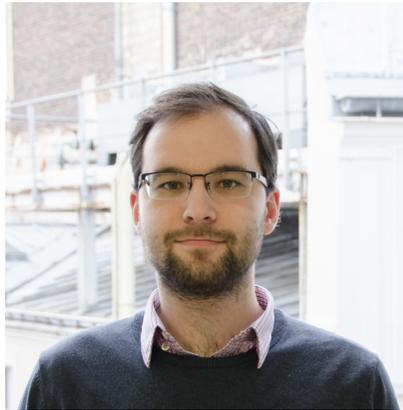


# Tutorial on white-box cryptography



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Rivain



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CHES 2022 Tutorial  
Leuven, 18 Sep. 2022

## Overview

- Introduction to white-box cryptography
  - ▶ *Presentation ~1h*
- Generating and attacking white-box implementations
  - ▶ *Practical tutorial ~2h*

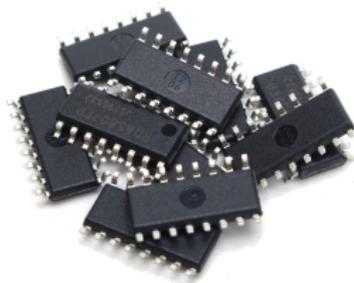
# Overview of the presentation

- White-box crypto context
- White-box crypto in theory
  - ▶ definitions & security notions
- White-box crypto in practice
  - ▶ early designs & breaks
  - ▶ gray-box attacks & countermeasures
  - ▶ WhibOx competitions

White-box crypto context

How to protect a cryptographic key?

# How to protect a cryptographic key?



Well, put it in a **smartcard** of course!  
... or any piece of **secure hardware**

# But...

- Secure hardware is **expensive** (production, integration, infrastructures...)
- Long lifecycle, limited updates
- Bugs, security flaws might occur
  - ▶ e.g. ROCA vulnerability (October 2017)



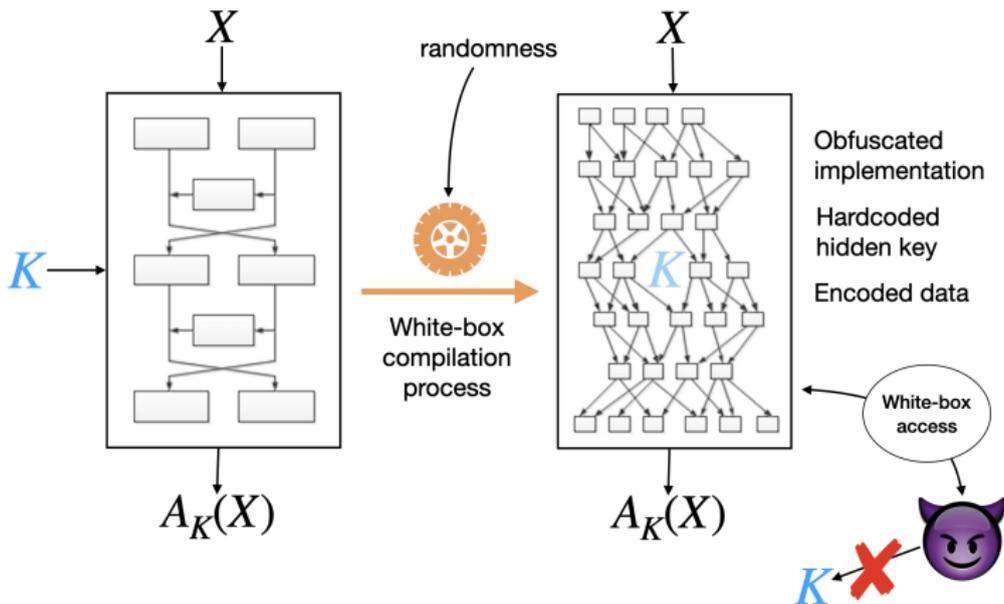


# Protecting keys in software?

- Potential threats:
  - ▶ malwares
  - ▶ co-hosted applications
  - ▶ users themselves
- White-box adversary model
  - ▶ full control of the execution environment
  - ▶ analyse the code
  - ▶ access the memory
  - ▶ tamper with execution

# White-box cryptography

**General idea:** hide the secret key in an obfuscated cryptographic implementation



# White-box crypto in theory

# What is a program?

- A word in a formal language  $P \in \mathcal{L}$

$$\begin{aligned} \text{execute} : \mathcal{L} \times \{0, 1\}^* &\rightarrow \{0, 1\}^* \\ (P, \text{input}) &\mapsto \text{output} \end{aligned}$$

*(Universal Turing Machine)*

- $|P|$ : size of  $P \in \mathcal{L}$
- $\text{time}(P)$ : # operations for  $\text{execute}(P, \cdot)$

# What is a program?

- $P \equiv f$  ( $P$  implements  $f$ )

$$\forall x : \text{execute}(P, x) = f(x)$$

- $P_1 \equiv P_2$  (*functional equivalence*)

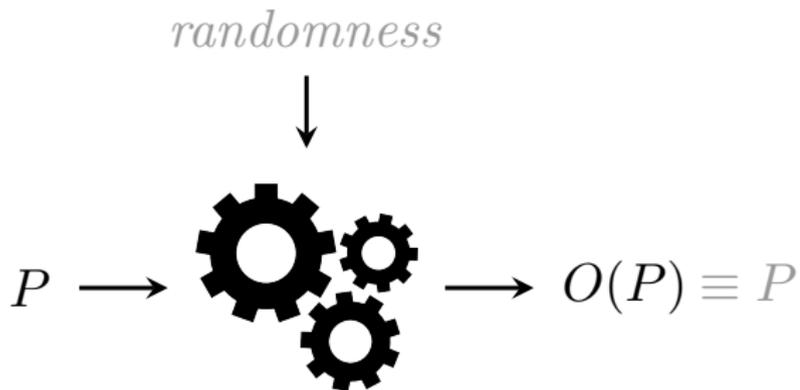
$$\forall x : \text{execute}(P_1, x) = \text{execute}(P_2, x)$$

- Straight-line programs

- ▶ no conditional statements, no loops
- ▶  $|P| = \text{time}(P)$

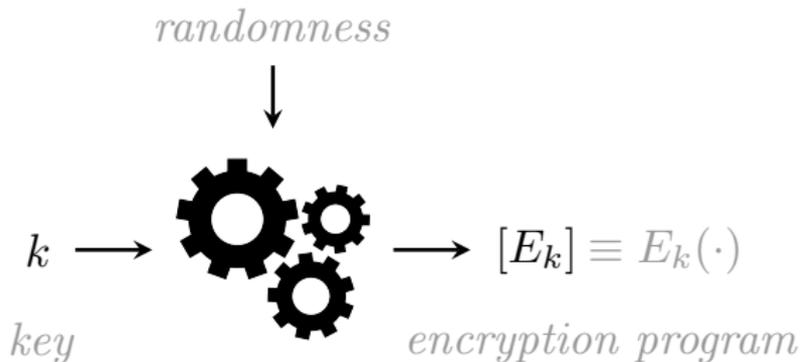
# What is an obfuscator?

- An algorithm:



- Size and execution time increase  
(hopefully not too much)

# What is a white-box compiler?

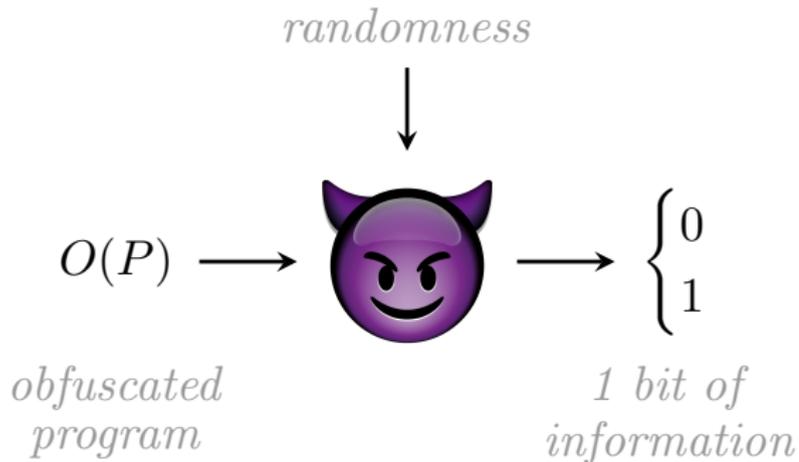


- Specific to an encryption function  $E$
- Can be constructed from an obfuscator

$$k \rightarrow P \equiv E_k(\cdot) \xrightarrow{O} [E_k]$$

# What is an adversary?

- An algorithm:

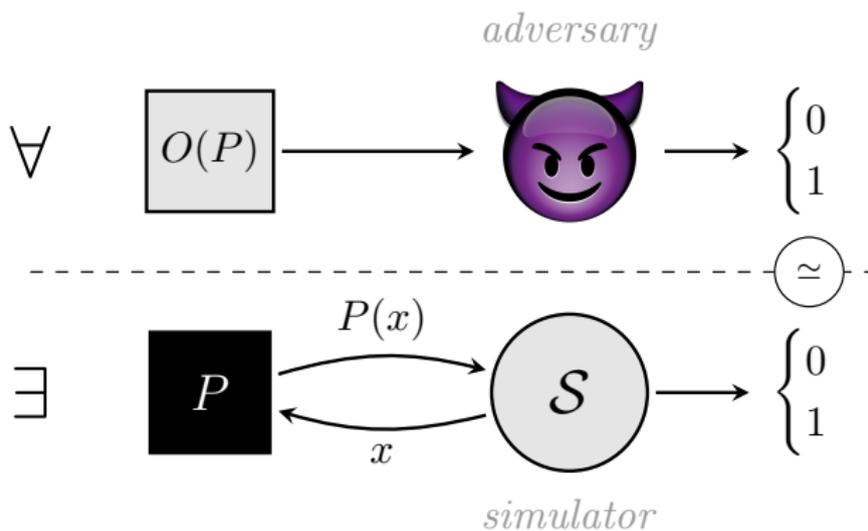


- Wlg:  $\nexists$  1-bit  $\mathcal{O} \Rightarrow \nexists$  multi-bit  $\mathcal{O}$

[BGI+01] *On the (Im)possibility of Obfuscating Programs* (CRYPTO 2001)

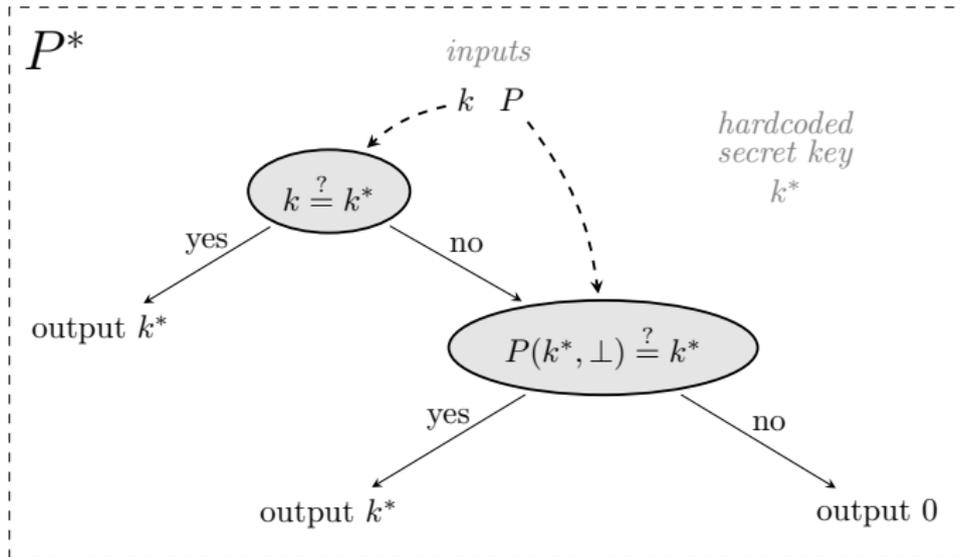
- Virtual Black Box (VBB) security notion
- Impossibility result: VBB cannot be achieved for all programs (counterexample)
- Indistinguishability Obfuscation (IO)

