶ 5742 ?

# Essayons une analogie

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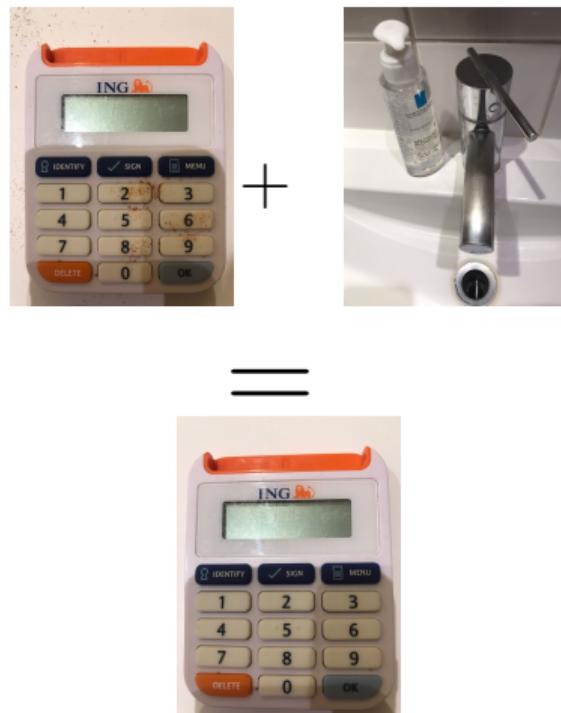


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Un adversaire devine la clé:

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# Essayons une analogie



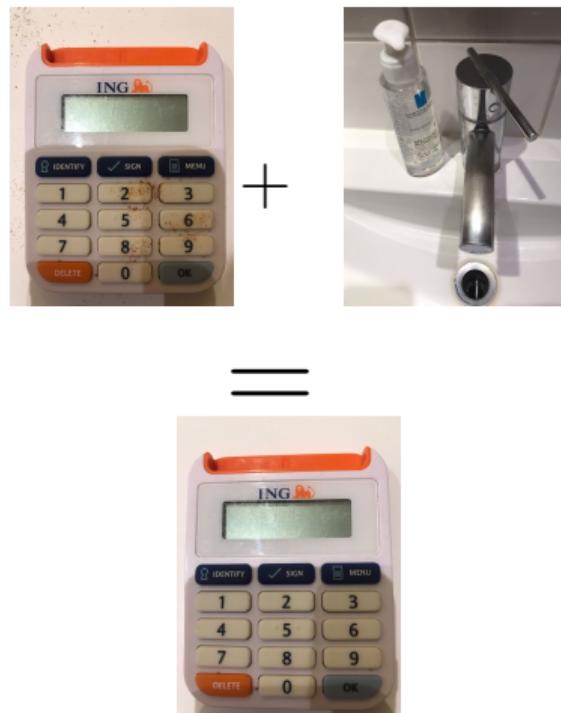
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→ Pas d'autre solution que de tester une à une chacune des combinaisons.

# Essayons une analogie



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Un adversaire devine la clé:

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→ Pas d'autre solution que de tester une à une chacune des combinaisons.

→ Retour de la sécurité!

# Worst-case side-channel security: from evaluation of countermeasures to new designs

Vador va attaquer la contre-mesure (USA)!



# Worst-case side-channel security: from evaluation of countermeasures to new designs

Vador va attaquer la contre-mesure (⊕)!



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# Worst-case side-channel security: from evaluation of countermeasures to new designs

Vador va attaquer la contre-mesure (USA)!

Mon travail:

- ▶ Évaluer la résistance de USA avant une éventuelle attaque.



# Worst-case side-channel security: from evaluation of countermeasures to new designs



Vador va attaquer la contre-mesure (美国总统图标)!

Mon travail:

- ▶ Évaluer la résistance de (美国总统图标) avant une éventuelle attaque.

Une possibilité:

- ▶ Reproduire l'attaque dans mon laboratoire.

# Worst-case side-channel security: from evaluation of countermeasures to new designs



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Se mettre à la place de l'adversaire: quelle stratégie pourrait-il adopter ?

# Essayons une analogie



- ▶ La sécurité: le digipass.
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- ▶ Contre-mesure: se laver les mains.
- ▶ Évaluation: Reproduire l'attaque.

Se mettre à la place de l'adversaire: quelle stratégie pourrait-il adopter ?

- ▶ Utiliser une loupe pour détecter des traces de chocolat ?
- ▶ Fermer le robinet pour empêcher le lavage des mains ?

# Worst-case side-channel security: from evaluation of countermeasures to new designs

Challenge:



# Worst-case side-channel security: from evaluation of countermeasures to new designs



Challenge: Quid si Vador a une attaque que je ne sais pas reproduire dans mon laboratoire ?



# Worst-case side-channel security: from evaluation of countermeasures to new designs



Challenge: Quid si Vador a une attaque que je ne sais pas reproduire dans mon laboratoire ?



J'ai travaillé là dessus ! Comment faire ?

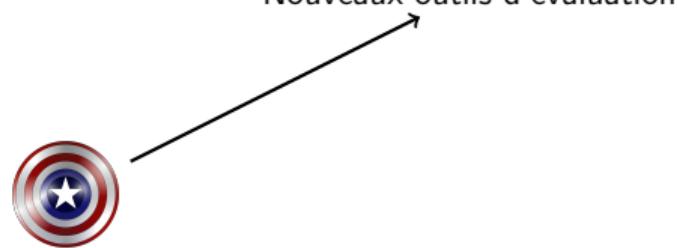
1. Faire une analyse sur une petite , et extrapoler pour des plus grosses.
2. Se baser sur des preuves mathématiques, et vérifier leurs hypothèses.

# Worst-case side-channel security: from evaluation of countermeasures to new designs

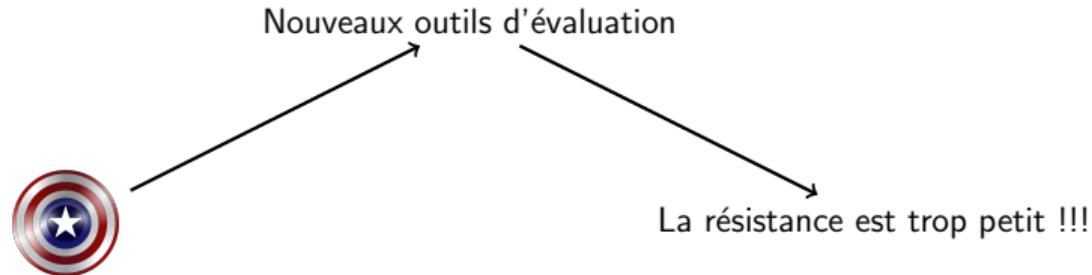
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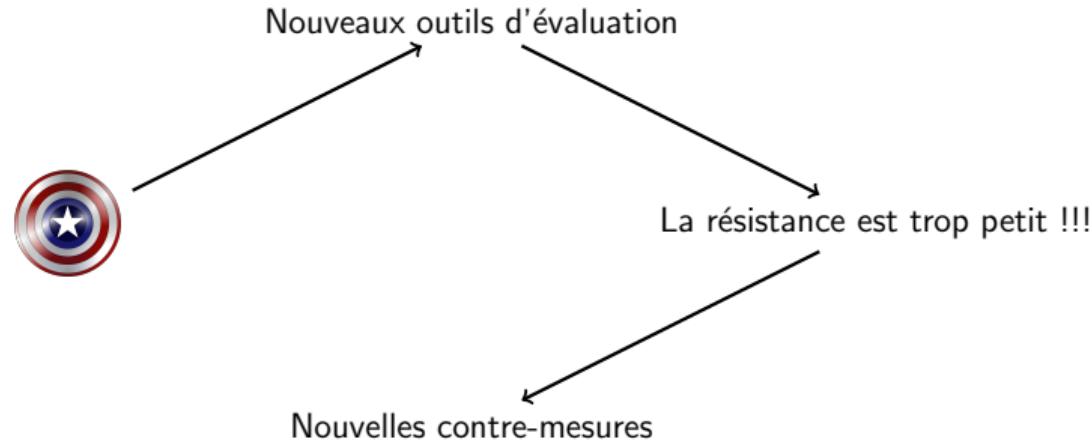
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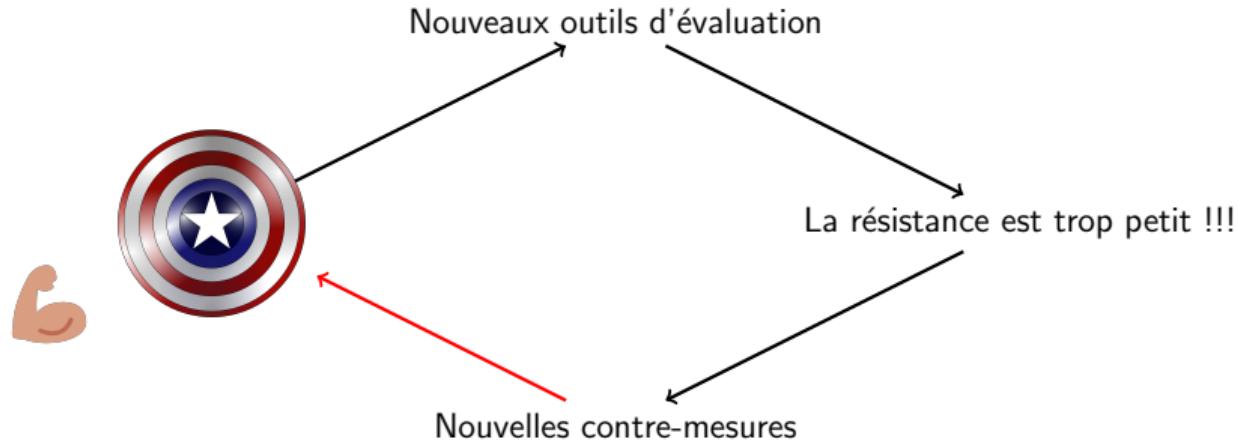
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# Content

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Ma thèse en quelques mots

**Technical introduction**

Evaluations

Proof-based

Attack-based

New designs

Conclusion

# How to get SCA security with masking ?

---

Design goes in two steps:

1. Proofs in abstract models.
  2. Use reductions to concrete  
(noisy) security.
-

# How to get SCA security with masking ?

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1. Proofs in abstract models.
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With masking:

1. Randomize the computation,
  2. More randomness (shares) → more security.
  3. More noise → more security
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# How to get SCA security with masking ?

