# A Block Cipher Based Pseudo Random Number Generator Secure against Side-Channel Key Recovery

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  - Issue : partial information on the SECRET is leaked by physical media
  - By recovering many pieces of partial info, one can recover the whole secret key

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  - Case Study : Pseudo-Random Number Generator (PRNG)

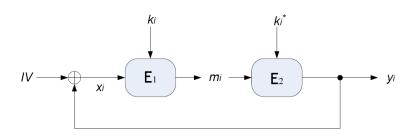
### Case Study: PRNG

- ▶ Black-Box security (BB) : PRNG
- Grey-Box security (GB): prevent traditional SC cryptanalysis

#### Talk Overview

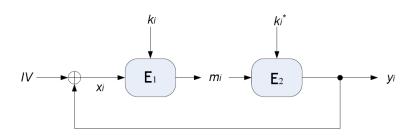
- ► Introduction
- PRNG
  - Construction
  - BB model & security
  - GB model & security
  - PRNG summary
- Conclusion and further work

#### Construction



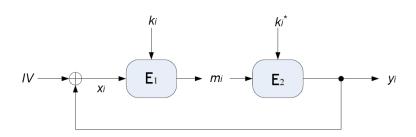
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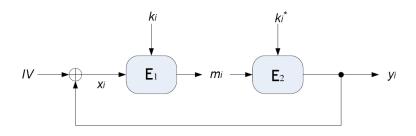
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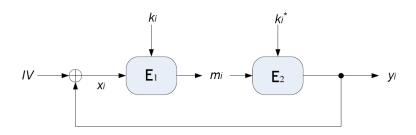
- (Public IV, secret keys)
- ▶ First idea (in BB): if  $E_1$  and  $E_2$  are "good", then the  $y_i$ 's should be PRNs.
- ▶ But (in GB) successive leakages allow recovering the whole secret.

#### The construction



• So key update :  $k_{i+1} = k_i \oplus m_i$  and  $k_{i+1}^* = k_i^* \oplus m_i$ 

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- ▶ Each running key  $k_i$ ,  $k_i^*$  is used to encrypt *only* one message.

- ▶ Ideal cipher model  $E : \mathcal{K} \times \mathcal{M} \rightarrow \mathcal{M}$ 
  - (Here  $\mathcal{K} = \mathcal{M}$ )
  - ▶ for each key  $k \in \mathcal{K}$ , the function  $\mathsf{E}_k(\cdot) = \mathsf{E}(k, \cdot)$  is a random permutation on  $\mathcal{M}$

- ► PRNG:
  - ▶ Deterministic algorithm  $G: \mathcal{K} \to \hat{\mathcal{K}}$  (with  $|\mathcal{K}| < |\hat{\mathcal{K}}|$ )

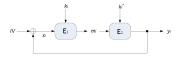
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$$\begin{split} & \textbf{Succ}_{\mathsf{G},\mathsf{A}}^{\mathrm{prng}-1} &= & \mathsf{Pr}[\mathsf{A}(\hat{k}) = 1 : \hat{k} \xleftarrow{R} \hat{\mathcal{K}}], \\ & \textbf{Succ}_{\mathsf{G},\mathsf{A}}^{\mathrm{prng}-0} &= & \mathsf{Pr}[\mathsf{A}(\hat{k}) = 1 : \hat{k} \leftarrow \mathsf{G}(k); k \xleftarrow{R} \mathcal{K}], \\ & \textbf{Adv}_{\mathsf{G},\mathsf{A}}^{\mathrm{prng}} &= & | \textbf{Succ}_{\mathsf{G},\mathsf{A}}^{\mathrm{prng}-1} - \textbf{Succ}_{\mathsf{G},\mathsf{A}}^{\mathrm{prng}-0} |. \end{split}$$

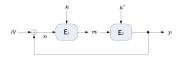
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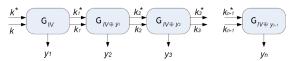
• G is a PRNG if for any A,  $\mathbf{Adv}_{\mathsf{G},\mathsf{A}}^{\mathsf{prng}} \approx 0$ .



