



# An Algebraic Approach for Evaluating Random Probing Security With Application to AES

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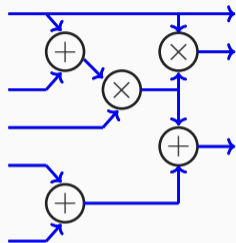
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# Random Probing Model

- Typical side-channel attacks target a **single** sensitive variable.
- Advanced attacks combine leakages of **multiple** variables.
- The Random Probing Model (RPM) considers leakages of **all** variables.

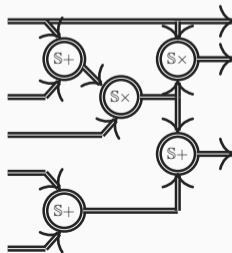
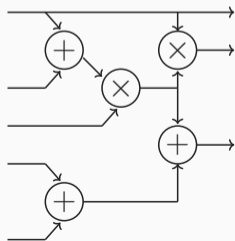


## Random Probing Model

In this leakage model, each variable of the (protected) circuit leaks independently with a fixed probability  $p$ .

Masking circuit  $C$  includes the following three steps.

- **Native** inputs are  $n$ -shared, which is for a variable  $v$  to encode it with a random  $n$ -tuple as  $V = (v_1, \dots, v_n)$  such that  $\bigoplus_{i=1}^n v_i = v$ .
- **Gates** are replaced with **gadgets**. Gadgets work on  $n$ -sharings. For a gate  $G$ , we denote the corresponding gadget with  $\mathbb{S}G$ .
- To maintain security, a **refresh gadget** may be inserted at some gadget's input (or output) interface.



Maximum A posteriori Probability (MAP) decision for the value of native  $v \in \mathbb{F}_q$  given RPM leakage  $\mathcal{L}(n, p)$  is

$$\tilde{v} = \operatorname{argmax}_{\alpha \in \mathbb{F}_q} \Pr(v = \alpha \mid \mathcal{L}(n, p)).$$

We define the advantage of the adversary over random guessing as

$$\operatorname{Adv}_v(n, p) \triangleq \Pr(\tilde{v} = v) - \frac{1}{q}.$$

### RPM Security

A circuit family  $\mathbb{SC}$  that processes a native variable  $v$  is secure in the RPM framework if there exists a threshold  $p^o$  such that, given leakage  $\mathcal{L}(n, p)$  with  $p \leq p^o$ ,  $\operatorname{Adv}_v(n, p)$  monotonically decreases to 0 as  $n$  increases.

**We develop a framework to estimate  $\text{Adv}(n, p)$  for various gadgets and circuits.**

Open Challenges in the RPM:

- For typical masked circuits, security holds only if  $p$  decreases as  $n$  increases.
- In some works, derivation of security bound requires **leak-free** refresh gadget.
- Derived security bound usually depends on the **complexity** of  $\mathbb{S}C$ .

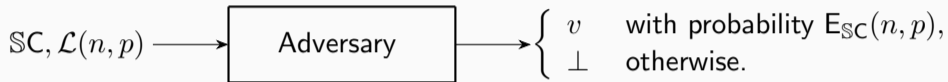
Expansion Method (State-of-the-Art Approach):

- Works by iteratively masking the circuit:

$$C \longrightarrow \mathbb{S}C \longrightarrow \mathbb{S}(\mathbb{S}C) \longrightarrow \mathbb{S}(\mathbb{S}(\mathbb{S}C)) \longrightarrow \dots$$

- It can create a circuit secure at constant  $p$  (independent of  $n$ ) leakage.
- It adds too much to the complexity of the final protected circuit.

- **Linear circuit**  $\mathbb{S}\mathbb{C}$  acts as an **erasure channel** with parameter  $E_{\mathbb{S}\mathbb{C}}(n, p)$ .



**Figure:** Erasure channel models leakage of linear circuit processing native  $v$ .

### Relation of the Metrics

When the adversary learns nothing, it still has the opportunity to guess the value of  $v$ . Therefore, we have:

$$\text{Adv}_v(n, p) = E_{\mathbb{S}\mathbb{C}}(n, p) + \frac{1}{q}[1 - E_{\mathbb{S}\mathbb{C}}(n, p)] - \frac{1}{q} = \frac{q-1}{q}E_{\mathbb{S}\mathbb{C}}(n, p).$$

## Estimating $E_{\mathbb{S}\mathbb{C}}(n, p)$ (1/3)

We deploy a Monte Carlo approach to **estimate**  $E_{\mathbb{S}\mathbb{C}}(n, p)$ .

- For each  $n$ , there is matrix  $\mathbf{P}_n$  such that

$$\mathbf{P}_n \cdot [v, \Sigma_{\mathbb{S}\mathbb{C}}]^\top = \mathbf{0},$$

where  $\Sigma_{\mathbb{S}\mathbb{C}}$  is the list of intermediates of  $\mathbb{S}\mathbb{C}$ .