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$$N \geq \frac{c}{\text{MI}(X_i; L)^d}$$

Data complexity      Information per share      Number of shares

```
graph TD; N --> DC[Data complexity]; N --> F[c / MI(Xi; L)^d]; F --> NS[Number of shares]; F --> IPS[Information per share]
```

# How to get SCA security with masking ?

---

Design goes in two steps:

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Two physical conditions:

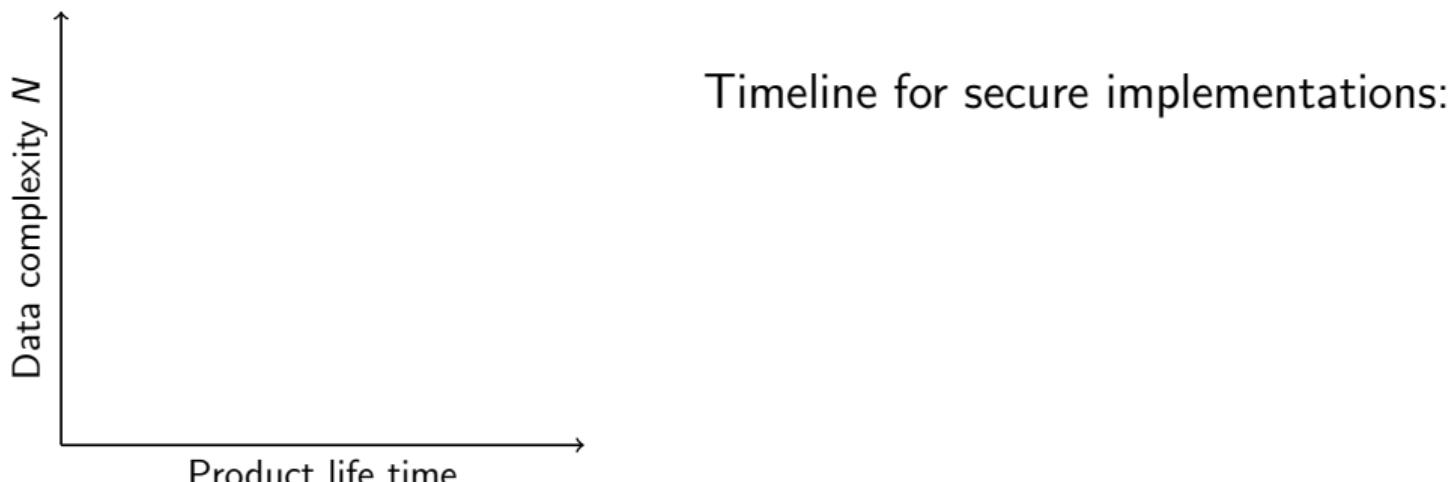
1. **Independence**: ensures  $d$ .
2. **Noise**: small enough MI.

$$N \geq \frac{c}{\text{MI}(X_i; L)^d}$$

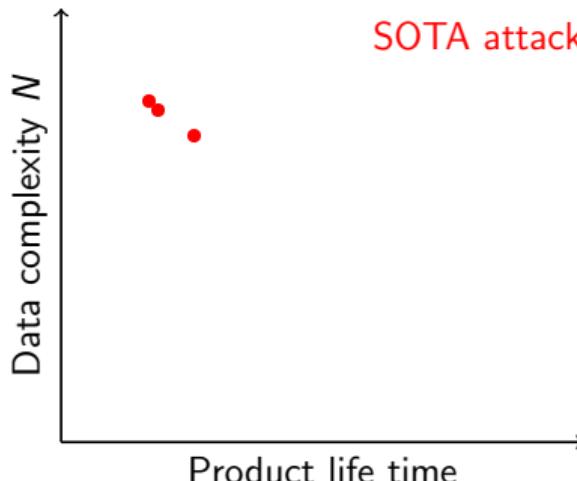
Data complexity      Information per share      Number of shares

# Part I & II: goal of security evaluations

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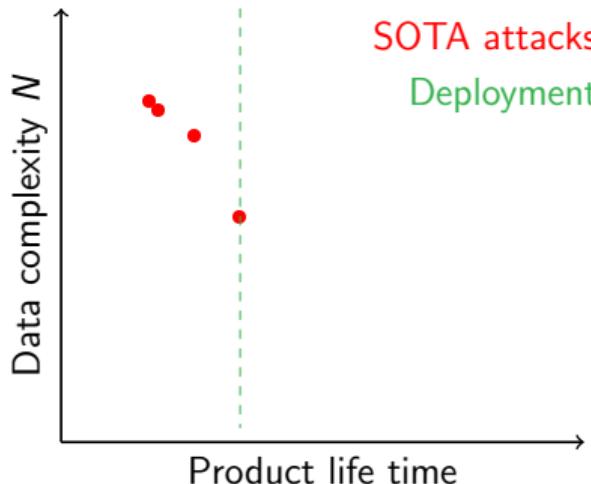
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Timeline for secure implementations:

- ▶ Apply current SOTA attacks.
- ▶ SOTA improvements with time.

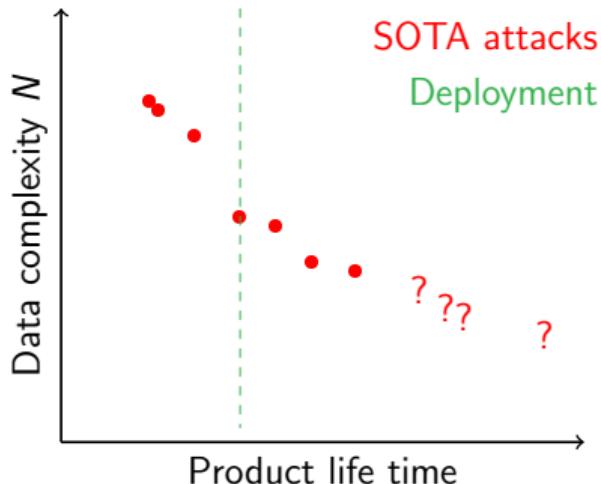
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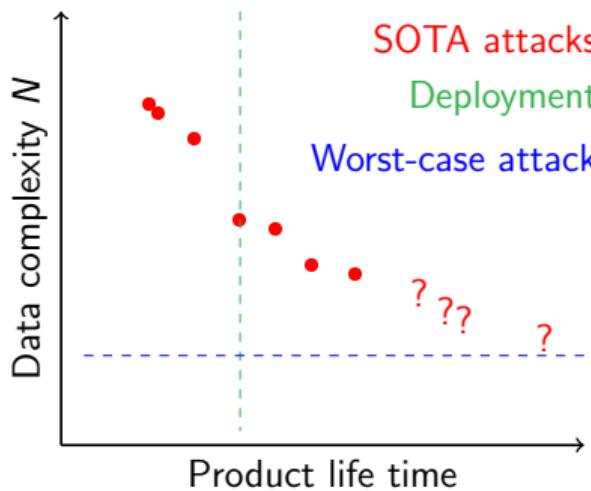
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# Part I & II: goal of security evaluations



Timeline for secure implementations:

- ▶ Apply current SOTA attacks.
- ▶ SOTA improvements with time.
- ▶ Deploy the implementation.
- ▶ Attack still improves.

How to anticipate future SOTA with **worst-case** attacks ?

# Ingredients for (close-to) worst-case evaluations

---

Evaluator benefits from open-source (during profiling/learning):

- ▶ Knowledge of the source code.
- ▶ Knowledge of the randomness  $\mathcal{R}$ .
- ▶ Measurement setup optimization.
- ▶ Exploit as much as possible the information from leakages.

# Ingredients for (close-to) worst-case evaluations

---

Evaluator benefits from open-source (during profiling/learning):

- ▶ Knowledge of the source code.
- ▶ Knowledge of the randomness  $\mathcal{R}$ .
- ▶ Measurement setup optimization.
- ▶ Exploit as much as possible the information from leakages.

Why profiling with  $\mathcal{R}$ ?

- ▶ Simpler profiling and easier interpretation.
- ▶ Provide design guidelines.

# Ingredients for (close-to) worst-case evaluations

Evaluator benefits from open-source (during profiling/learning):

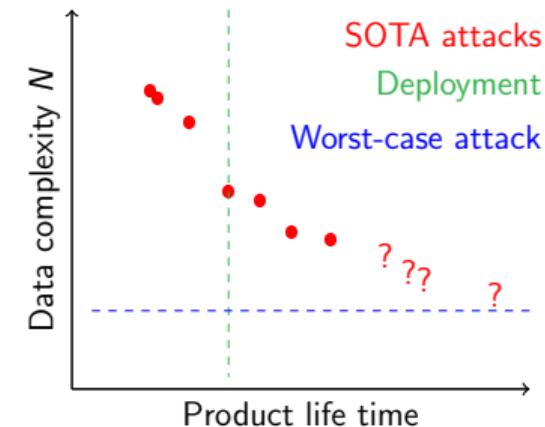
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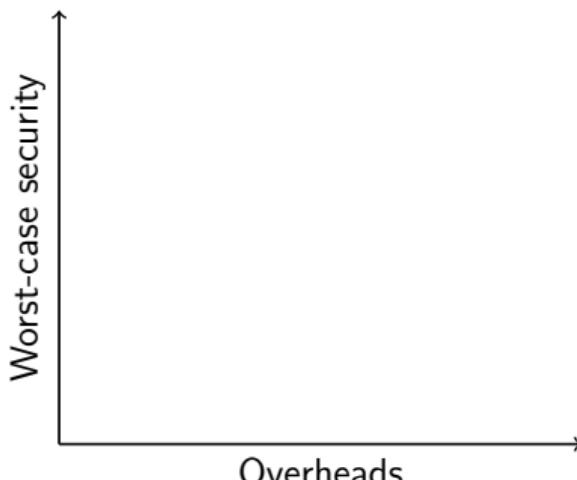
Why worst considering ?

