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RUHR-UNIVERSITÄT BOCHUM

STATISTICAL INDEPENDENCE AND LEAKAGE VERIFICATION (SILVER)

FORMAL VERIFICATION OF MASKING SCHEMES IN HARDWARE

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INTRODUCTION

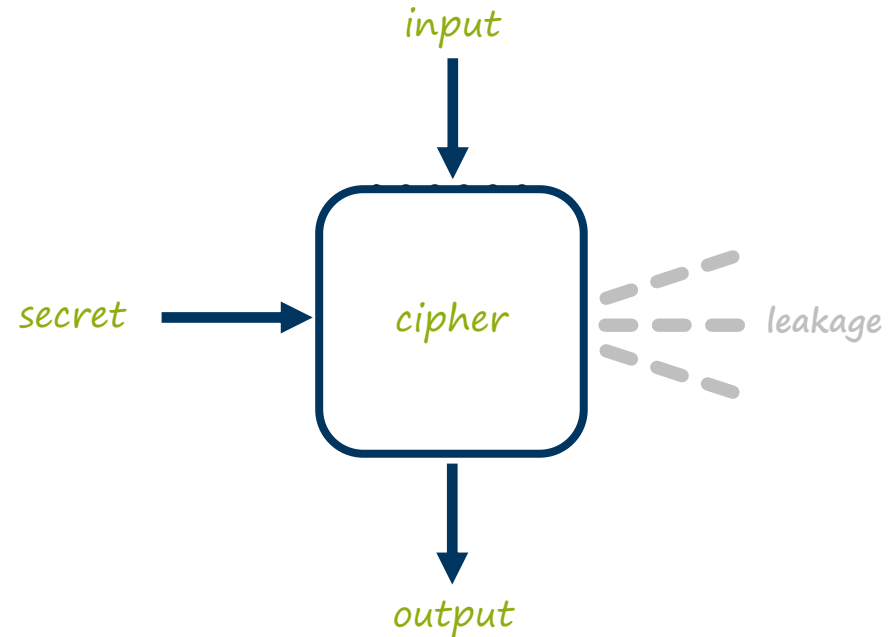
Side-Channel Analysis and Hardware Masking

ASSUMPTION:

Cryptography is secure in the black-box model.

THE PROBLEM: IMPLEMENTATION ATTACKS

- 20+ years of research on Side-Channel Analysis (SCA)
- secret-dependent side-channel leakage of hardware implementations:
 - *timing variations*
 - *power consumption*
 - *electromagnetic emanations*
 - ...



SOLUTION:

Randomizing execution in hardware.

THE APPROACH: MASKING SCHEMES

- *random sharing* of intermediate values
- algorithmic-level countermeasure
 - *independent of device characteristics*
 - *applied during implementation phase*
- different schemes used in practice:
 - *Threshold Implementations (TI)*
 - *Domain-Oriented Masking (DOM)*
 - ...

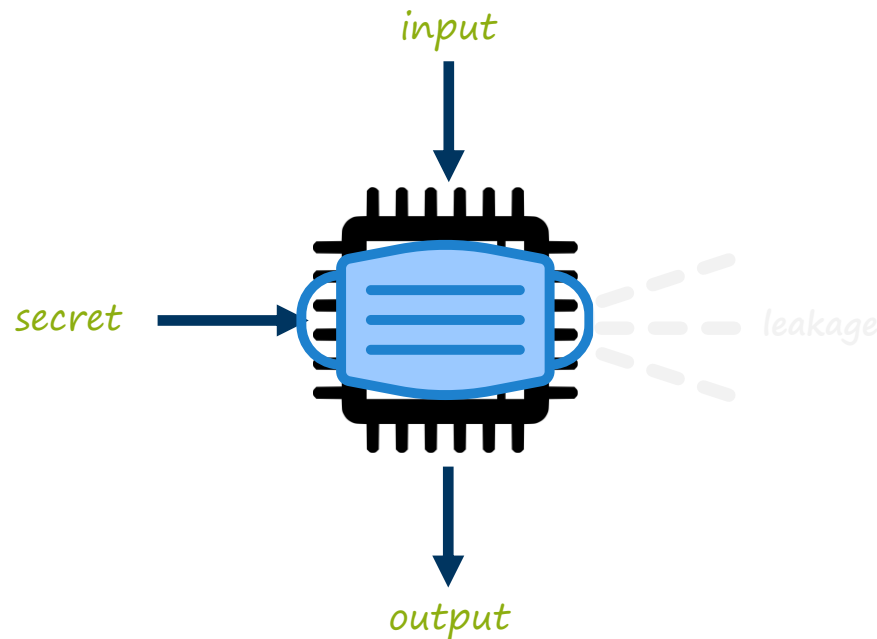


image sources: <https://www.onlinewebfonts.com>, <https://www.flaticon.com>

MOTIVATION

Why do we need formal verification of masking schemes in hardware?