- The rows of  $\mathbf{P}_n$  are **linearly independent**.
- With substituting leakage  $L$ , this system of equations transforms into:

$$\mathbf{P}_n^r \cdot [v, \Sigma_{\mathbb{S}\mathbb{C}}]^\top = \mathbf{b},$$

with some known vector  $\mathbf{b}$ .

- By finding the set of solutions, the adversary can estimate the value of  $v$ .

- The system

$$\mathbf{P}_n^r \cdot [v, \Sigma_{\text{SC}}]^\top = \mathbf{b},$$

by computing the **row-echelon form**, transforms into

$$\mathbf{G} \cdot [v, \Sigma_{\text{SC}}]^\top = \mathbf{c}.$$

- Since it is in a finite field, it has bounded amount of solutions.
- $v$  is always a **pivot** variable in  $\mathbf{G}$ .
- **This system either uniquely determines  $v$  or gives no information about it.**
- This behavior is determined by the structure of the row containing  $v$ .
- And is independent of  $\mathbf{b}$ . Hence, it is independent of leakage values.



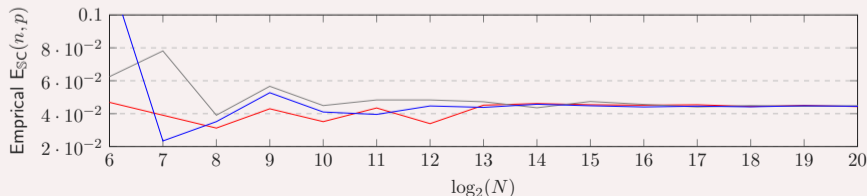
## Estimating $E_{\text{SC}}(n, p)$ (3/3)

Each instance of leakage  $L$  will result in a new matrix  $\mathbf{G}$ . By placing  $v$  in the first column if the first row of  $\mathbf{G}$  has no **free** variables,  $v$  will be determined. Therefore, we have the following equality:

$$E_{\text{SC}}(n, p) = \Pr_{L \leftarrow \mathcal{L}(n, p)} [\mathbf{G}(1, 2 : \text{end}) = \mathbf{0}].$$

### Monte Carlo Method

To estimate the probability of an event  $e$ , the Monte Carlo method repeats the procedure  $N$  times, records the number of times  $e$  occurs, and returns  $N_e/N$ . As  $N$  increases, the error of estimation decreases.

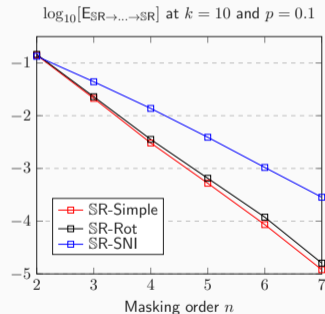


## Alternative Way of Reporting the Results

- We can derive a 2D **table** of estimations (one entry for each targeted  $(n, p)$ ).
- This limits the **applicability** of the results in more sophisticated **compositions**.
- For typical gadgets, estimated  $E_{\text{SC}}(n, p)$  **decays exponentially** with  $n$ .



**Figure:** Multiple gadgets cascaded.



- Therefore, we try to express estimations as  $E_{\text{SC}}(n, p) < \alpha(\beta p)^{\gamma n}$  for some  $\alpha$ ,  $\beta$ , and  $\gamma < 1$  constants. This expression might not hold out of the tested region.

- **Refresh gadget**  $\mathbb{S}\mathbb{R}$  can help to **decompose RPM security** of a compound circuit to the RPM security of the composing gadgets.



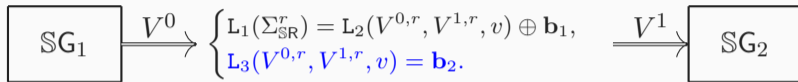
### RPM Composition Theorem

For a bounded region of  $p$  values, the gadgets, and hence the composition, behave as an erasure channel for which

$$E_{\mathbb{S}\mathbb{G}_1 \rightarrow \mathbb{S}\mathbb{R} \rightarrow \mathbb{S}\mathbb{G}_2}(n, p) \leq E_{\mathbb{S}\mathbb{G}_1}(n, p') + E_{\mathbb{S}\mathbb{R}}(n, p) + E_{\mathbb{S}\mathbb{G}_2}(n, p')$$

holds, where  $p' \geq p$  is a function of  $(n, p)$  and the structure of  $\mathbb{S}\mathbb{R}$ .