# VBB security notion



- $O(P)$  reveals nothing more than the I/O behavior of  $P$

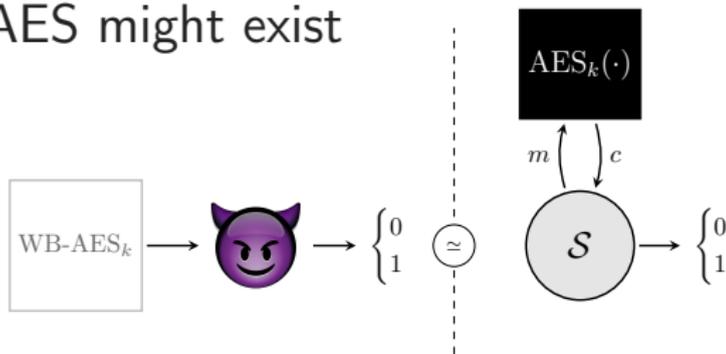
# Impossibility result



- ▶  $P^*(0, P^*) = k^*$
- ▶ BB access to  $P^*$  reveals nothing

# The good news

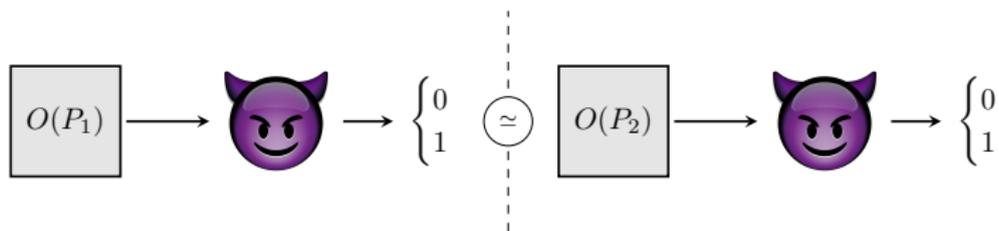
- The impossibility result does not apply to a given encryption algorithm
- VBB AES might exist



- The bad news: seems very hard to achieve

# Indistinguishability Obfuscation (IO)

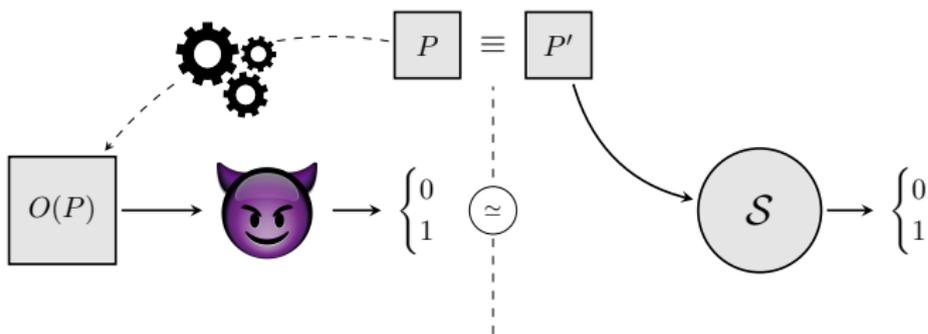
- Notion restricted to straight-line programs
- For any  $(P_1, P_2)$  st  $P_1 \equiv P_2$  and  $|P_1| = |P_2|$



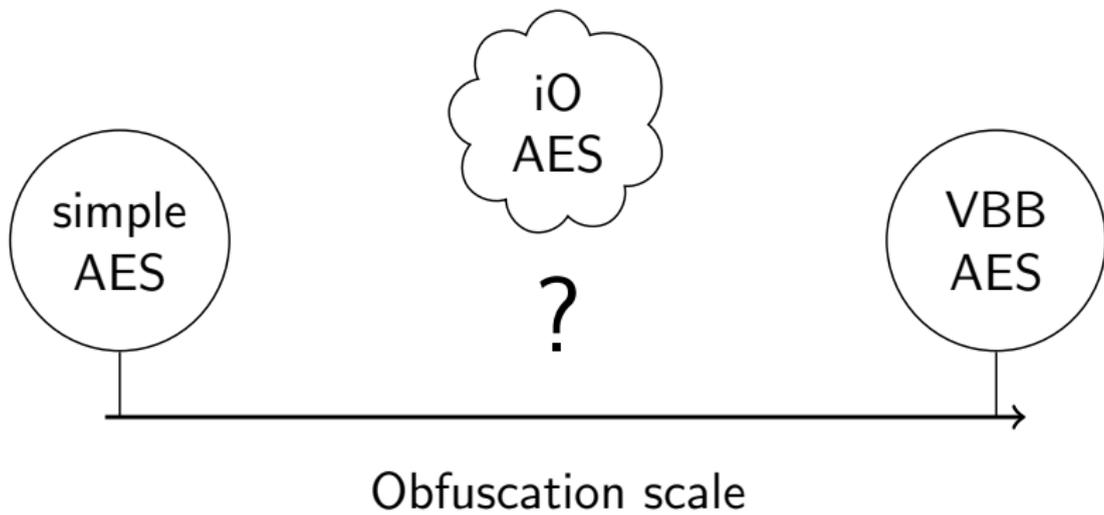
- *i.e.*  $O(P_1)$  and  $O(P_2)$  are indistinguishable

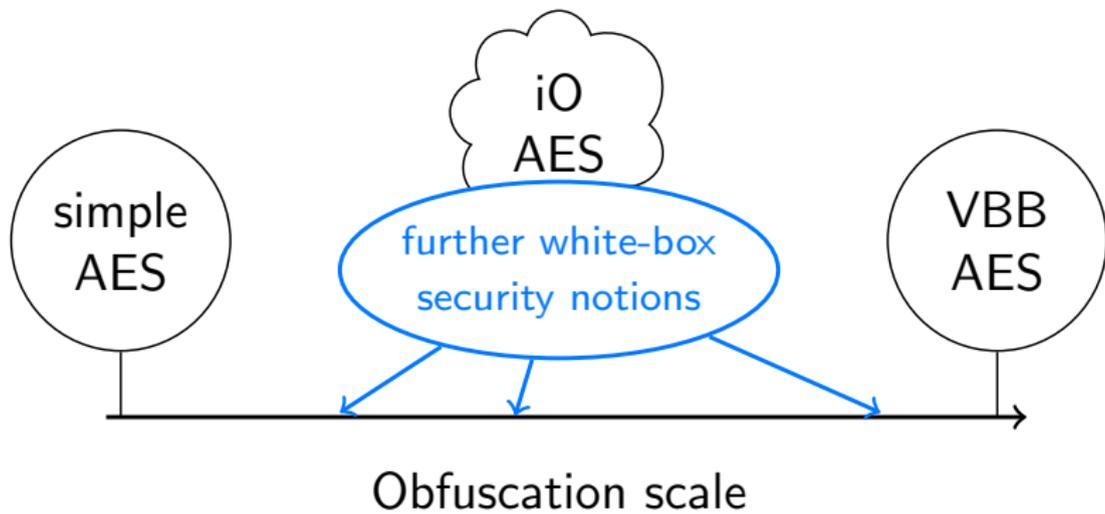
# Why is IO meaningful?

- $IO \Leftrightarrow$  Best Possible Obfuscation
- For any  $P'$ :



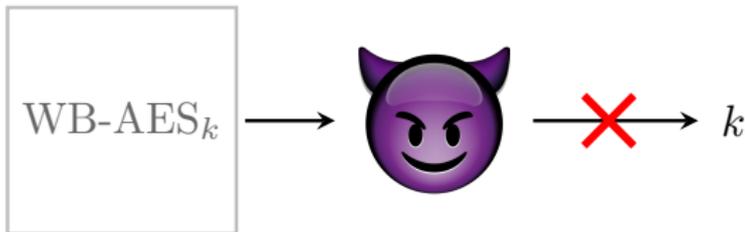
- $O(P)$  doesn't reveal anything more than the *best obfuscated program*  $P'$





# White-box security notions

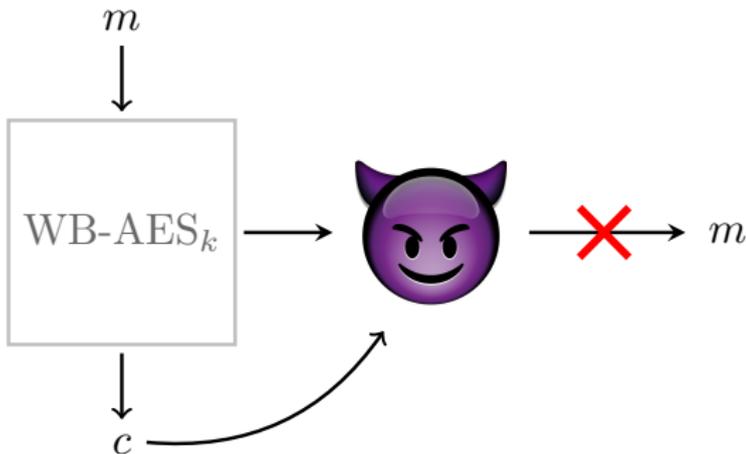
- **Unbreakability:** resistance to key extraction



- Basic requirement but insufficient in practice
- Other security notions
  - ▶ [SWP09] *Towards Security Notions for White-Box Cryptography* (ISC 2009)
  - ▶ [DLPR13] *White-Box Security Notions for Symmetric Encryption Schemes* (SAC 2013)

# One-wayness

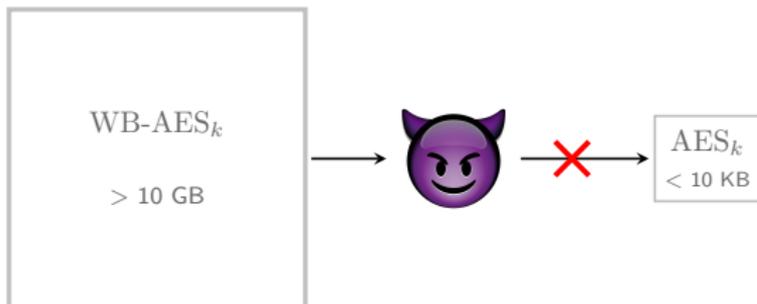
- **One-wayness:** hardness of inversion



- Turns AES into a public-key cryptosystem
- PK crypto with light-weight private operations

# Incompressibility

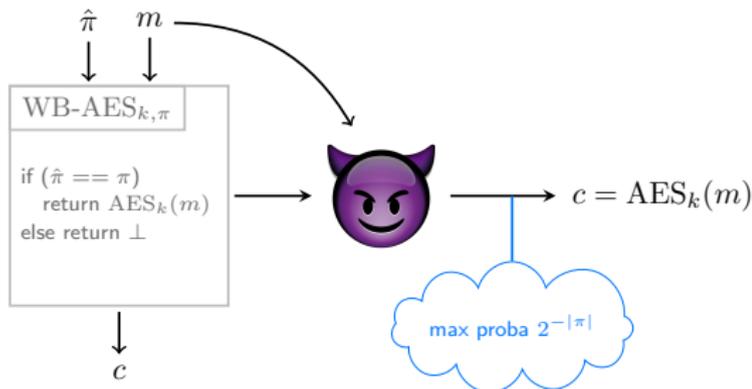
- **Incompressibility:** hardness of compression