Hardware Masking

The Hardware Design Process

OBSERVATION:

Secure design (hardware masking) spans across multiple phases of the hardware design process.

1. **concept:**

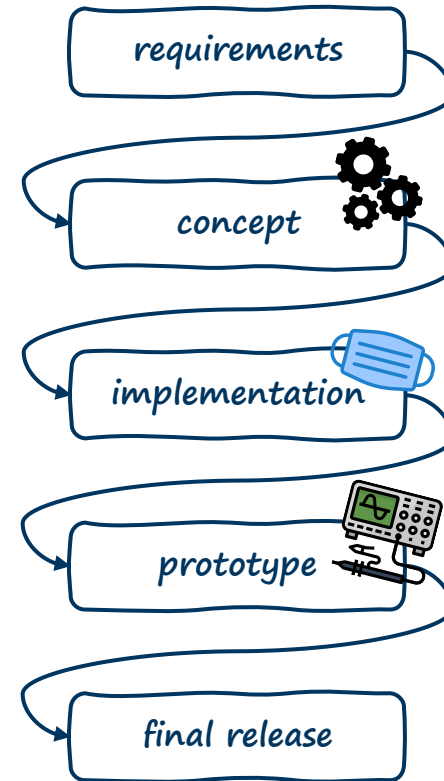
→ *selection of masking scheme*

2. **implementation:**

→ *protected hardware architecture*

3. **prototype:**

→ *practical evaluation & testing*



Hardware Masking

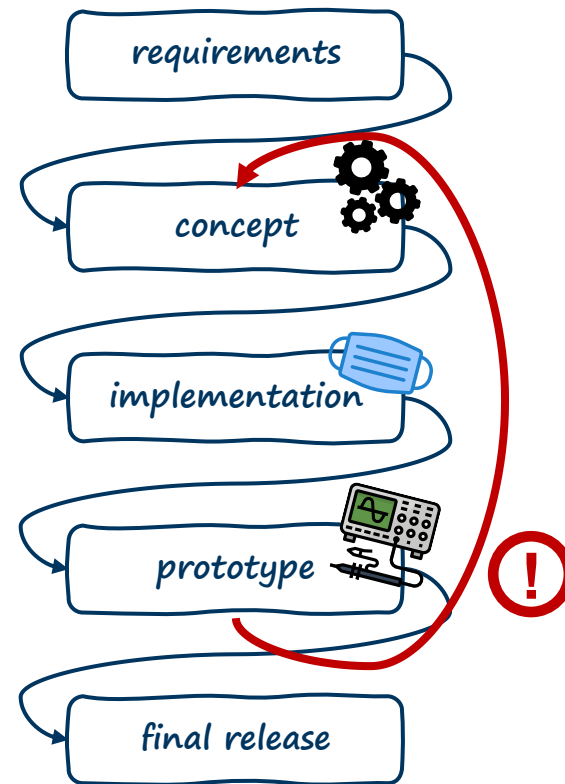
Empirical Testing & Evaluation

PROBLEM:

Design, implementation, and testing of masked hardware is a complex, manual, and error-prone task.

TESTING AND EVALUATION:

- long-standing security expertise required
- re-iteration for every detected flaw & issue
- downstream and time-consuming process



Hardware Masking

Formal Verification

IDEA:

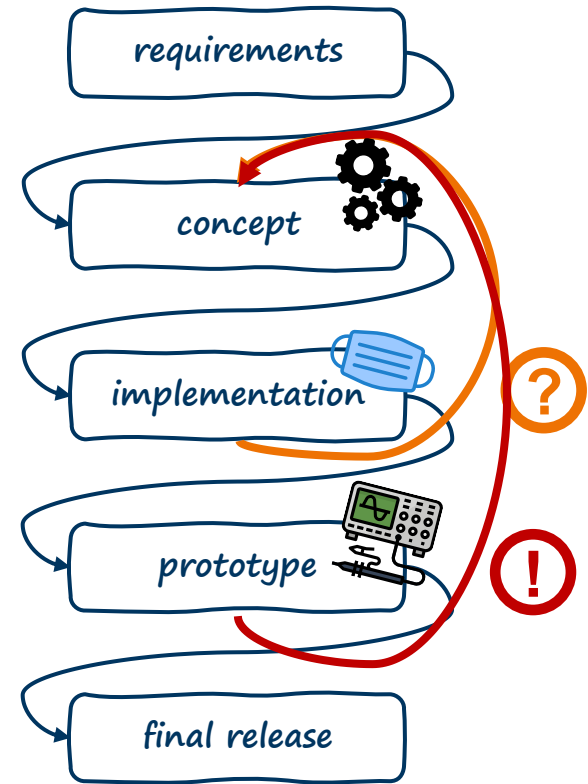
Shorten the feedback path in the design cycle.

FORMAL VERIFICATION:

- early during the design cycle
- security proofs vs. expensive empirical testing

CHALLENGES (ADDRESSED IN THIS TALK):

- *formal description of adversary model(s)*
- *formal definition of security properties*
- *automated verification of properties against model(s)*



ADVERSARY MODEL

How to formally model adversaries and leakages?

Adversary Model

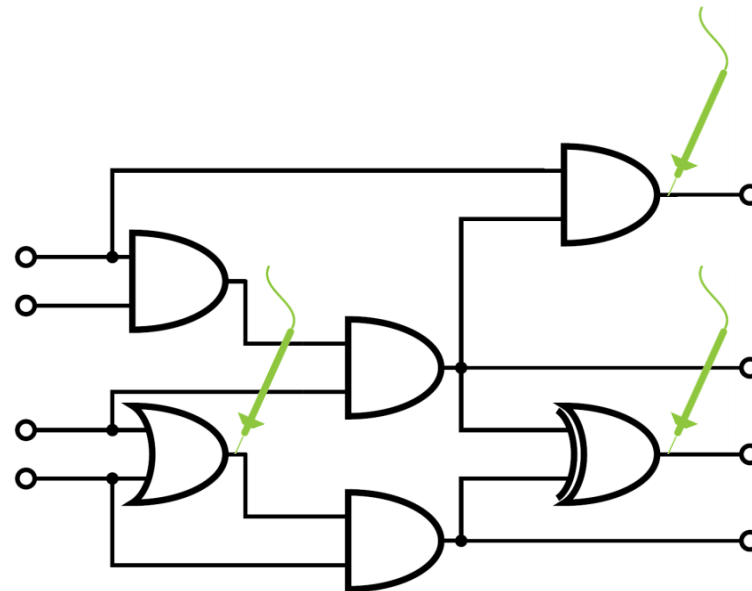
The Standard Probing Model [ISW03]

THE CORE IDEA:

Adversaries can probe up to d intermediate values of an ideal digital circuit.

THE PROBES:

- number of probes determines order of attack
- each adversarial probe is:
 - exact (noise-free)
 - instantaneous & stable
 - independent of all other probes



Security in this model also implies security in other (more realistic) models [BDF+17].

Adversary Model

The Glitch-Extended (Robust) Probing Model [FGP+18]

THE PROBLEM:

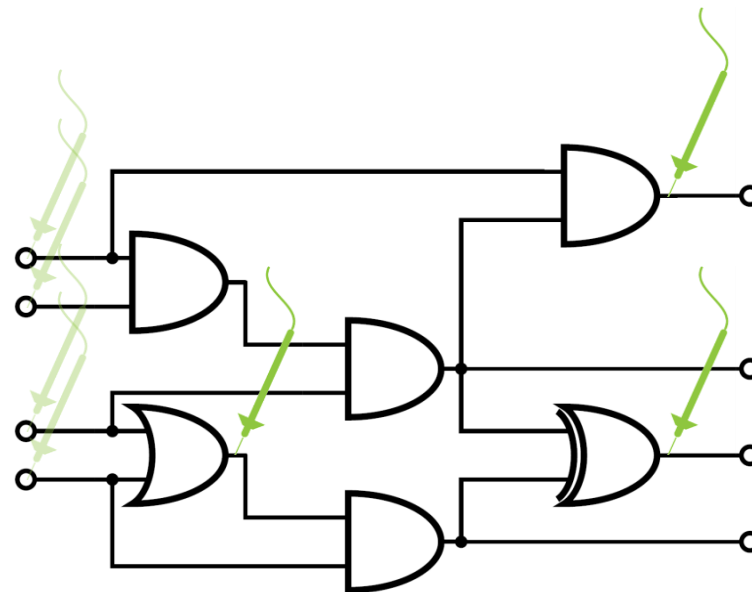
Hardware circuits do not behave as ideal circuits.