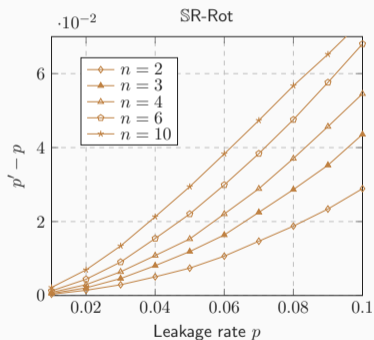
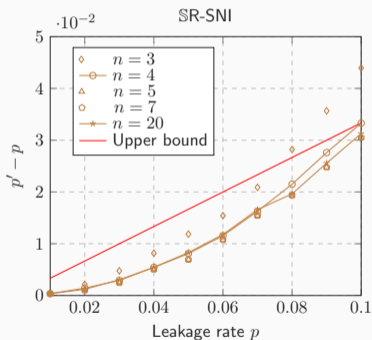
- Our main technique is to process parity relations inside  $\mathbb{S}R$  as follows:



**Figure:** Processing parity relations inside the refresh gadget.

- $L_1$ ,  $L_2$ , and  $L_3$  are linear relations. Superscript  $r$  denotes unknowns after substituting leakage,  $\mathbf{b}_1$  and  $\mathbf{b}_2$  are constant vectors.
- Equations in  $L_1$  are **independent**.
- The upper subsystem **has no impact** on the posterior distribution of native  $v$ .
- We let the adversary learn the remaining boundary unknowns of the **lower subsystem**.
- This is equivalent to some **extra leakage** on the input/output shares.

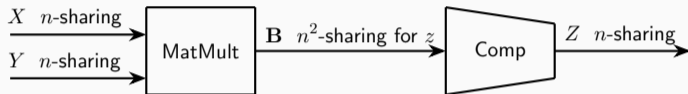
- For a SR-SNI refresh gadget, our numerical computations give an estimation as  $p' \approx p + \frac{1}{3}p$  for  $n \geq 3$  and  $p \leq 0.1$ .



- For the other tested SR gadget,  $p'$  is increasing with  $n$  for any  $p$ .

## Multiplication Gadgets (1/2)

- For **SAND gadgets**, we deploy **linearization** to derive a lower bound and upper bound on the adversary's post-leakage information.



**Figure:** Typical multiplication gadget.

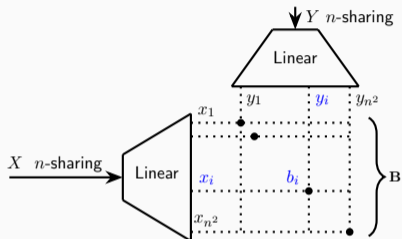
- If the compression block **Comp** behaves as a **refresh gadget**, we can use the **composition theorem** as:

$$E_{\text{MatMult} \rightarrow \text{Comp}}(n, p) \leq E_{\text{MatMult}}(n, p') + E_{\text{Comp}}(n, p).$$

Here,  $p'$  exceeds  $p$  and depends on the structure of **Comp**.

## Multiplication Gadgets (2/2)

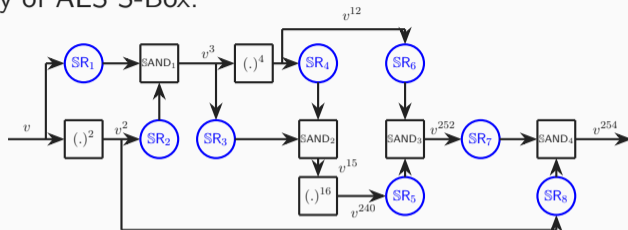
- MatMult is **non-linear**. The operations inside it can be arranged as follows.



- $b_i - x_i y_i = 0$  is the only non-linear relation.  $b_i$  is not involved in any parity equation other than this relation.
- If we ignore leakage of  $b_i$ , non-linear relations will disappear. This will reduce the advantage of the adversary. Hence, the derived bound, denoted  $E_{\text{MatMult}}^-(n, p)$ , will be a lower bound.
- If we force both  $x_i$  and  $y_i$  to leak on the leakage of  $b_i$ , we derive  $E_{\text{MatMult}}^+(n, p)$ .
- For SAND-Rec,  $E^+$  and  $E^-$  are **exponentially decaying** with  $n$  for  $p \leq 0.07$ .

## More Complex Circuits

The RPM security of AES S-Box.



### Security Bound

Using the composition theorem, we can derive the following bound:

$$E_{\text{SS-box}}(n, p) \leq 8E_{\text{SR}}(n, p) + 3E_{\text{SAND}}(n, p') + E_{\text{SAND}}(n, p'').$$

This bound directly depends on the complexity of the S-box.

- Unlike the bound for protected S-box, our security bound for the whole protected AES does not depend on the number of gates in AES.



- We defined a **metric** for RPM security and established a **framework** for evaluating it.
- We demonstrated **how to handle leakage of refresh gadgets**. This gives a **composition theorem**, which is inherent to RPM.
- Our work provides a clearer relationship between circuit complexity and RPM security.
- However, the final **numerical relations** are derived with **Monte Carlo** estimations.
- An interesting follow-up work would be to analytically sketch these probabilities and verify the estimations.

**Thank you for your attention!**