- Makes the implementation less convenient to share at a large scale

# Password

- **Password:** WB implem locked by password



- User password / application-dependent secret (a.k.a binding)

# Some relations

- If the underlying encryption scheme is secure:



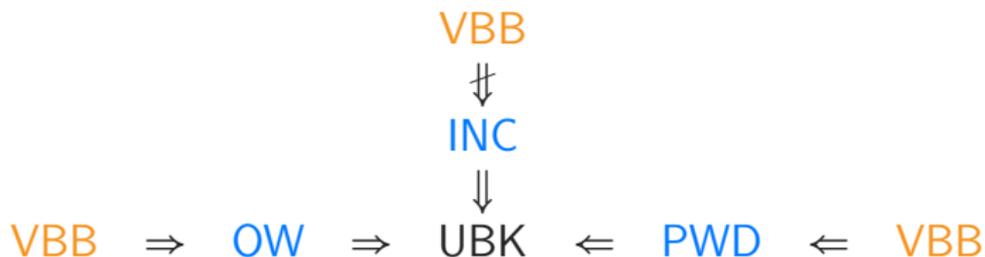
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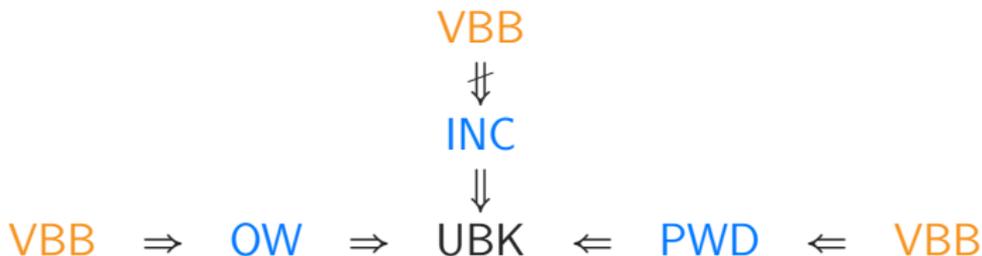
# Some relations

- If the underlying encryption scheme is secure:



# Some relations

- If the underlying encryption scheme is secure:



- No UBK construction known for AES
  - ⇒ no OW/INC/PWB/VBB construction either

# Further white-box notions

- [DLPR13] *White-Box Security Notions for Symmetric Encryption Schemes* (SAC 2013)
  - ▶ Perturbation-Value Hiding (PVH)  $\Rightarrow$  traceability
- [AABM20] *On the Security Goals of White-Box Cryptography* (CHES 2020)
  - ▶ Authenticated encryption
  - ▶ Hardware binding, application binding
- [ABFJM21] *Security Reductions for White-Box Key-Storage in Mobile Payments* (ASIACRYPT 2021)
  - ▶ Key derivation
  - ▶ Payment application

# White-box crypto in practice

# Original white-box AES

- [CEJV02] *White-Box Cryptography and an AES Implementation* (SAC 2002)
- First step: network of look-up tables
- Each round split in 4 *sub-rounds*

$$(x_0, x_5, x_{10}, x_{15}) \mapsto \begin{pmatrix} 02 & 03 & 01 & 01 \\ 01 & 02 & 03 & 01 \\ 01 & 01 & 02 & 03 \\ 03 & 01 & 01 & 02 \end{pmatrix} \otimes \begin{pmatrix} S(x_0 \oplus k_0) \\ S(x_5 \oplus k_5) \\ S(x_{10} \oplus k_{10}) \\ S(x_{15} \oplus k_{15}) \end{pmatrix}$$

# Original white-box AES

- Computed as

$$T_0[x_0] \oplus T_5[x_5] \oplus T_{10}[x_{10}] \oplus T_{15}[x_{15}]$$

- Tables  $T_i : 8 \text{ bits} \rightarrow 32 \text{ bits}$

$$T_0[x] = S(x \oplus k_0) \times (02 \ 01 \ 01 \ 03)^T$$

$$T_5[x] = S(x \oplus k_5) \times (03 \ 02 \ 01 \ 01)^T$$

$$T_{10}[x] = S(x \oplus k_{10}) \times (01 \ 03 \ 02 \ 01)^T$$

$$T_{15}[x] = S(x \oplus k_{15}) \times (01 \ 01 \ 03 \ 02)^T$$

- XOR table:  $8 \text{ bits} \rightarrow 4 \text{ bits}$

$$T_{\text{xor}}[x_0 || x_1] = x_0 \oplus x_1$$

# Original white-box AES

- Second step: randomize look-up tables
- Each table  $T$  is replaced by

$$T' = g \circ T \circ f^{-1}$$

where  $f, g$  are **random encodings**

- For two *connected* tables  $T, R$

$$\begin{aligned} T' &= g \circ T \circ f^{-1} \\ R' &= h \circ R \circ g^{-1} \end{aligned} \Rightarrow R' \circ T' = h \circ (R \circ T) \circ f^{-1}$$

# Original white-box AES

- Intuition: encoded tables bring no information
- True for a single (bijective) table  $g \circ T \circ f^{-1}$
- Not for the large picture

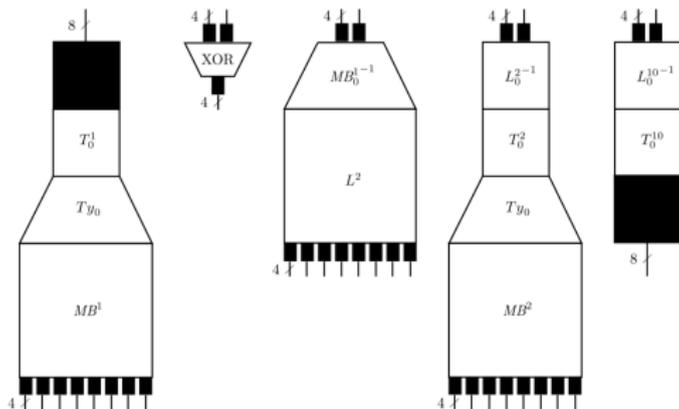
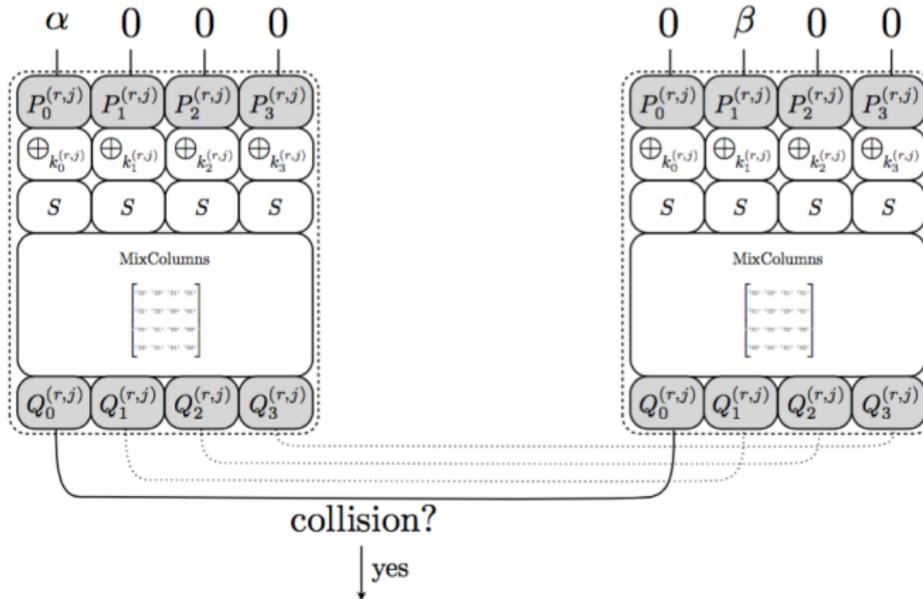


Illustration: J. Muir "A Tutorial on White-box AES" (ePrint 2013)

# Many breaks

- First break: BGE attack
  - ▶ [BGE04] *Cryptanalysis of a White Box AES Implementation* (SAC 2004)
- Generic attack on WB SPN ciphers
  - ▶ [MGH08] *Cryptanalysis of a Generic Class of White-Box Implementations* (SAC 2008)
- Collision attack & improved BGE attack
  - ▶ [LRD+13] *Two Attacks on a White-Box AES Implementation* (SAC 2013)

# Example: collision attack



$$02 \cdot S_0(\alpha) \oplus 03 \cdot S_1(0) = 02 \cdot S_0(0) \oplus 03 \cdot S_1(\beta)$$

where  $S_0(x) = S(P_0(x) \oplus k_0)$  and  $S_1(x) = S(P_1(x) \oplus k_1)$

Illustration: Y. De Mulder (presentation SAC 2013)

# Patches and variants

- Perturbed WB-AES using MV crypto [BCD06] (ePrint 2006)  
⇒ broken [DWP10] (INDOCRYPT 2010)
- WB-AES based on wide linear encodings [XL09] (CSA 2009)  
⇒ broken [DRP12] (SAC 2012)
- WB-AES based on dual AES ciphers [Kar10] (ICISC 2010)  
⇒ broken [LRD+13] (SAC 2013)
- Same situation with DES

# Secret design paradigm

## ■ Industrial need

- ▶ home-made solutions
- ▶ mix of several obfuscation techniques
- ▶ secret designs



Auguste Kerckhoffs

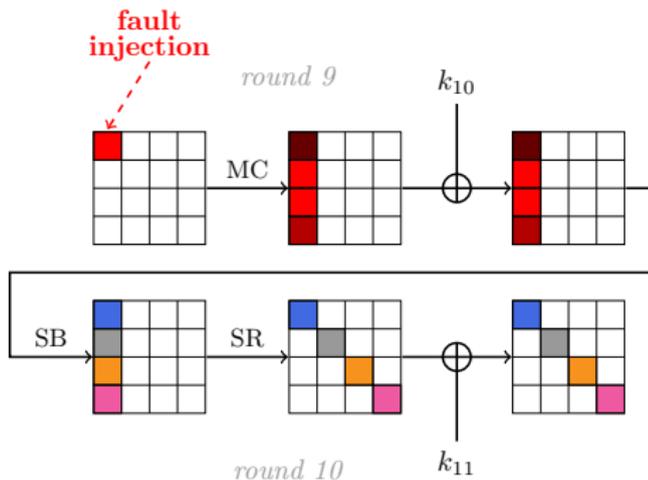
## ■ Security evaluations by ITSEF labs

## ■ Development of generic “gray-box” attacks

- ▶ Fault attacks, DCA
- ▶ Avoid costly reverse engineering effort

# Fault attacks

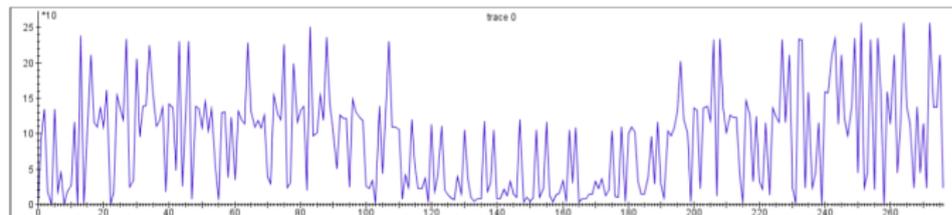
- Easy fault injection in the white-box context
- Plenty of efficient FA techniques (on e.g. AES)