GLITCHES IN HARDWARE CIRCUITS:

- transient and unintentional computations
- can provide secret-dependent information
- sequential gates (e.g., flip-flops) stop glitches

HOW TO CONSIDER GLITCHES IN PROBING MODEL?

- *glitch can reveal any combination of stable inputs*
- *glitch-extended probes (worst-case scenario)*



PROBING SECURITY

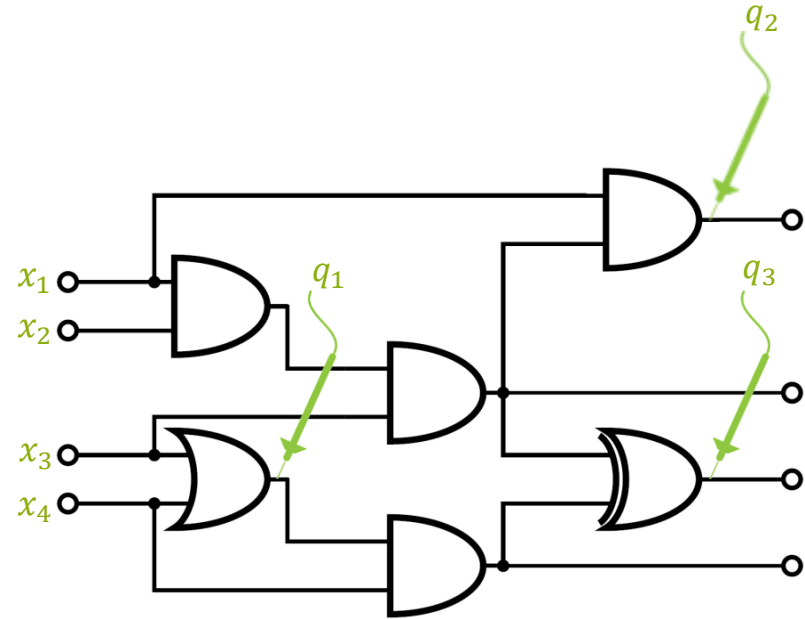
How to formally define side-channel security?

THE DEFINITION:

A circuit C with secret input set \mathbf{X} is d -probing secure, if and only if for any observation set \mathbf{Q} containing d (probed) wires, \mathbf{X} is statistically independent of the observation set:

$$Pr[\mathbf{Q}|\mathbf{X}] = Pr[\mathbf{Q}]$$

- \mathbf{Q} : joint distribution of probes
- \mathbf{X} : joint distribution of secret values (unshared)
- modeling wires as binary random variables
- all primary inputs are assumed to be *independent and identically distributed (i.i.d.)*



Probing Security

Gadgets and Composability

THE CHALLENGE:

Design complexity increases with circuit size (number of gates) and d (number of probes).

THE APPROACH:

- masking of atomic functions (gadgets)
- compose full circuit of secure gadgets.

THE PROBLEM:

Composition of secure gadgets is not trivial and often results in insecure designs.