- ▶ Short term: gap vs profiling w/o  $\mathcal{R}$ .
- ▶ Long term: gap expected to vanish.



# Part III: goal of designer

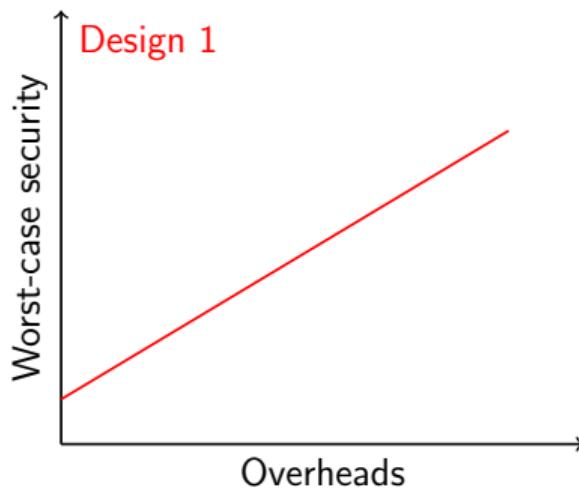
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How to compare (secure) implementations?

- ▶ Security vs. performance curves.

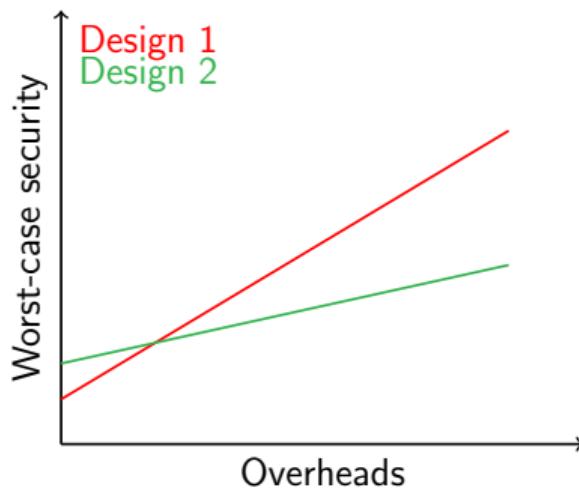
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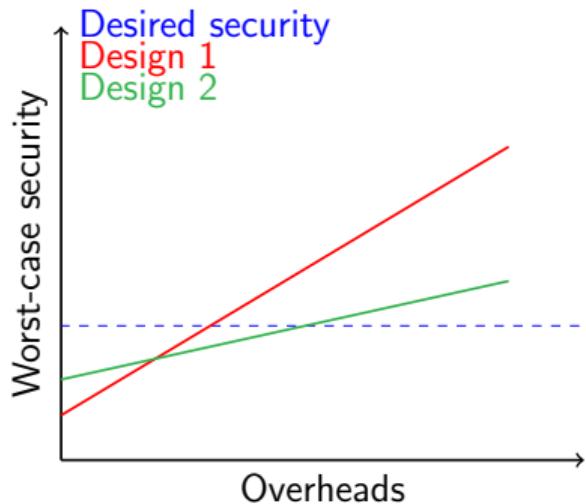
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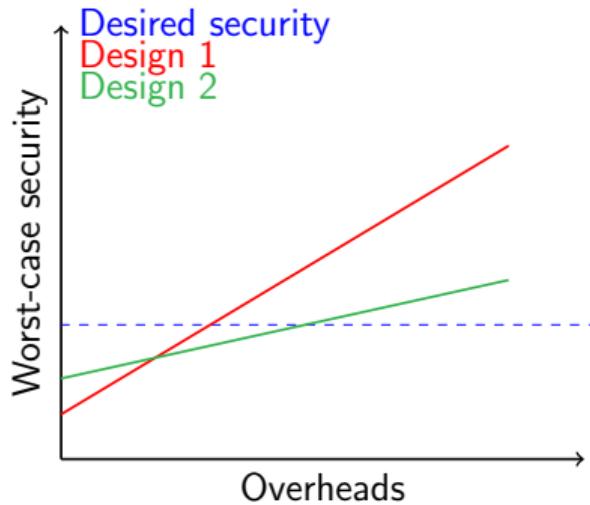
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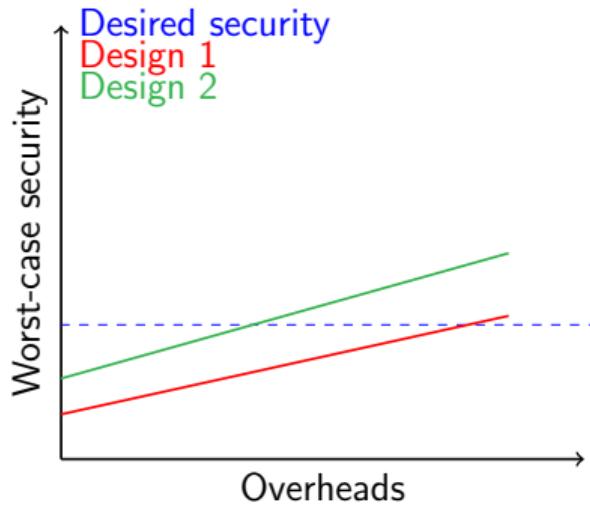
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### Challenges:

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- ▶ What platform / context ?

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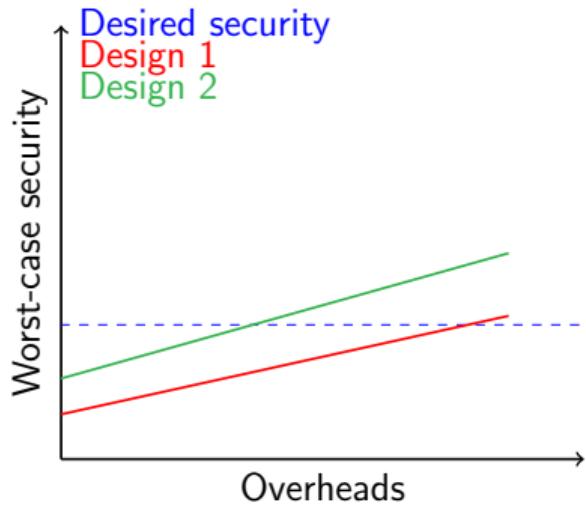
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## How & When to combine countermeasures ?

# Content

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Ma thèse en quelques mots

Technical introduction

Evaluations

Proof-based

Attack-based

New designs

Conclusion

# Proof-based: general principle

(Part I)

Masking countermeasure requires:

1. **Independence**: ensures  $d$ .
2. **Noise**: small enough MI.