- Original white-box AES vulnerable to this attack

# Differential Computation Analysis

- Suggested by NXP / Riscure
  - ▶ Presentation at BalckHat 2015
  - ▶ Best paper award CHES 2016
- Record data-dependent information at execution  $\Rightarrow$  *computation trace*



Trace: J. Bos (presentation CHES 2016)

- Apply DPA techniques to computation traces

# Differential Computation Analysis

*predictions*

$$S(x_1 \oplus k)$$

$$S(x_2 \oplus k)$$

⋮

$$S(x_N \oplus k)$$

*computation traces*



⋮

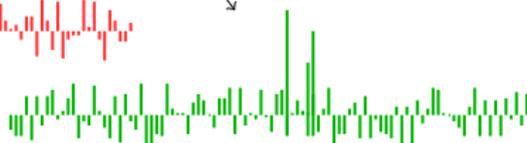


*correlation*

$$\rho(\cdot, \cdot)$$

$$k \neq k^*$$

$$k = k^*$$

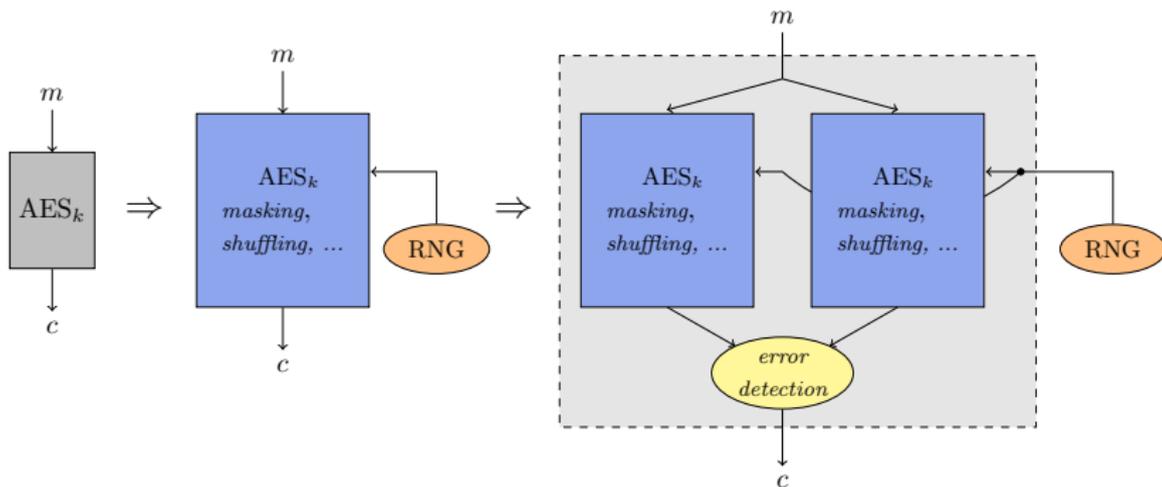


# DCA in presence of encodings

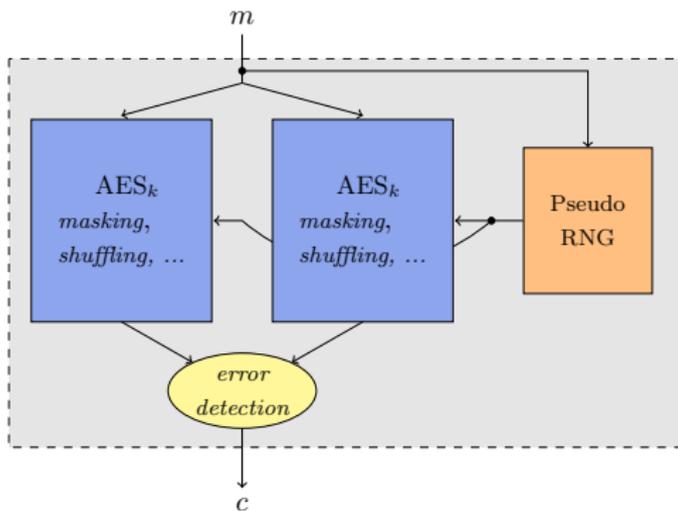
- DCA can break the original white-box AES
  - ▶ [BHMT16] *Differential Computation Analysis* (CHES 2016)
- Why?
  - ▶ [ABMT18] *On the Ineffectiveness of Internal Encodings* (ACNS 2018)
  - ▶ [RW09] *Analysis and Improvement of Differential Computation Attacks against Internally-Encoded White-Box Implementations* (CHES 2019)

# Countermeasures?

- Natural approach: use known SCA/FA countermeasures

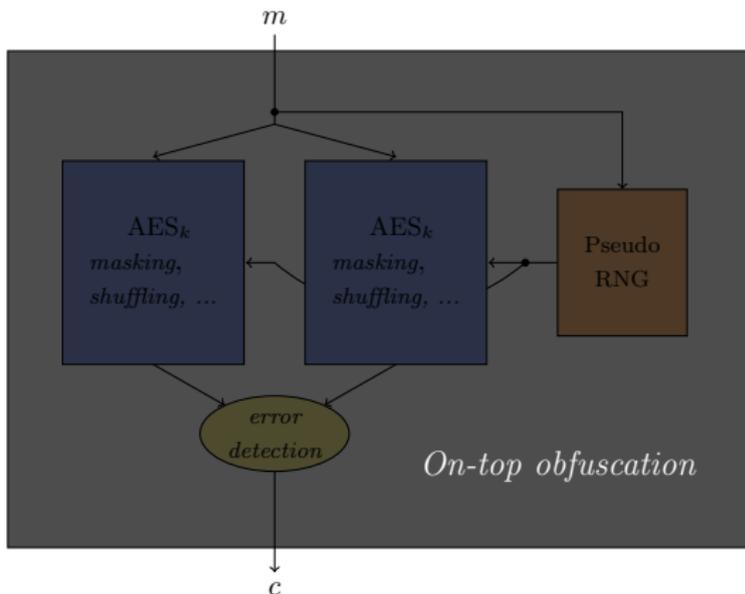


# Countermeasures?



- Pseudo-randomness from  $m$
- PRNG should be somehow secret

# Countermeasures?



- Countermeasures hard to remove
- Pseudo-randomness / redundancy hard to detect

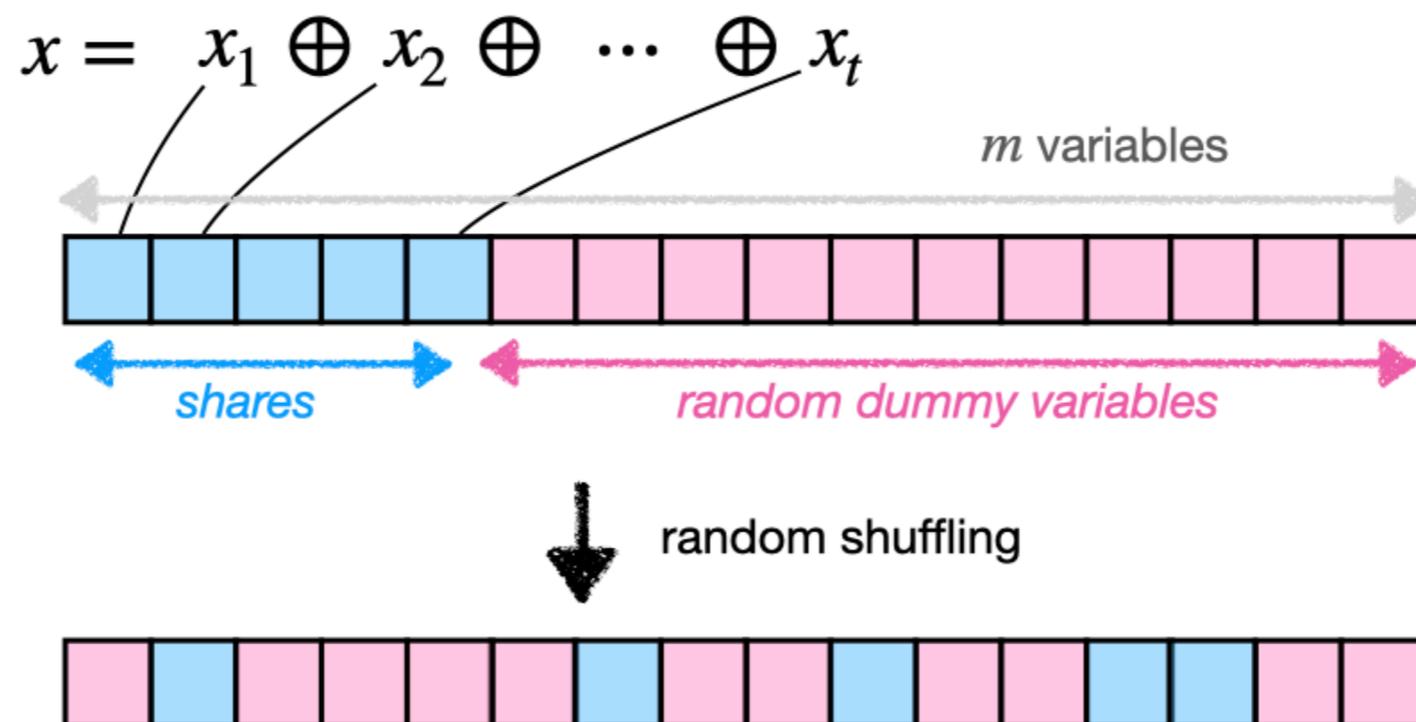
# New paradigm: gray-box attacks and countermeasures

# Coming next...

- **Case study 1:** masking and shuffling
- WhibOx contest
- **Case study 2:** WhibOx 2017 winner
- Linear Decoding Analysis
- **Case study 3:** WhibOx 2019 winners
- Data Dependency Analysis