COMPOSABILITY

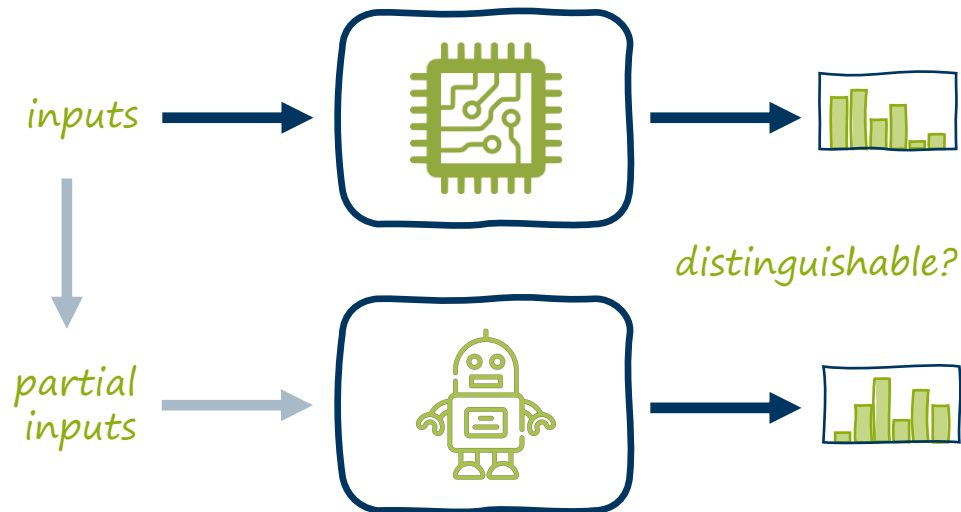
How to securely compose masked gadgets?

Composability

Non-Interference (NI) [BBD+15]

NON-INTERFERENCE & SIMULATABILITY:

- construction of a simulator for each probe
- simulator operates on partial information:
 - *uses $\leq d$ shares of secret variable*
 - *simulated distribution vs. observed distribution*
- secure if we can find a simulator such that the distributions are indistinguishable
- ensures composability (*spoiler: no!*)



OUR CONTRIBUTION:

- non-interference based on statistical independence
- allows arbitrary sharings and number of secrets

Composability

d-Non-Interference (NI)

THE DEFINITION:

A circuit C with secret input set \mathbf{X} is d -non-interfering, if and only if for any observation set \mathbf{Q} containing $t \leq d$ (probed) wires, there exists a set \mathbf{S} of input shares with $|\mathbf{S}_{v_i}| \leq t$ such that

$$\Pr[\mathbf{Q}|\mathbf{S}] = \Pr[\mathbf{Q}|\text{Sh}(\mathbf{X})]$$

- \mathbf{Q} : joint distribution of probes
- \mathbf{S} : joint distribution of subset of secret shares
- $\text{Sh}(\mathbf{X})$: joint distribution all secret shares



Adversary may learn partial information without interference on processed secrets.

Composability

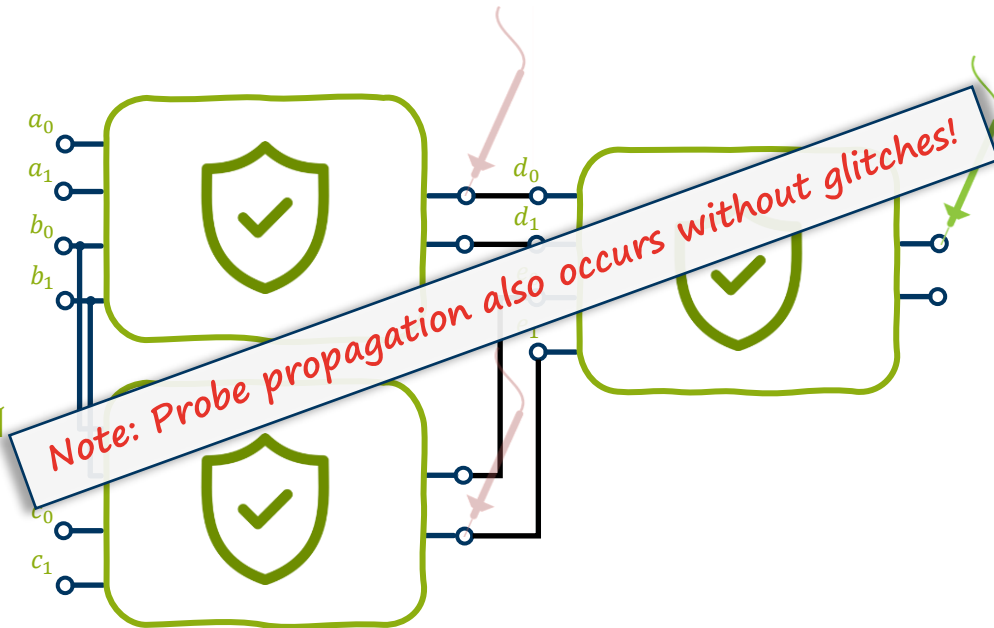
Non-Interference (NI) [BBD+15]

THE PROBLEM:

Probe propagation limits composability.