$$N \geq \frac{c}{\text{MI}(X_i; L)^d}$$

Data complexity      Information per share      Number of shares

```
graph TD; A[Data complexity] --> c[c]; B[Information per share] --> d[MI(X_i; L)^d]; C[Number of shares] --> d;
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# Proof-based: general principle

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Proof-based evaluation:

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2. **Information estimation**: ensures small MI.
3. Estimation of attack complexity  $N$ .

# Proof-based: independence

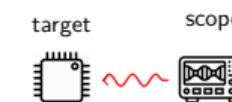
(Chap. 3)

Leakage detection:

- ▶ Test for independence between statistical order of the leakage and secret data.

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# Proof-based: independence

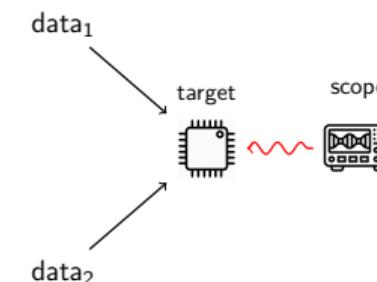
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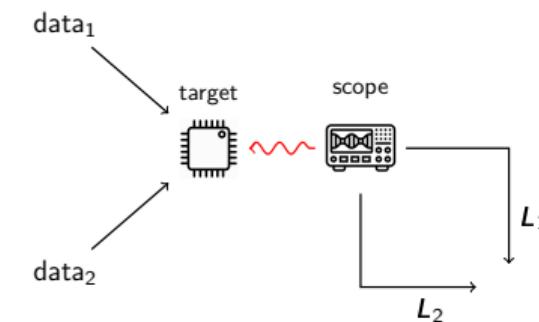
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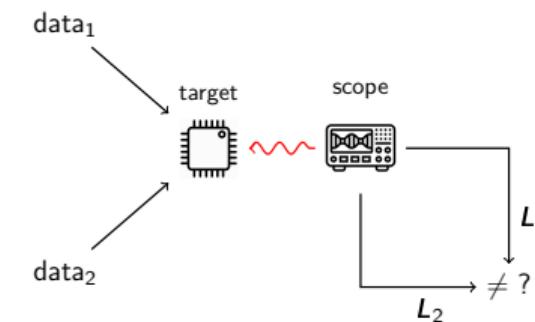
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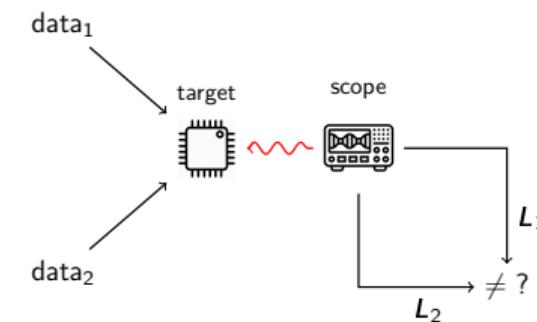
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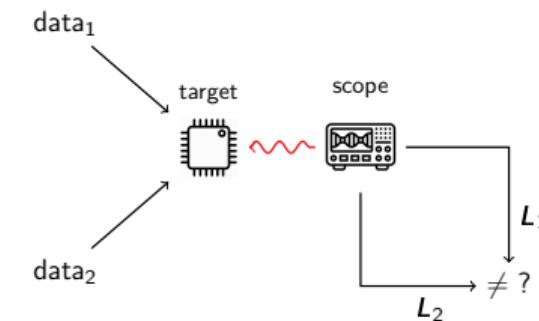
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Contribution:

- ▶ Multivariate statistical tests:
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  - + Better control of false negative.



# Proof-based: independence

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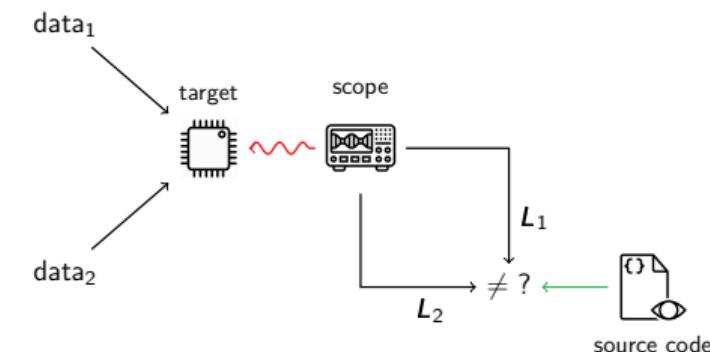
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Contribution:

- ▶ Multivariate statistical tests:
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  - + Better control of false negative.
- ▶ Knowledge of source useful.



# Proof-based: noise quantification

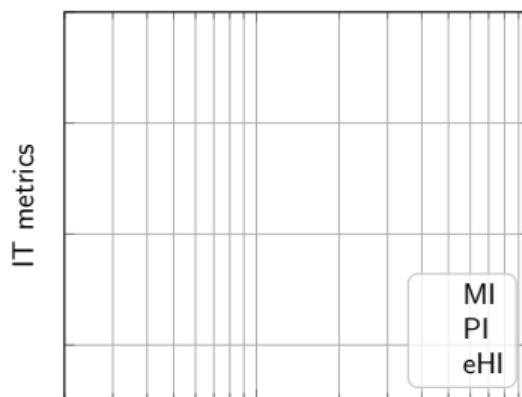
(Chap. 4)

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THEOREM

$\geq$

Data complexity  
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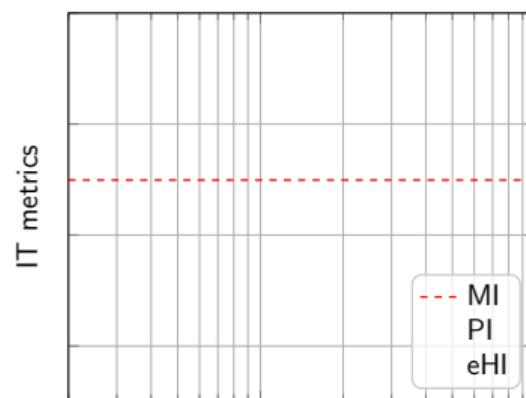
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Data complexity      Number of shares  
 Information per share

## THEOREM

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# Proof-based: noise quantification

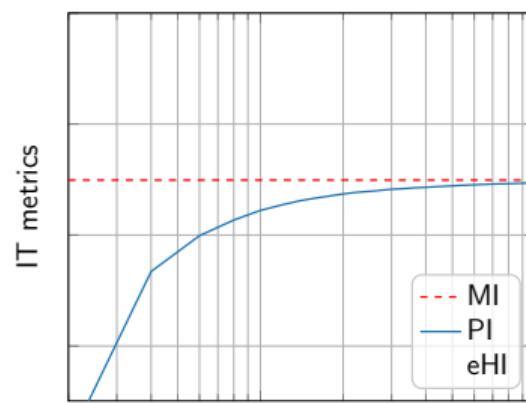
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Data complexity      Number of shares  
 ↓                      ↓  
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## THEOREM

$$\geq \text{MI}(X_i; L) \geq \text{PI}(X_i; L)$$



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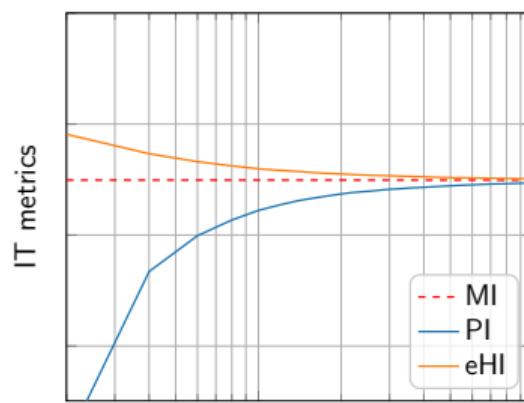
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$$\text{eHI}(X_i; L) \geq \text{MI}(X_i; L) \geq \text{PI}(X_i; L)$$



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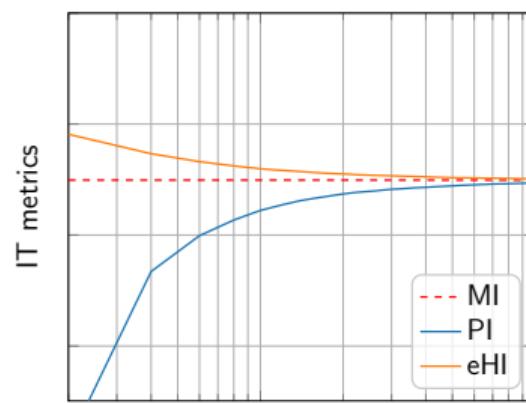
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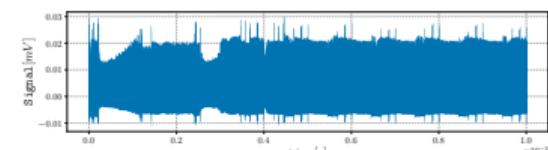
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# Attack-based: General profiling methodology (Part II)

Goal:

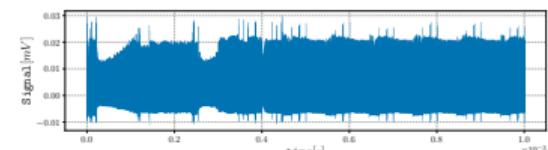
- ▶ Learn leakage distribution for secret  $x$ .



# Attack-based: General profiling methodology (Part II)

Goal:

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How ?