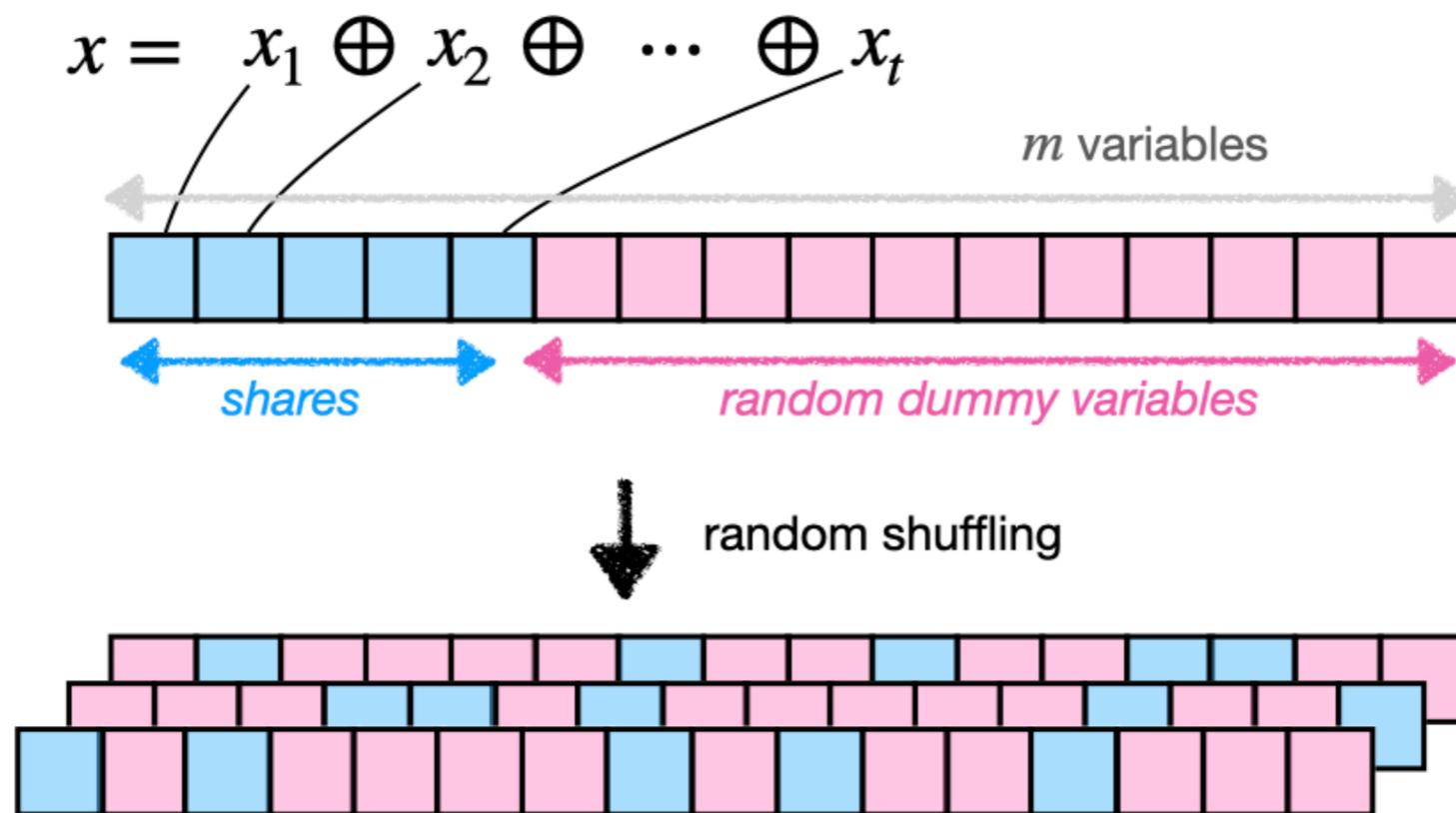
# Case study 1: masking and shuffling

- [BRVW19] *Higher-Order DCA against Standard Side-Channel Countermeasures* (COSADE 2019)



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$x ?$

Optimal attack complexity

$$\geq \binom{m}{t}$$

# Case study 1: masking and shuffling

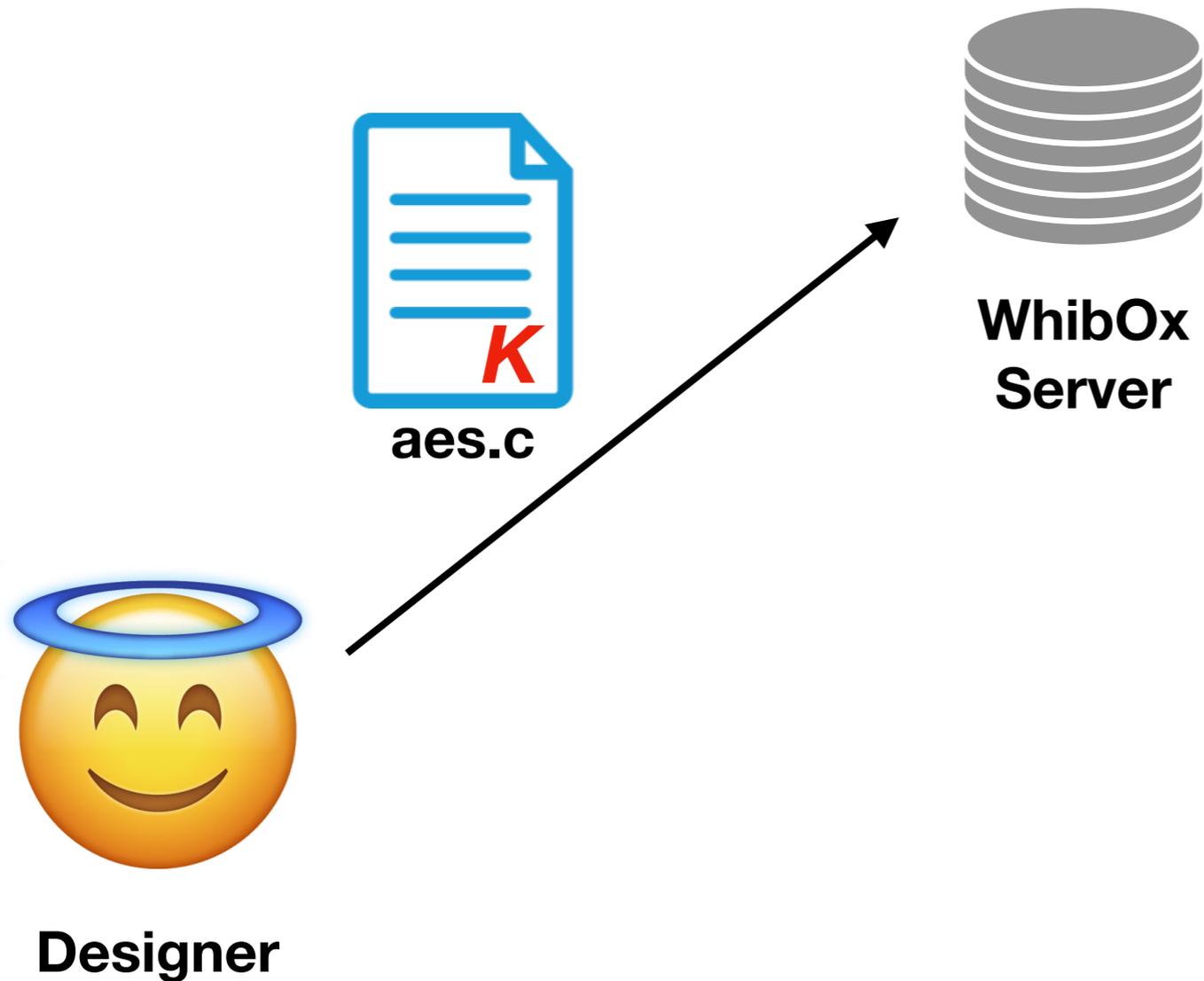
- We obtain exponential security 👍
- But against a limited adversary
  - Passive attack
  - No reverse engineering
- The adversary can do more in the WB model 😈
  - Detect / deactivate shuffling
  - Exploit data dependency
  - Inject faults

# WhibOx contets

**Goal:** confront designers and attackers  
of practical white-box crypto

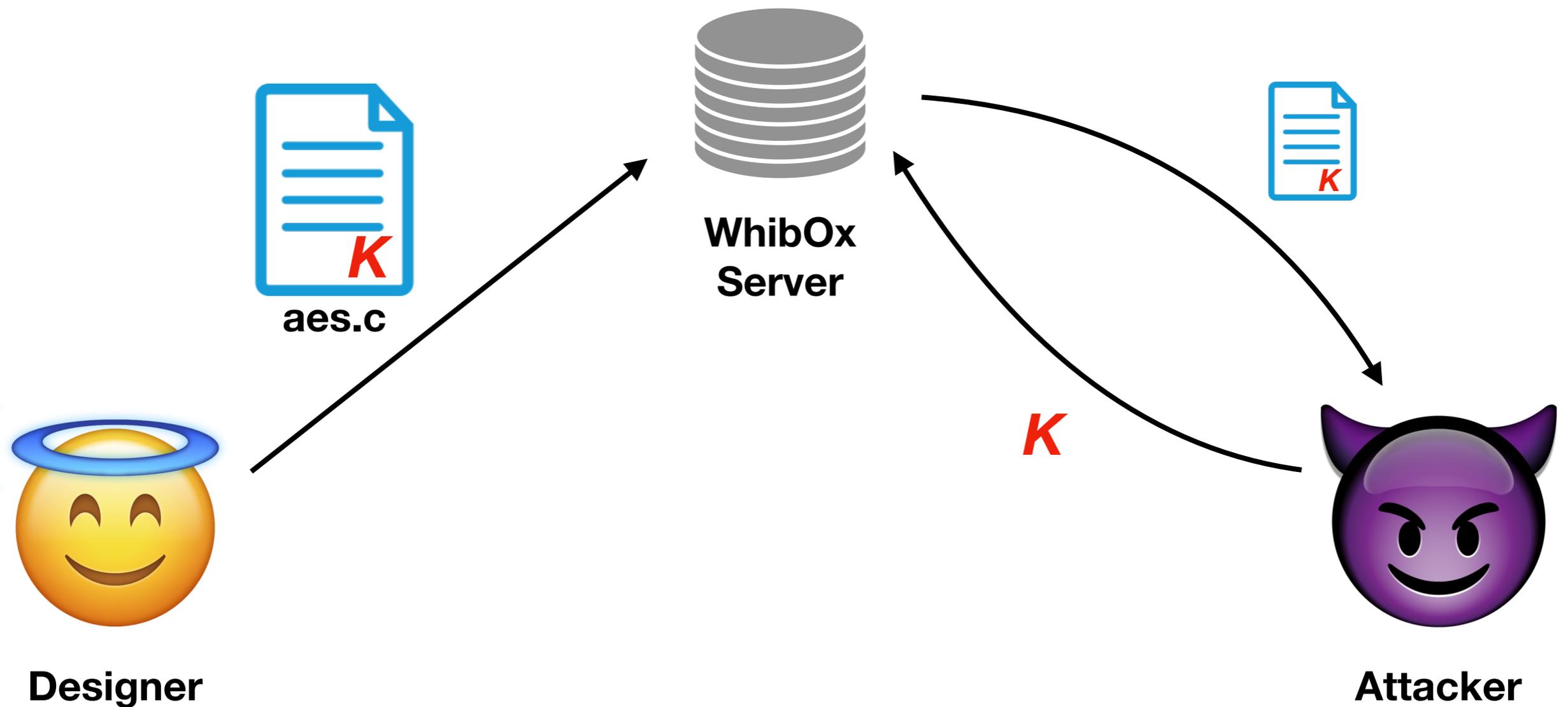
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- 1st edition (2017)
  - White-box AES ( < 20MB / runs < 1s )
  - 94 submitted implementations / 877 breaks
  - Everything broken / winner survived **29 days**

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  - **3 survivors** (broken few days after deadline)

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- 3rd edition (2021)
  - ECDSA ( < 20MB excl. GMP / runs < 3s )
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- <https://whibox.io/contests/>