AN EXAMPLE:

- composition of three gadgets ($d \leq 1$)
- single probe on output of last gadget
- adversary learns d_0 and e_1 (distributions)
 - (virtual) probes on outputs of gadgets
 - adversary learns b_0, b_1 (distributions)



Composability

Strong Non-Interference (SNI) [BBD+16]

THE SOLUTION:

Stop propagation of output probes.

THE DEFINITION:

A circuit C with secret input set X is d -strong-non-interfering, if and only if for any observation set Q containing $t = t_1 + t_2 \leq d$ (probed) wires, there exists a set S of input shares with $|S_{v_i}| \leq t_1$ such that

$$Pr[Q|S] = Pr[Q|Sh(X)]$$

→ t_1 : number of probed internal wires

→ t_2 : number of probed output wires

Adversary may only learn partial information when probing internal wires.



Composability

Strong Non-Interference (SNI) [BBD+16]

A PROBLEM:

Trivial gadgets of linear operations are **not** strong non-interfering.

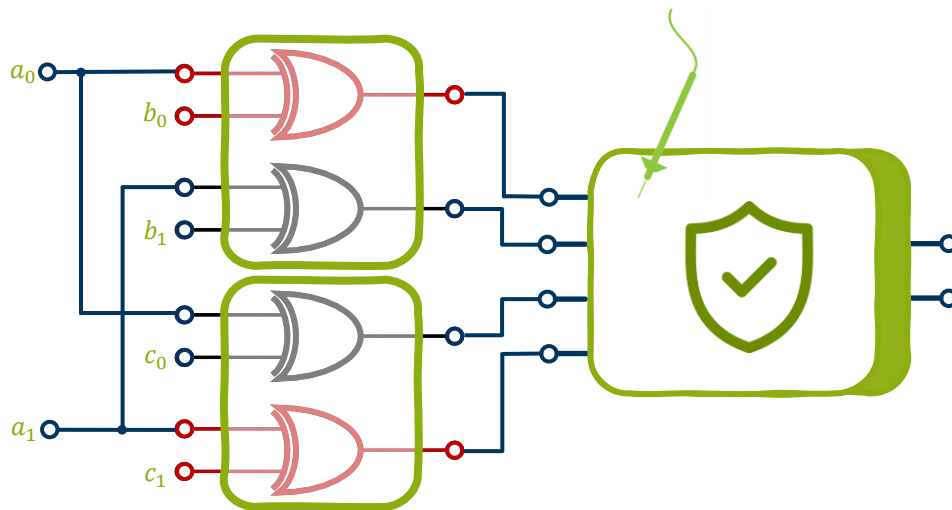
AN EXAMPLE:

- composition of a secure gadget ($d \leq 1$)
 - two trivial linear gadgets on the inputs
 - linear gadgets share one input
- adversary learns a_0, a_1 with one probe

THE SOLUTION:

Refreshing linear operations (at least one) to provide strong non-interference.

Expensive and inefficient!



$$f(a, b, c) = (a + b)(a + c)$$

Composability

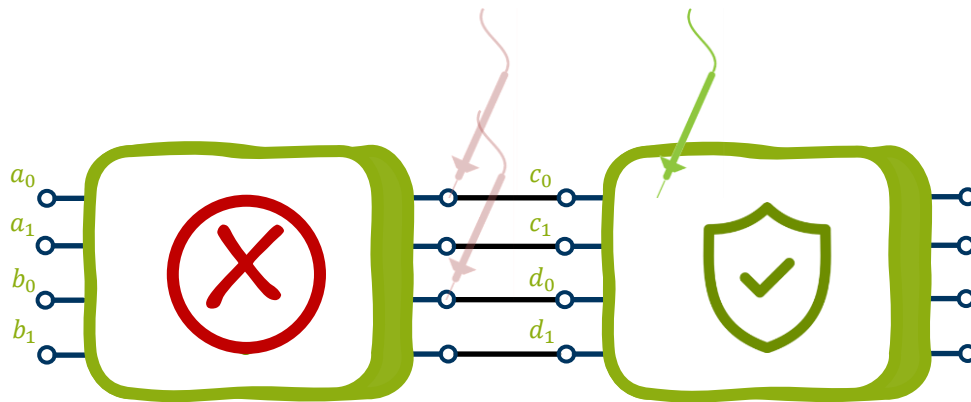
Strong Non-Interference (SNI) [BBD+16]

ANOTHER PROBLEM:

Strong non-interference is limited to single-output gadgets.