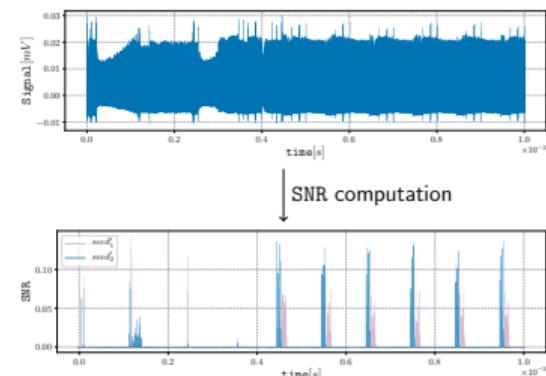
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Goal:

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How ?

1. Compute SNR for variable  $x$ .



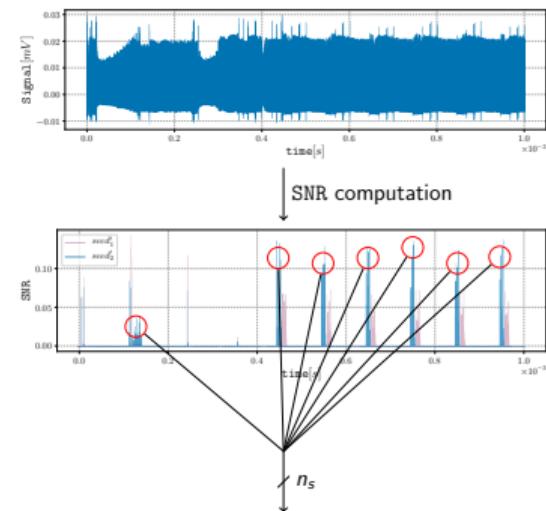
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# Attack-based: General profiling methodology

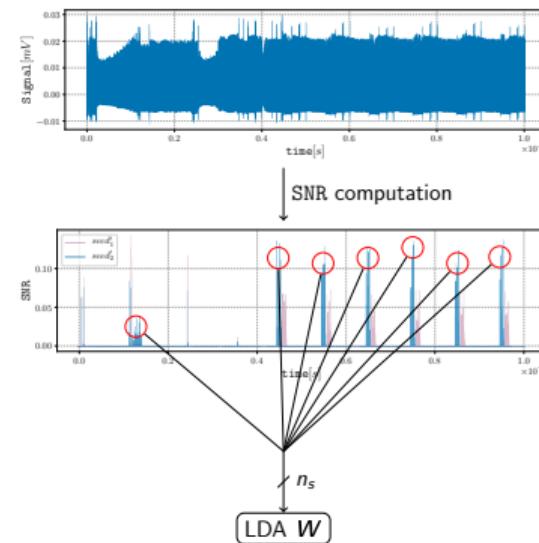
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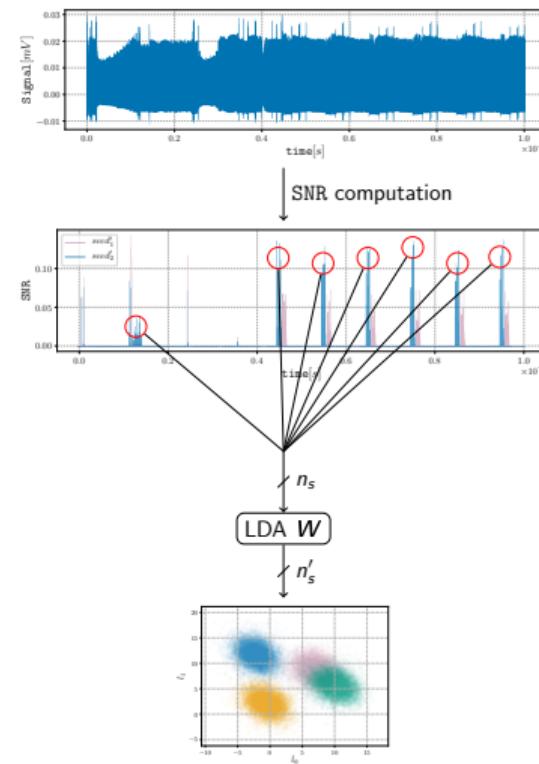
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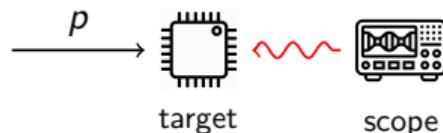
How ?

1. Compute SNR for variable  $x$ .
2. Extract Point-of-Interests (POIs).
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4. Approximate distributions with Gaussian assumption.



# Attack-based: General attack methodology

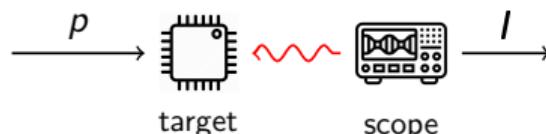
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How ?

# Attack-based: General attack methodology

(Part II)



How ?

1. Record traces  $I$ .

# Attack-based: General attack methodology

(Part II)

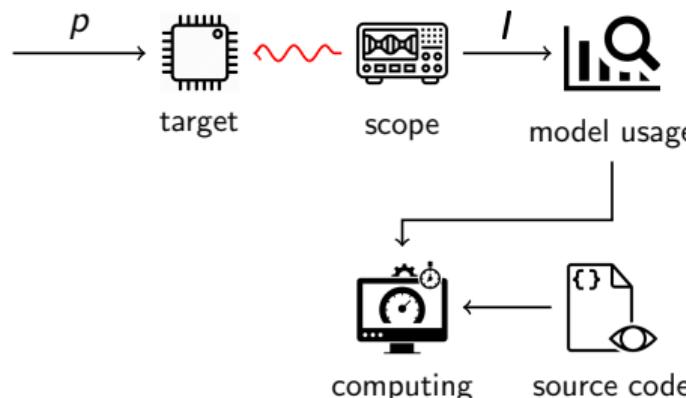


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1. Record traces  $I$ .
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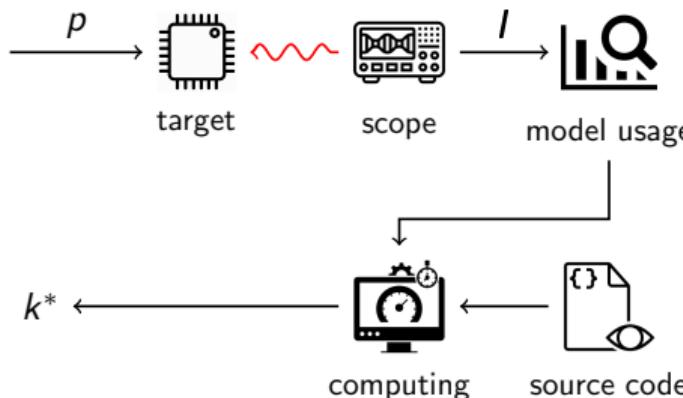


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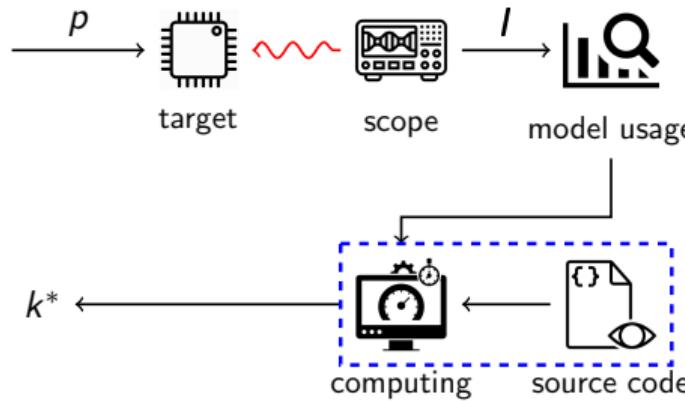


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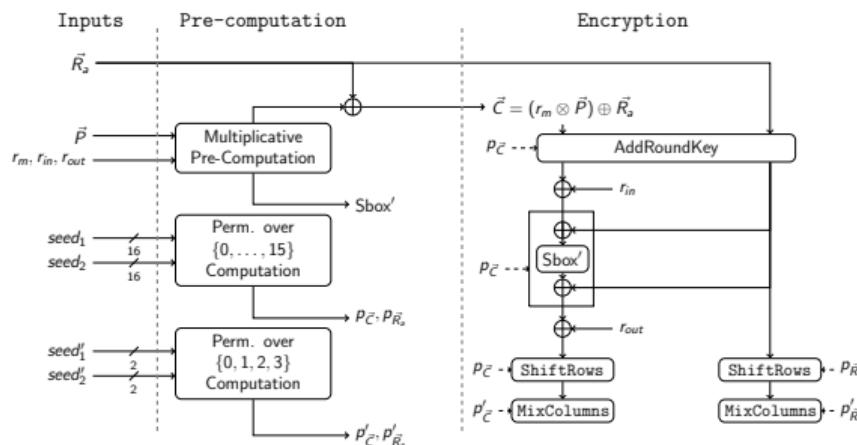
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Efficient processing requires:

- ▶ Trade-off between information exploitation and computational cost.
- ▶ Careful case-specific analysis.

# Attack-based: ANSSI's AES (32-bit MCU)

(Chap. 6)

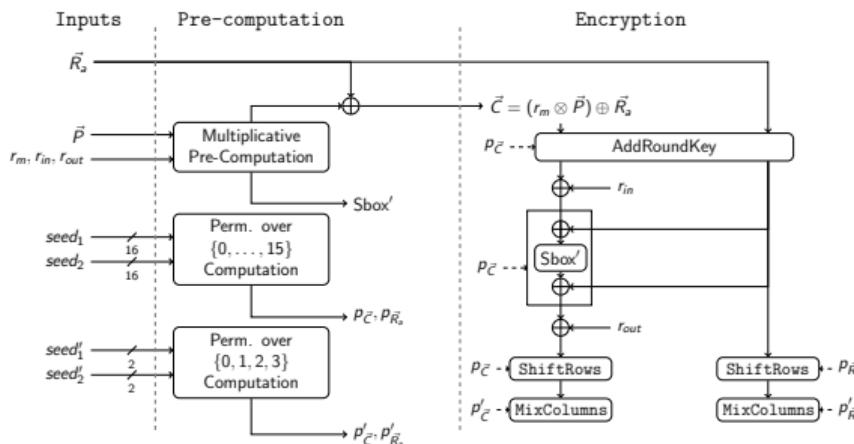


Implementation has:

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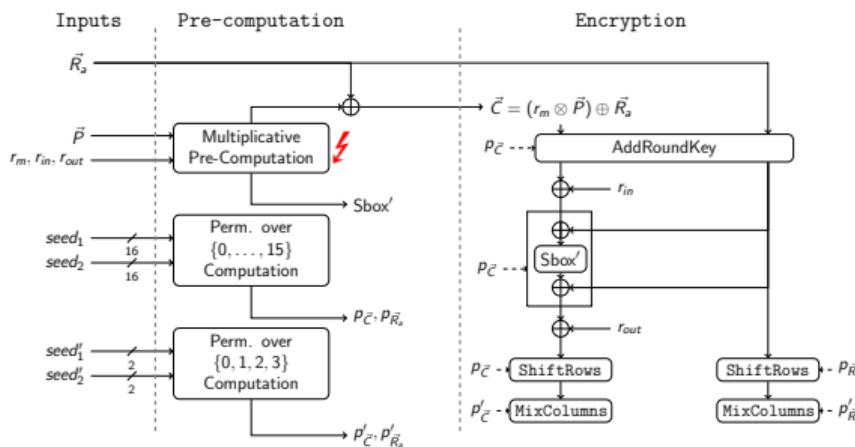
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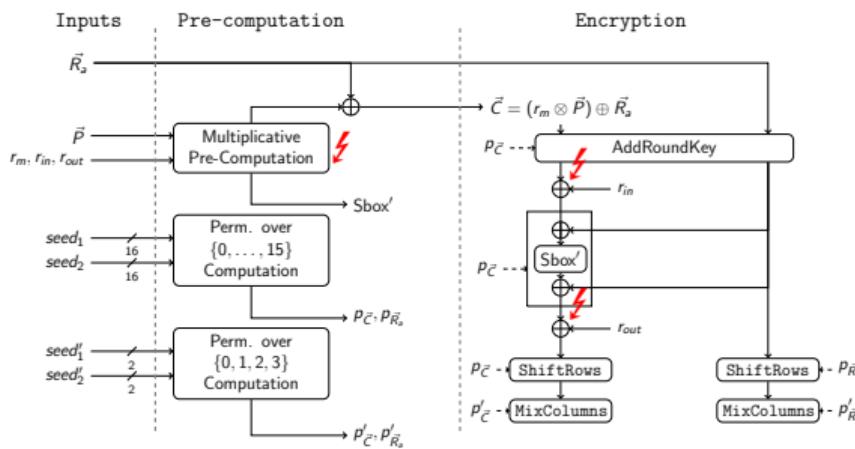
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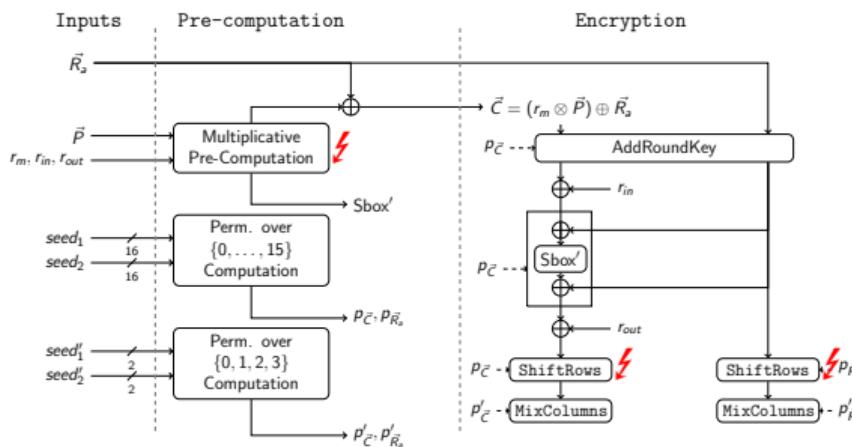
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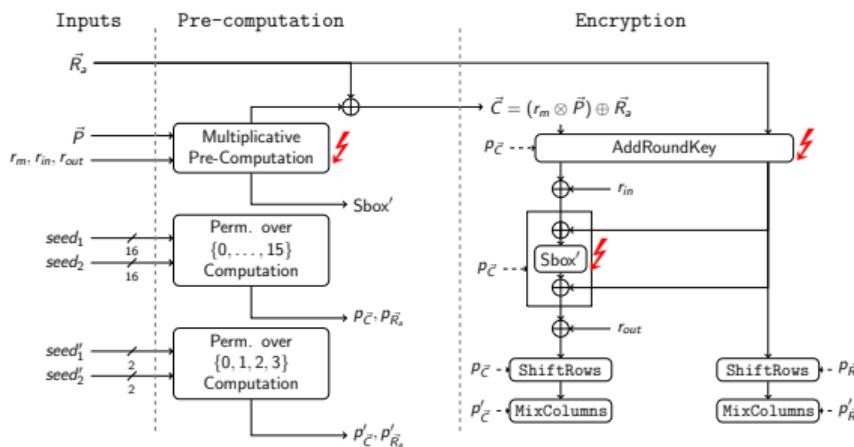
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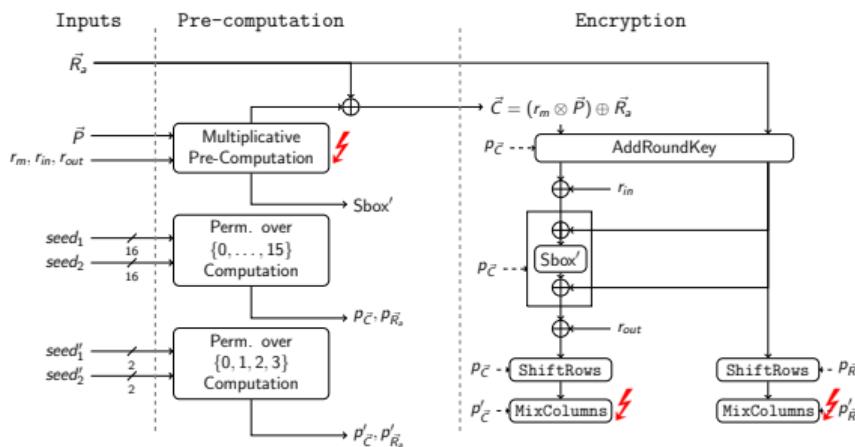
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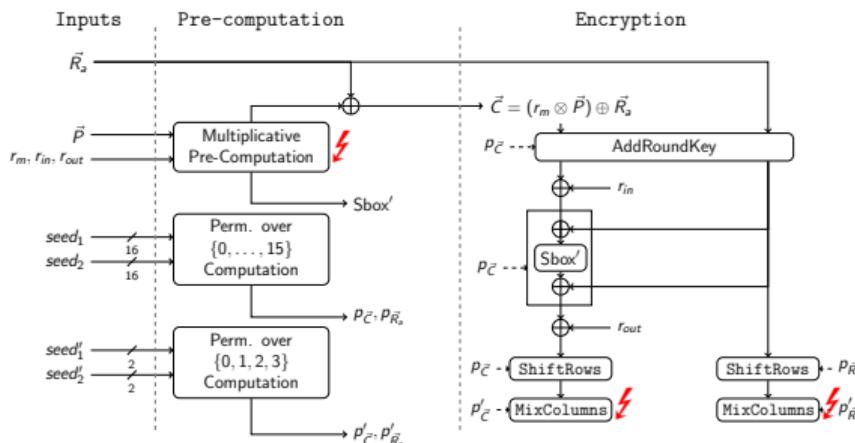
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Summary of the results:

- ▶ (Close-to) worst-case attacks succeed in less than 1,000 traces.
- ▶ No known attacks in black-box settings.
- ▶ Low noise on 32-bit software.

# Attack-based: Bitslice masking (32-bit MCU) (Chap. 7)

---

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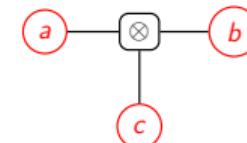
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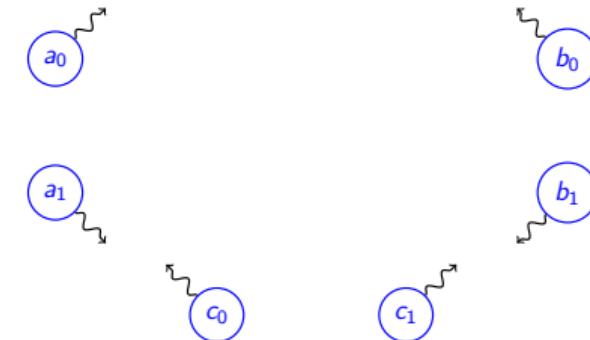
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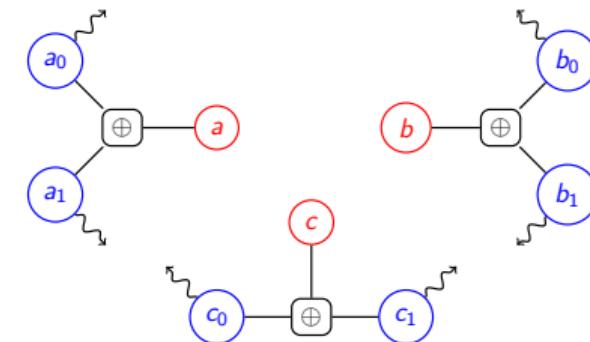
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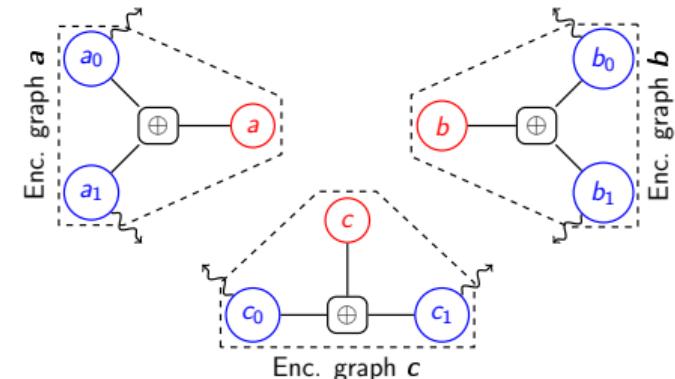
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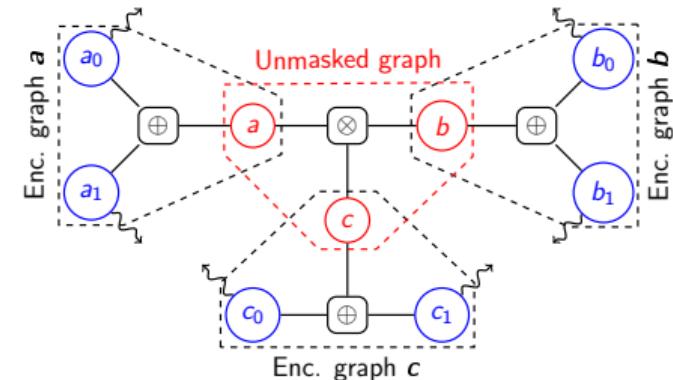
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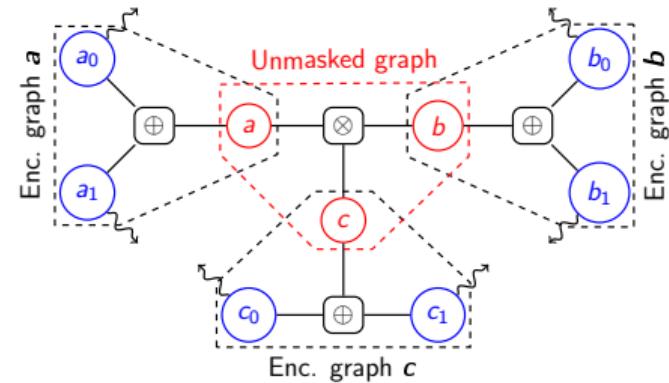
(Chap. 7)

Implementation has:

- ▶ Bitslice boolean masking with large  $d$ .

Contributions:

- ▶ Using SASCA.
- ▶ With dedicated factor graphs.
- ▶ Reducing computational complexity.



Summary of the results:

- ▶ Able to break 8 shares versions of lightweight ciphers.
- ▶ Low noise on 32-bit software.

# Attack-based: ASCAD (8-bit MCU)

(Chap. 5)

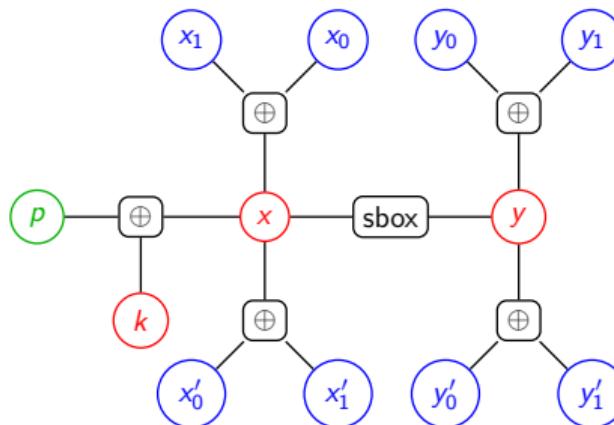
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Implementation has:

- ▶ 2-shares table-based boolean masking.
- ▶ 8-bit MCU.

# Attack-based: ASCAD (8-bit MCU)

(Chap. 5)



Implementation has:

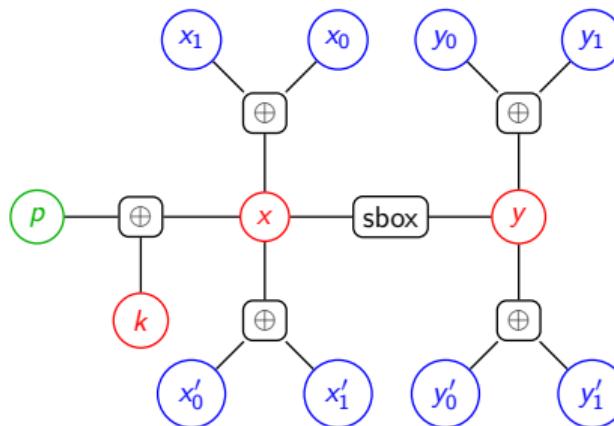
- ▶ 2-shares table-based boolean masking.
- ▶ 8-bit MCU.

Tricks:

- ▶ Same as for bitslice masked software.
- ▶ Exploiting full leakage traces.

# Attack-based: ASCAD (8-bit MCU)

(Chap. 5)



Implementation has:

- ▶ 2-shares table-based boolean masking.
- ▶ 8-bit MCU.

Tricks:

- ▶ Same as for bitslice masked software.
- ▶ Exploiting full leakage traces.

Results summary:

- ▶ Recover full key with a single (raw) trace.
- ▶ Thanks to  $\mathcal{R}$ : Better offline & online attack performances.

# SCALib: an open-source library<sup>1</sup>

(Part II)

## Welcome to SCALib

[pypi package](#) 0.3.3 [docs](#) passing

The Side-Channel Analysis Library (SCALib) is a Python package that contains state-of-the-art tools for side-channel evaluation. It focuses on providing efficient implementations of analysis methods widely used by the side-channel community and maintaining a flexible and simple interface.

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<sup>1</sup>Developped with Gaëtan Cassiers

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The Side-Channel Analysis Library (SCALib) is a Python package that contains state-of-the-art tools for side-channel evaluation. It focuses on providing efficient implementations of analysis methods widely used by the side-channel community and maintaining a flexible and simple interface.

## What is SCALib?

- ▶ Python: `pip install scalib`.
- ▶ Multiple tools for SCA.
- ▶ Optimized for single / multiple thread(s) (Rust back-end).

---

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(Part II)

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### What is SCALib?

- ▶ Python: pip install scalib.
- ▶ Multiple tools for SCA.
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### Developed for this thesis to:

- ▶ Signal-to-Noise Ratio (SNR).
- ▶ Build LDA + Gaussian templates.
- ▶ SASCA.
- ▶ Key rank estimation.

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<sup>1</sup>Developed with Gaëtan Cassiers

# Content

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Ma thèse en quelques mots

Technical introduction

Evaluations

Proof-based

Attack-based

New designs

Conclusion

# How to masking + shuffling ? ( $d = 2, \eta = 3$ ) (Part III)

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$\widehat{a^0}$     $\widehat{b^0}$     $\widehat{c^0}$

$\underline{a^1}$     $\underline{b^1}$     $\underline{c^1}$

# How to masking + shuffling ? ( $d = 2, \eta = 3$ ) (Part III)

$\widehat{a^0} \quad \widehat{\phantom{a}} \quad \widehat{\phantom{a}} \quad \# \text{ random perm:0}$

$\widehat{\phantom{a}} \quad \widehat{\phantom{a}} \quad \widehat{\phantom{a}} \quad \theta : [ \begin{array}{ccc} 0 & 1 & 2 \end{array} ]$