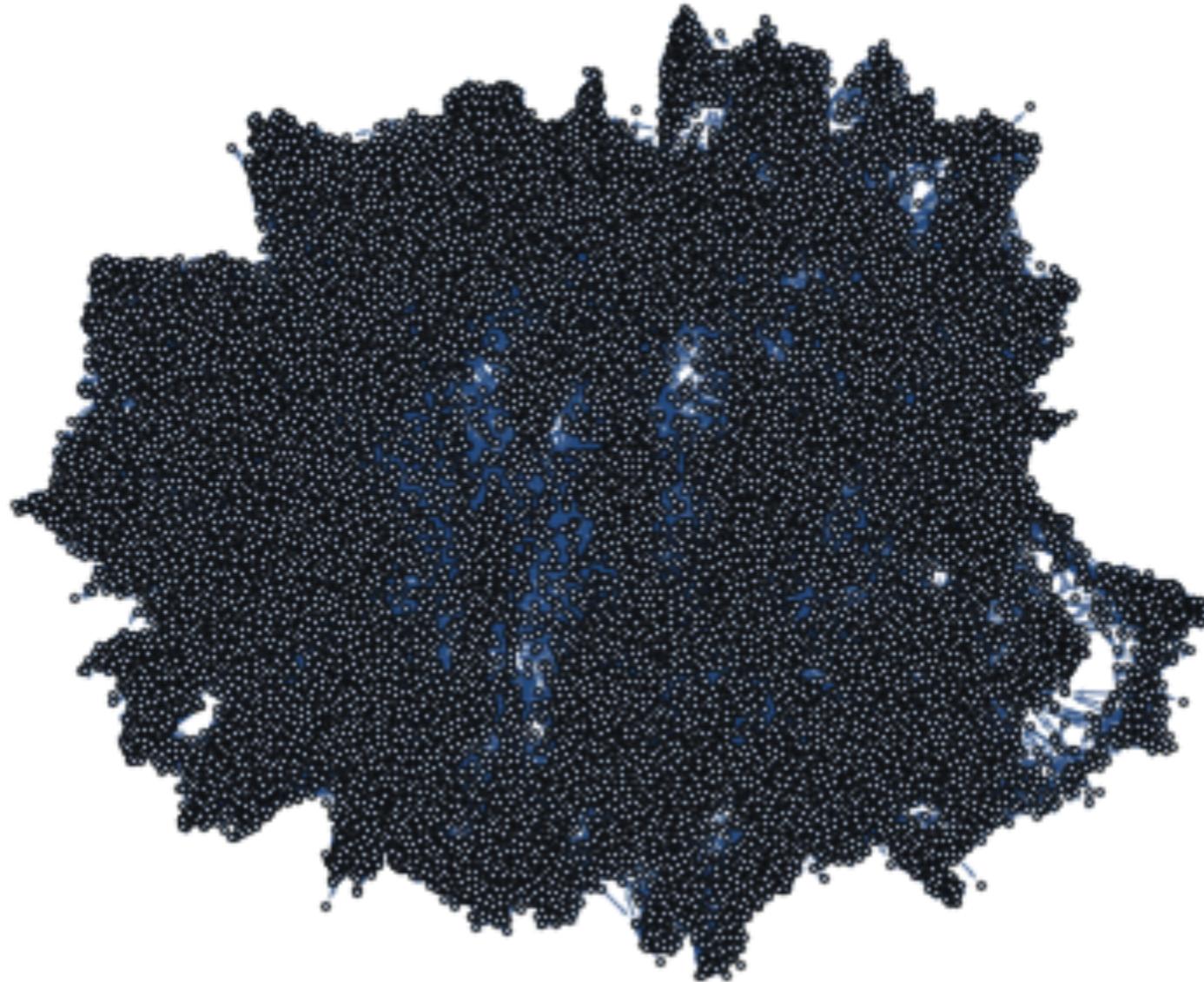
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- Winner: challenge #777 (a.k.a. adoring\_poitras)
  - From Alex Biryukov, Aleksei Udovenko
  - Boolean level masking, bitslicing, error detection, dummy operations, virtualisation, obfuscation

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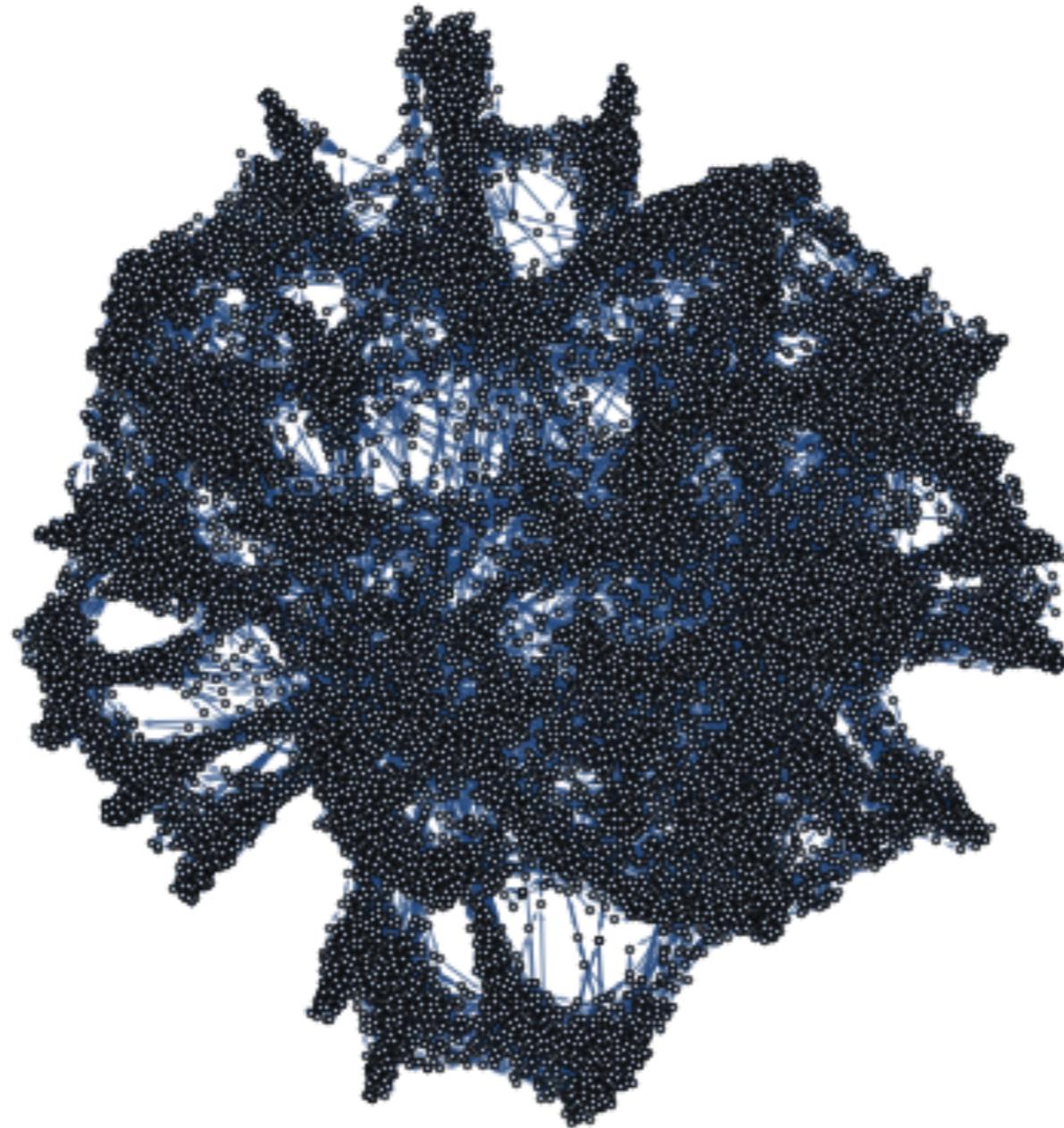
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- Break from Louis Goubin, Pascal Paillier, Matthieu Rivain, Junwei Wang
  - [GPRW18] *How to Reveal the Secrets of an Obscure White-Box Implementation* (ePrint 2018, JCEN 2020)
  - Human reverse engineering  $\Rightarrow$  SSA-format program (circuit)
  - Circuit minimisation (detect dummy / constant / duplicate variables & pseudo-randomness)
    - 600 K gates  $\Rightarrow$  280 K gates

# Data dependency analysis



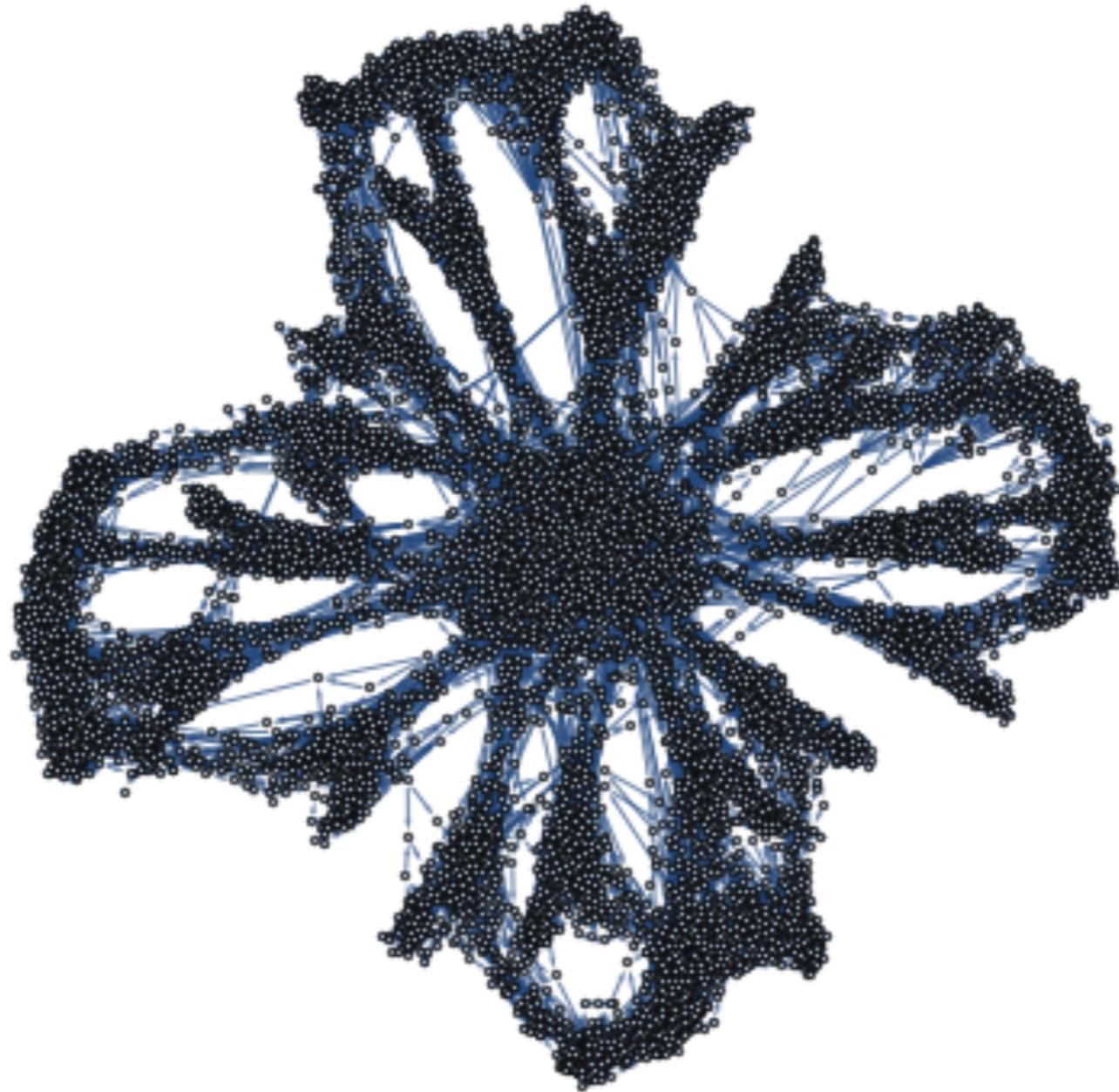
Data dependency graph (20% of the circuit)