► Proof: study security of one round and extend it to multiple rounds by "hybrid argument"



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► For each  $X \in \mathcal{M} = \mathcal{K}$ , let  $G_X : \mathcal{K} \times \mathcal{K} \to \mathcal{K} \times \mathcal{K} \times \mathcal{K}$  $G_X(\mathcal{K}, \mathcal{K}^*) = (E_{\mathcal{K}}(X) \oplus \mathcal{K}, E_{\mathcal{K}}(X) \oplus \mathcal{K}^*, E_{\mathcal{K}^*}(E_{\mathcal{K}}(X))).$ 

 Security of a single round By definition,

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  - ▶ If there is A such that  $\mathbf{Adv}^{\mathrm{pring}}_{\mathsf{G}^q,\mathsf{A}} > \epsilon$ , then there is A' such that  $\mathbf{Adv}^{\mathrm{pring}}_{\mathsf{G},\mathsf{A}'} > \frac{\epsilon}{q}$  for one of the rounds

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- Implementation = algorithm + (probabilistic) leakage function of the keys P<sup>q</sup>(K, K\*) = (G<sup>q</sup>(K, K\*), L<sup>q</sup>(K, K\*))
- We show the available information does not permit recovering the secret

Side-channel key recovery adversary

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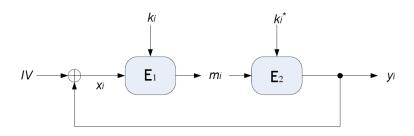
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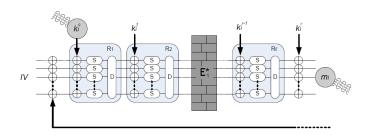
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• If  $\delta(K, K^*) = K_{[0\cdots 7]}$ 

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- Assumptions :
  - Fixed IV
  - ▶ Leakages on the  $m_i$ 's,  $k_i$ 's (and  $k_i^*$ 's)
  - ► Cannot be related but by the rekeying relations  $k_{i+1}^j = k_i^j \oplus m_i$





- Additional assumptions
  - ▶ Iterative BC, no key schedule
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  - ► Form of leakage functions : HW, GHW, NI

## Grey-Box Analysis

▶ With observed leakages  $I^q = \{L(k_i), L(m_i)\}$  and relations  $k_{i+1} = k_i \oplus m_i$ , the best guess is

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▶ Goal : show that SR remains small as q increases

# Hamming Weight Leakages

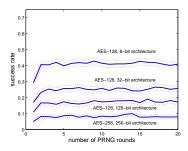
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- ► (relevant in power consumption measures)
- ▶ In this case we compute :  $Succ_{P^q(K,K^*),A}^{sc-kr-K_0} = \frac{n+1}{2^n}$
- ► High security, independently of *q*

## Noisy Identity Leakages

- ► Here the above formulae are hard to evaluate analytically
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  - 0.5

    AES-128, 8-bit architecture

    0.5

    AES-128, 32-bit architecture

    0.1

    AES-128, 32-bit architecture

    0.2

    AES-128, 32-bit architecture

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    AES-258, 256-bit architecture

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    0.2

    0.3

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• Succ<sub>AES256,A</sub>  $\simeq (0.08)^{32} = 2^{-116}$ 

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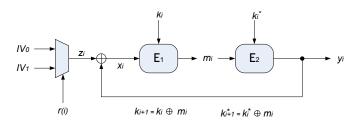
- ▶ BB : secure in the ideal cipher model
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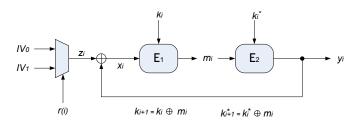
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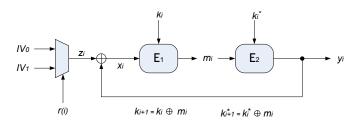
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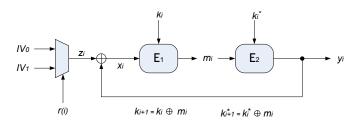
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- Need of theoretical framework for SC
  - unify BB and GB...
  - define physical primitives
  - compose primitives

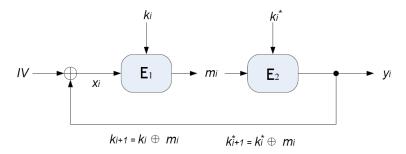


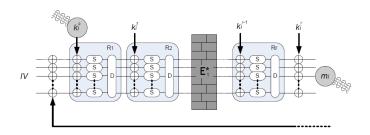






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  - ► Form of leakage functions : HW, GHW, NI
  - We suppose Bayesian adversary

# Discussion about Grey-Box assumptions

- Many assumptions
  - make the proofs cleaner...
  - ...but are not essential.
- ▶ Relaxations → same qualitative conclusions
  - ▶ key schedule  $\rightarrow$  adapt the leakage model  $L(k_i)$
  - targeting not only the first iteration of the PRNG
    - → may increase SR, but qualitative results remains