No shuffling:

- ▶ Access shares sequentially.
- ▶ Security:  $\mathcal{O}(\frac{1}{\text{MI}^d})$

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$$\underbrace{a^1}_{} \quad \underbrace{b^1}_{} \quad \underbrace{c^1}_{} \quad \theta : [ \begin{array}{ccc} 0 & 1 & 2 \end{array} ]$$

► Security:  $\mathcal{O}(\frac{1}{M!d})$

$\widehat{a^0}$     $\widehat{b^0}$     $\widehat{c^0}$    # random perm:1

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► Security:  $\mathcal{O}(\frac{\eta}{M^{1/d}})$

) ) ) # random perm: d

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$$\theta : [$$

# How to masking + shuffling ? ( $d = 2, \eta = 3$ )

(Part III)

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(Part III)

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$\widehat{a^0}$     $\widehat{b^0}$     $\widehat{c^0}$    # random perm:0

No shuffling:

- ▶ Access shares sequentially.
  - ▶ Security:  $\mathcal{O}(\frac{1}{\text{MI}^d})$
- 

$\widehat{a^1}$     $\widehat{b^1}$     $\widehat{c^1}$     $\theta : [ \begin{array}{ccc} 0 & 1 & 2 \end{array} ]$

$\widehat{a^0}$     $\widehat{b^0}$     $\widehat{c^0}$    # random perm:1

Shuffling tuples:

- ▶ Access tuples randomly.
  - ▶ Security:  $\mathcal{O}(\frac{\eta}{\text{MI}^d})$
- 

$\widehat{a^1}$     $\widehat{b^1}$     $\widehat{c^1}$     $\theta : [ \begin{array}{ccc} 1 & 0 & 2 \end{array} ]$

$\widehat{a^0}$     $\widehat{b^0}$     $\widehat{c^0}$    # random perm:d

Shuffling shares:

- ▶ Access  $i$ -th shares randomly.
- ▶ Security:  $\mathcal{O}(\frac{\eta^d}{\text{MI}^d})$

$\widehat{a^1}$     $\widehat{b^1}$     $\widehat{c^1}$     $\theta : [ \begin{array}{ccc} 1 & 2 & 0 \end{array} ]$

# Exploring design space: when to mask+shuffle ? (Part III)

---

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Explored parameters:

- ▶ MI: per share.
- ▶ #AND: Number of bits to protect.
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Cycles vs. security comparison:

- ▶ For  $r$ , #AND and MI.
- ▶ ■: masking is faster.
- ▶ □: masking + shuffling is faster.

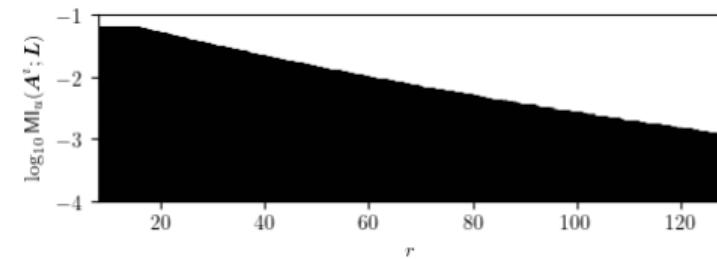


Figure: #AND=128

# Exploring design space: when to mask+shuffle ? (Part III)

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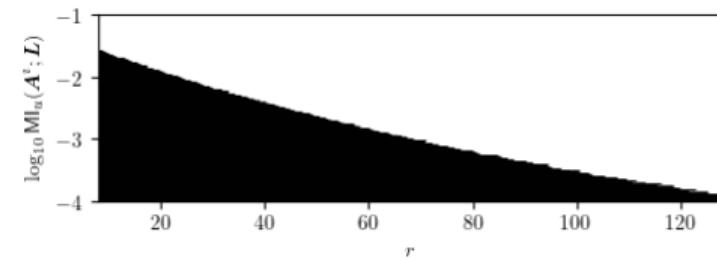


Figure: #AND=256

# Exploring design space: when to mask+shuffle ? (Part III)

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- ▶ MI: per share.
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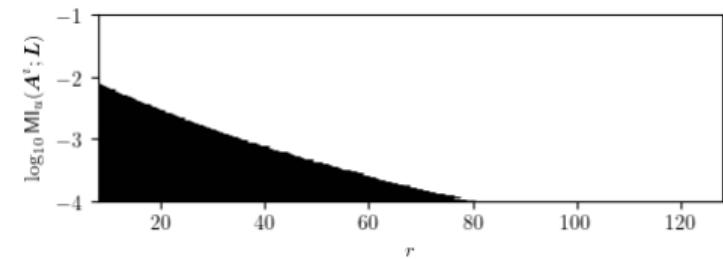


Figure: #AND=512

# Exploring design space: when to mask+shuffle ? (Part III)

Explored parameters:

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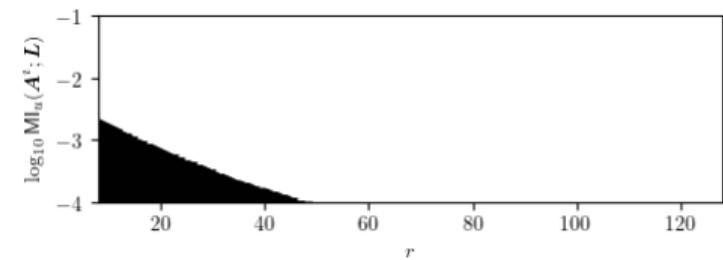


Figure: #AND=1024

# Exploring design space: when to mask+shuffle ? (Part III)

Explored parameters:

- ▶ MI: per share.
- ▶ #AND: Number of bits to protect.
- ▶  $b_s$ : bitslicing size.
- ▶  $r$ : randomness cost.

Trends for shuffling + masking:

- + large #AND.
- + expensive randomness  $r$ .
- large noise.

Cycles vs. security comparison:

- ▶ For  $r$ , #AND and MI.
- ▶ ■: masking is faster.
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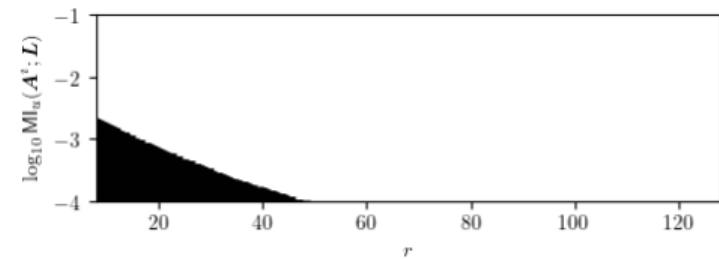