# Data dependency analysis



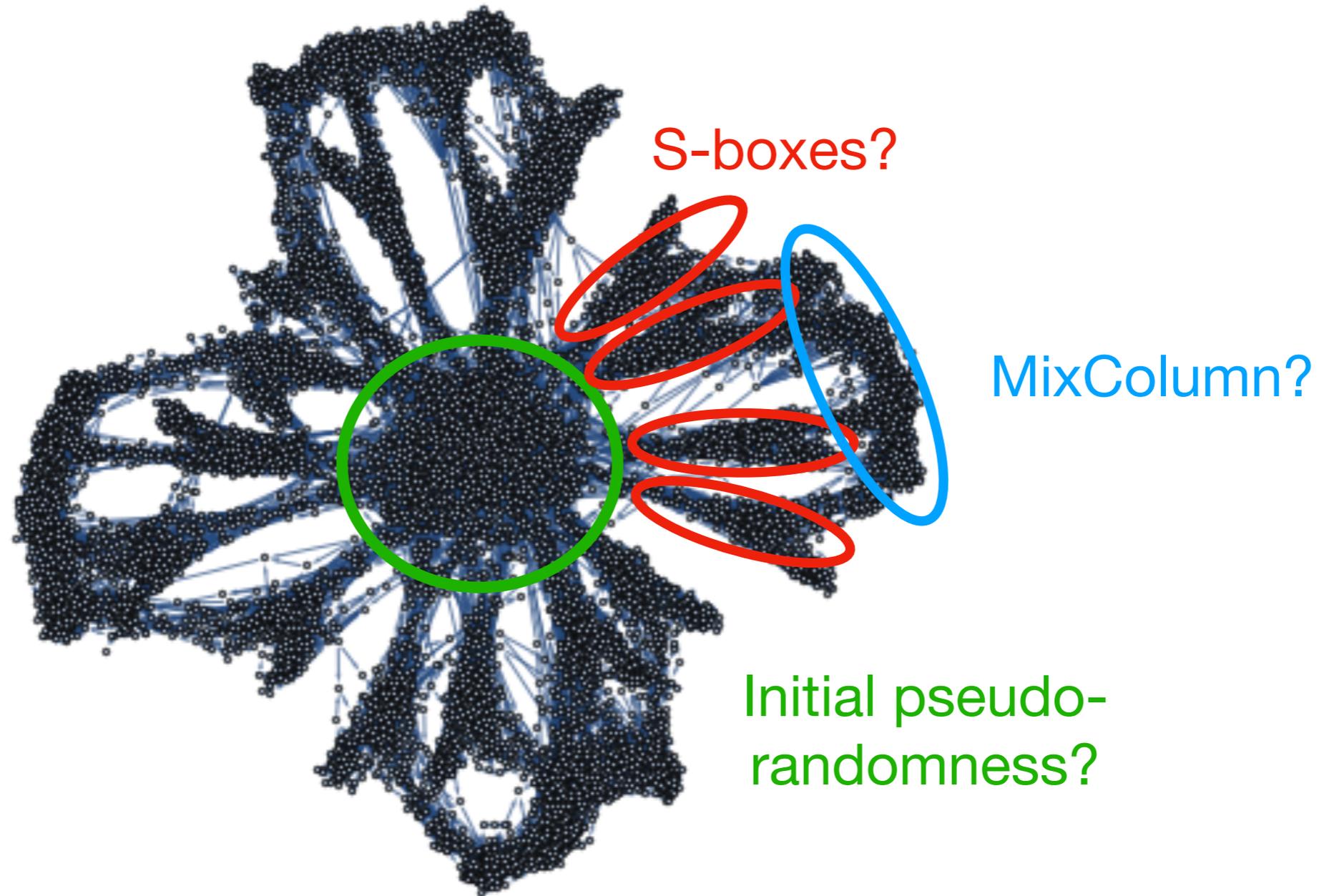
Data dependency graph (10% of the circuit)

# Data dependency analysis



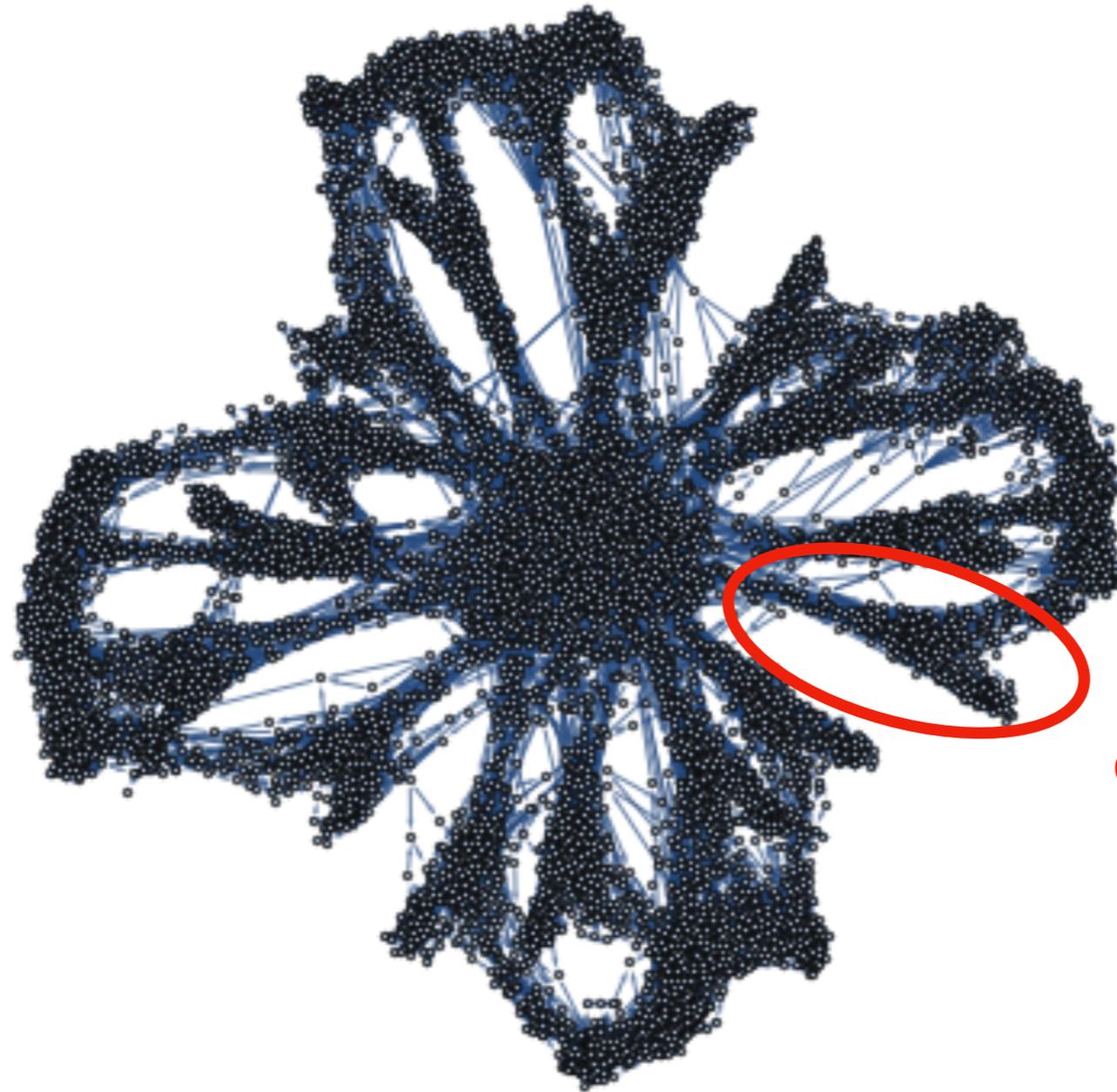
Data dependency graph (5% of the circuit)

# Data dependency analysis



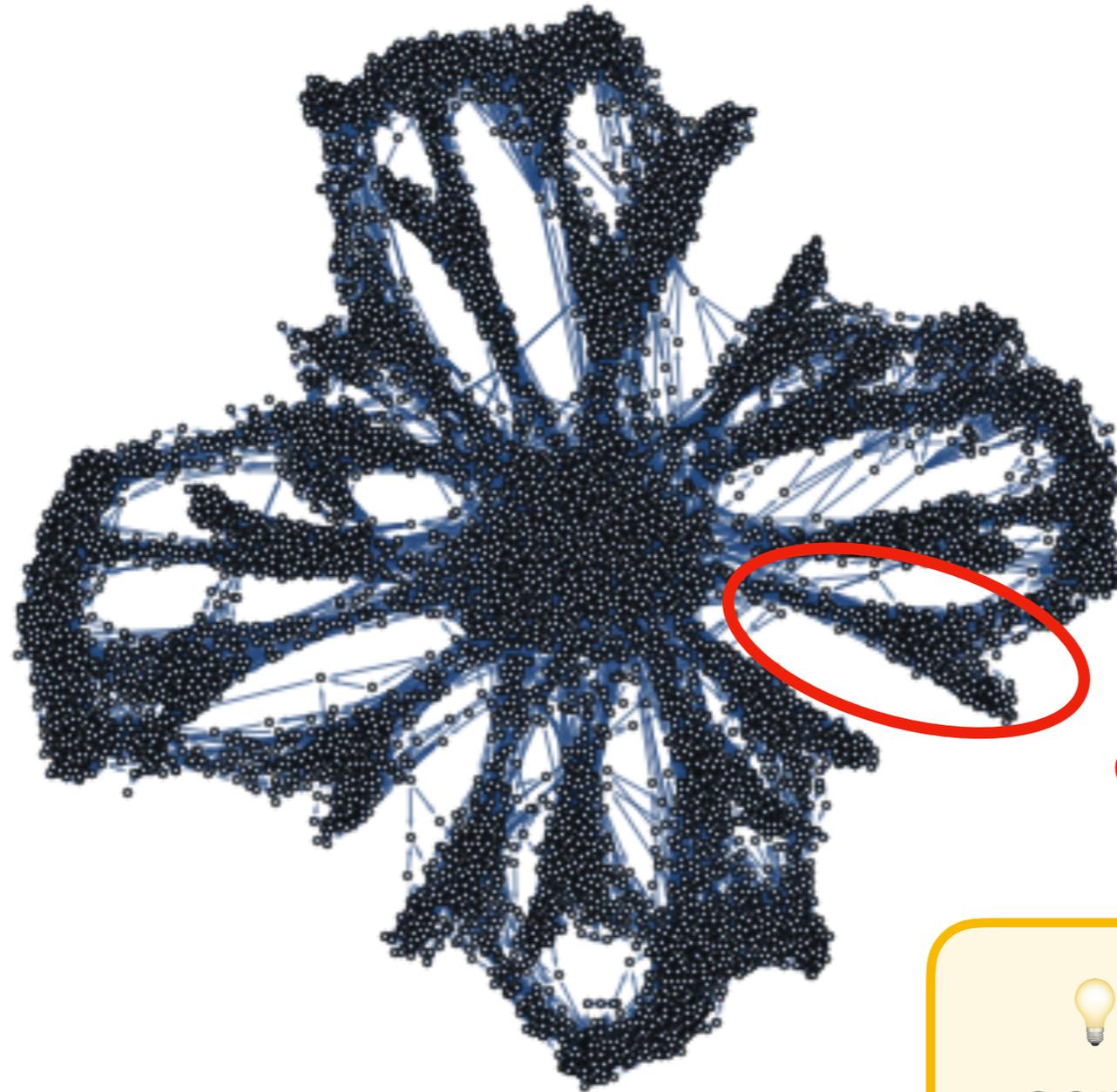
Data dependency graph (5% of the circuit)