Figure: #AND=1024

# Content

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Ma thèse en quelques mots

Technical introduction

Evaluations

Proof-based

Attack-based

New designs

Conclusion

# Content of the thesis

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Three parts answering different questions:

# Content of the thesis

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► **Part I: Proof-based evaluations**

- How to improve leakage detection in open-source ?
- How to estimate noise / information ?

Evaluation

# Content of the thesis

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Three parts answering different questions:

▶ **Part I: Proof-based evaluations**

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- ▶ How to ease evaluation software implementations ?
- ▶ What is the security of current implementations ?

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- ▶ How to combine countermeasures ?
- ▶ Is it effective / useful ? In what context ?

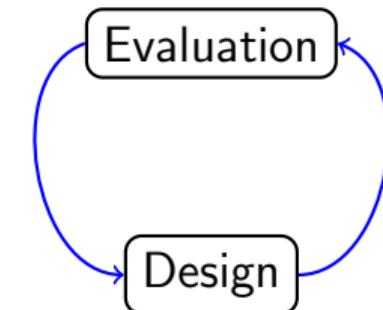
Design

# Content of the thesis

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Three parts answering different questions:

- ▶ **Part I: Proof-based evaluations**
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Both **evaluation** & **design** are linked.

# Conclusion

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Takeaways for the field:

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  - ▶ Hard to have effective countermeasures.
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  - ▶ Amortizing cost of masking at the mode level.
  - ▶ Based on SPA security.

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  - ▶ Ease multivariate quantified security analysis.
  - ▶ Better reflecting actual SCA security in countermeasure papers.

# Conclusion

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Thanks!

SCALib sources: <https://github.com/simple-crypto/SCALib>

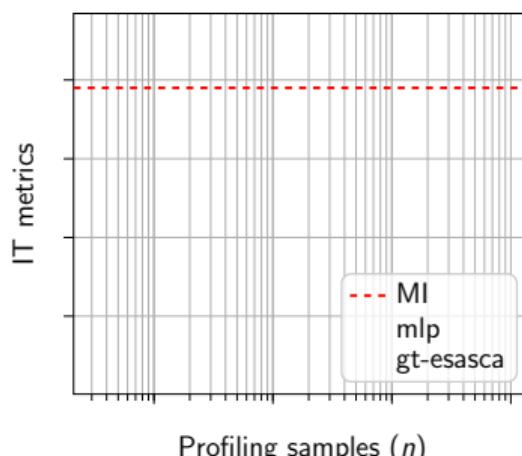
SCALib documentation: <https://scalib.readthedocs.io/en/latest/>

CTF2020 Attacks: [https://github.com/obronchain/BS21\\_ches2020CTF](https://github.com/obronchain/BS21_ches2020CTF)

# Backup slides

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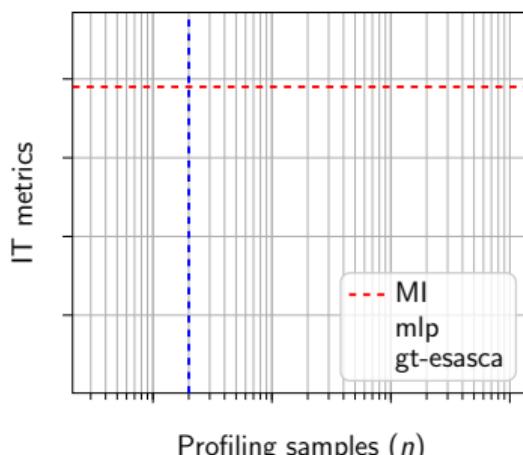
# Attack-based: How to compare adv. ( $f_1$ vs. $f_2$ )? (Chap. 5)



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## Profiling complexity:

$$\text{PI}_n^{f_1} \leq \text{PI}_n^{f_2}$$



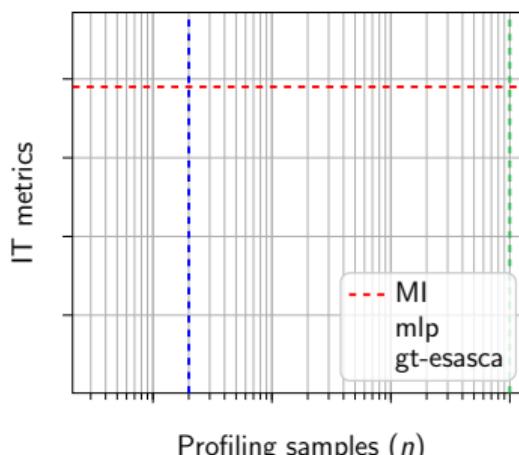
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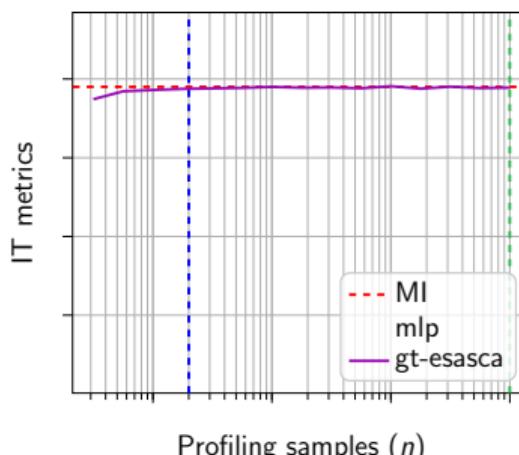
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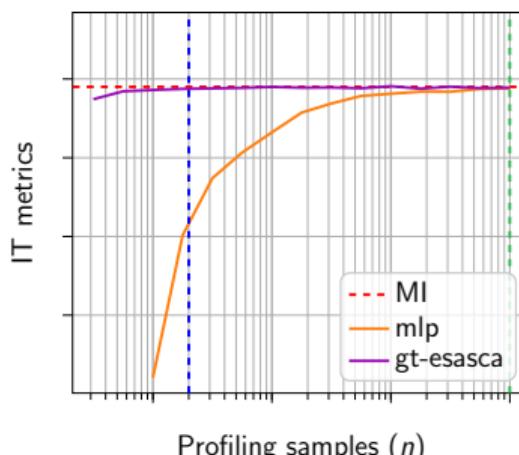
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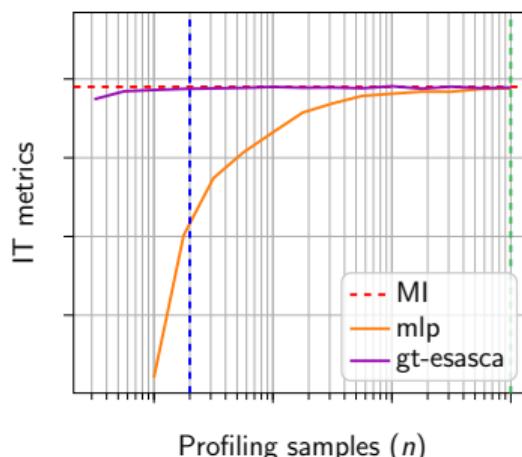
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Close-to worst-case attacks:

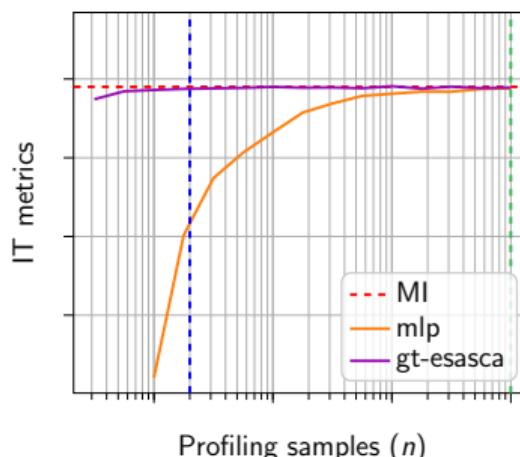
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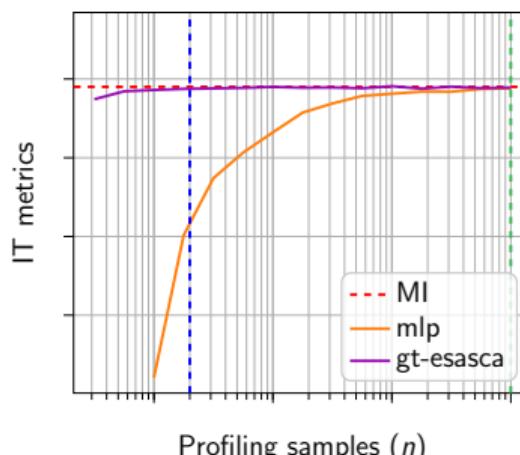
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Close-to worst-case attacks:

- ▶  $\text{PI}_n^{\text{mlp}} \leq \text{PI}_n^{\text{gt-esasca}}$ .
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