# Data dependency analysis



Large window  
encompassing  
one s-box

# Data dependency analysis



Large window  
encompassing  
one s-box

💡 Assumption:  
contains variables  
encoding  $S(x \oplus k)$

# Linear Decoding Analysis

- Let  $s_1, \dots, s_m$  the variables in the window
- Record them for  $n$  executions

$$\begin{bmatrix} s_1^{(1)} & s_2^{(1)} & \dots & s_m^{(1)} \\ s_1^{(2)} & s_2^{(2)} & \dots & s_m^{(2)} \\ \vdots & \vdots & \ddots & \vdots \\ s_1^{(n)} & s_2^{(n)} & \dots & s_m^{(n)} \end{bmatrix}$$

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- Let  $s_1, \dots, s_m$  the variables in the window
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- 💡 by assumption, we get a linear system

# Linear Decoding Analysis

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One output bit of the s-box

Plaintext byte

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Unknown coefficients      Plaintext byte      Unknown key byte

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# LDA: generalisation

- LDA defeats WB implems based on additive sharing
- Generalisation to encoding of higher degrees

$$\vec{v} = (1 \mid \vec{s} \mid \vec{s} \otimes \vec{s} \mid \vec{s} \otimes \vec{s} \otimes \vec{s} \mid \dots)$$

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degree-2            degree-3            etc.  
monomials        monomials

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degree-2
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monomials
monomials

- Larger system

$$\begin{bmatrix} v_1^{(1)} & v_2^{(1)} & \dots & v_{m'}^{(1)} \\ v_1^{(2)} & v_2^{(2)} & \dots & v_{m'}^{(2)} \\ \vdots & \vdots & \ddots & \vdots \\ v_1^{(n)} & v_2^{(n)} & \dots & v_{m'}^{(n)} \end{bmatrix} \times \begin{bmatrix} c_1 \\ \vdots \\ c_2 \\ \vdots \\ \vdots \\ \vdots \\ c_{m'} \end{bmatrix} = \begin{bmatrix} f(x^{(1)}, k) \\ f(x^{(2)}, k) \\ \vdots \\ f(x^{(n)}, k) \end{bmatrix}$$

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**Complexity:**  
 Inverting a  
 $m^d \times m^d$  matrix  
 $\Rightarrow \mathcal{O}(m^{2.8d})$

# LDA: mitigation

- Non-linear masking

$$x = x_1 \cdot x_2 \oplus x_3$$

- [BU18] *Attacks and Countermeasures for White-box Designs* (ASIACRYPT 2018)
- [SEL21] *A White-Box Masking Scheme Resisting Computational and Algebraic Attacks* (CHES 202)

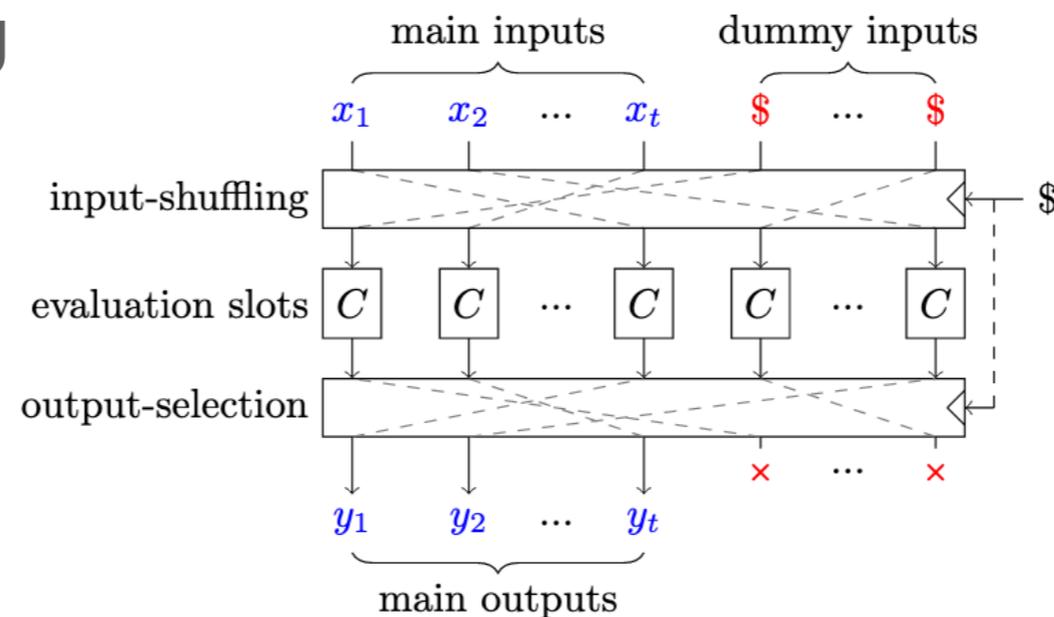
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- Dummy shuffling



- [BU21] *Dummy Shuffling against Algebraic Attacks in White-box Implementations* (EUROCRYPT 2021)

# Case study 3: WhibOx 2019 winners

- Winners: challenges #100, #111, #115
  - From Alex Biryukov, Aleksei Udovenko
  - Linear (high-order) masking, non-linear masking, shuffling, obfuscation, virtualisation
- Breaks from Louis Goubin, Matthieu Rivain, Junwei Wang / Arnolds Kikusts, Artur Pchelkin
  - [GRW20] *Defeating State-of-the-Art White-Box Countermeasures with Advanced Gray-Box Attacks* (CHES 2020)
  - Human reverse engineering  $\Rightarrow$  SSA-format program

# Higher-order DCA

- From a trace / window  $s_1, \dots, s_m$  compute

$$s_{i_1} \oplus s_{i_2} \oplus \dots \oplus s_{i_t} \quad \forall \quad 1 \leq i_1 < i_2 < \dots < i_t \leq n$$

$\Rightarrow$   $t$ -th order trace

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- Against  $t$ -order masking + non-linear masking

$$x = a \cdot b \oplus x_1 \oplus x_2 \oplus \dots \oplus x_t$$

$$\Rightarrow \text{Cor}(x, x_1 \oplus \dots \oplus x_t) = \frac{1}{2}$$

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- Against  $t$ -order masking + non-linear masking +  $\lambda$ -shuffling

$$\text{HO-DCA} \Rightarrow \text{Cor} = \frac{1}{2\lambda}$$

$$\text{Integrated HO-DCA} \Rightarrow \text{Cor} = \frac{1}{2\sqrt{\lambda}}$$

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$\frac{1}{2/\lambda}$

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- Size of  $t$ -th order trace:  $\binom{m}{t}$

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- Size of  $t$ -th order trace:



window size

masking order

$\Rightarrow$  Size  $\mathcal{O}(m^t)$

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-  idea: exploit the locality of a masking gadget

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- Multiplication gadget  $(x_1, \dots, x_t) \otimes (y_1, \dots, y_t)$

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- Set of co-operands of any  $x_i \Rightarrow$  all the shares  $y_1, \dots, y_n$

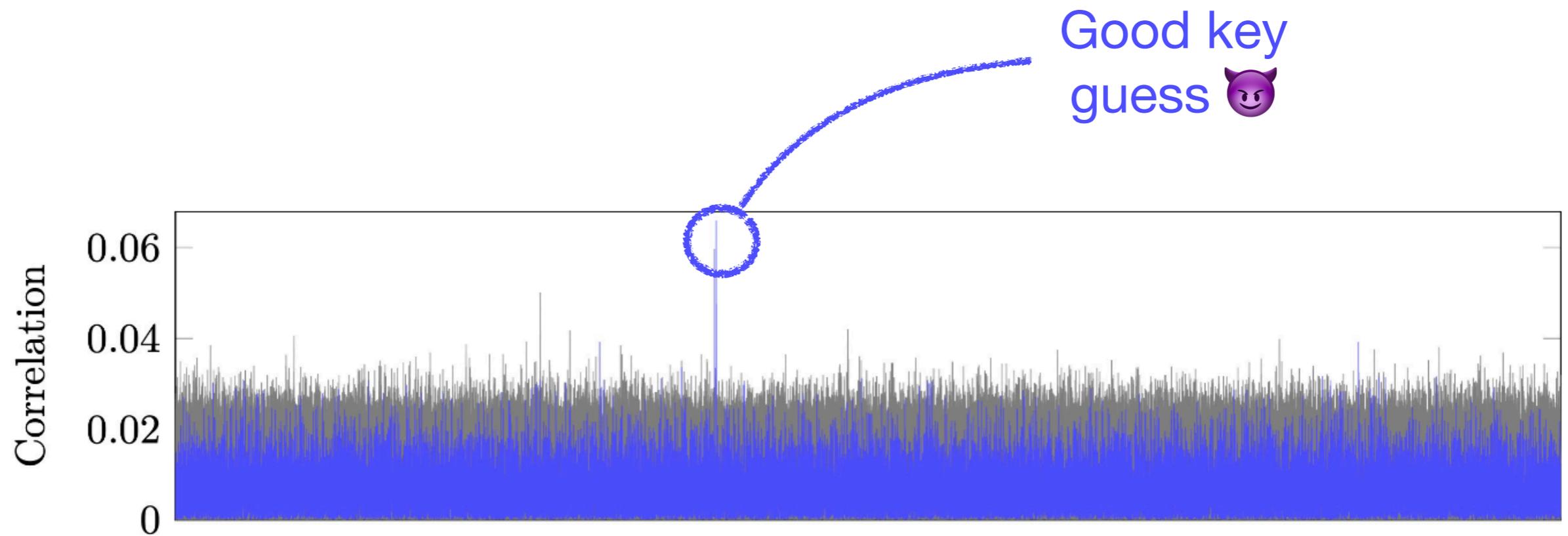
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- Set of co-operands of any  $x_i \Rightarrow$  all the shares  $y_1, \dots, y_n$
- Data-dependency HO-DCA
  - Scanning all the gates of the circuit
  - For each gate  $g : \vec{s}_g = \text{CoOperands}(g)$  (might contain  $t$  shares)
  - Global  $t$ -th order trace =  $\left( t\text{-th order trace}(\vec{s}_g) \right)_{\forall g}$
  - Apply DCA to global  $t$ -th order traces

# Data-dependency HO-DCA on #100



Data-dependency HO-DCA against #100, using 767 traces  
(18% of the circuit / target: 1st round s-box)

# Data-dependency analysis

- Clustering technique applicable to any gray-box attack in the white-box setting
- Principle
  - Scan the gates of the circuit / DD graph
  - For each  $g$ , record co-operands of  $g$  as potential window
  - Apply a given gray-box attack to the recorded windows
- Possible extensions
  - Include co-operands of degree  $d$   
(co-op. of co-op. of co-op. ...)
  - Include incoming / outgoing gates

# Conclusion

- Strong WBC (VBB / UBK) hard to achieve in practice
- Practical WBC relies on security through obscurity  
⇒ countermeasures & obfuscation vs. gray-box attacks
- Exponential security can be obtained against some attacks  
⇒ attack window must be large enough
- DDA very effective to reduce the attack window
  - Open problem: how to thwart DDA attacks?
- Fault attacks: to be formalised / investigated more in WB setting
- WhibOx 2021 on ECDSA ⇒ WB session next Tuesday