AN EXAMPLE:

- composition of two secure gadgets ($d \leq 1$)
- single internal probe on 2nd gadget
- adversary learns c_0 and d_0 (distributions)
 - same as having two probes on 1st gadget
 - violates security assumptions for gadget
 - worst-case: adversary learns all inputs



THE SOLUTION:

Ensure domain isolation for probe propagation.

THE DEFINITION:

A circuit C with secret input set X is d -probe-isolating-non-interfering, if and only if for any observation set Q containing $t = t_1 + t_2 \leq d$ (probed) wires, there exist sets I_{PI} and I_{PO} such that $S = Sh(X)^{I_{PI} \cup I_{PO}}$ and

$$Pr[Q|S] = Pr[Q|Sh(X)]$$

→ I_{PI} : primary input indices, $|I_{PI}| \leq t_1$

→ I_{PO} : (probed) primary output indices, $|I_{PO}| \leq t_2$

Output probes propagate to same input index,
internal probes propagate to at most one (additional) input index.



VERIFICATION

How to formally verify security notions for adversary models?

State-of-the-art in formal verification

Language-Based Formal Verification (maskVerif) [BBC+19]

THE STATE-OF-THE-ART IN FORMAL VERIFICATION OF MASKING SCHEMES IN HARDWARE:

→ maskVerif: *language-based tool with wide range of features*

THE PROBLEM:

- *language-based verification not in direct conformity with security notions*
- *worst-case: may report false negatives*

OUR MISSION:

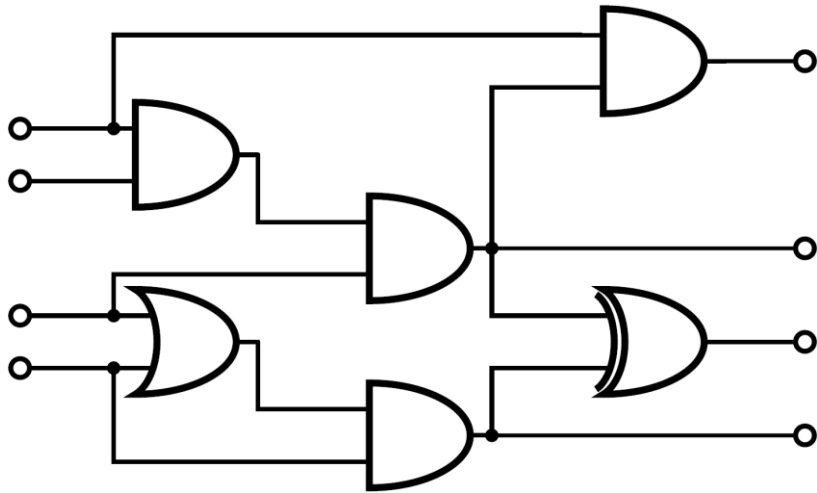
→ sound and complete verification in direct conformity with security notions

source: <https://cryptoexperts.com/maskverif/>

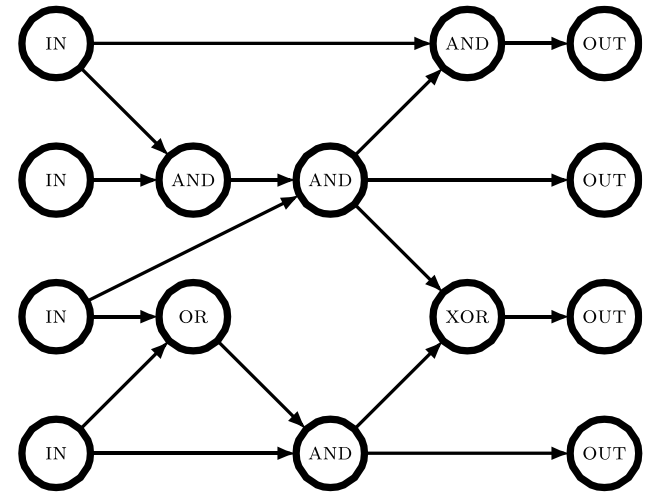


Verification approach

Modeling Circuits & Netlists



modeling

NETLIST:

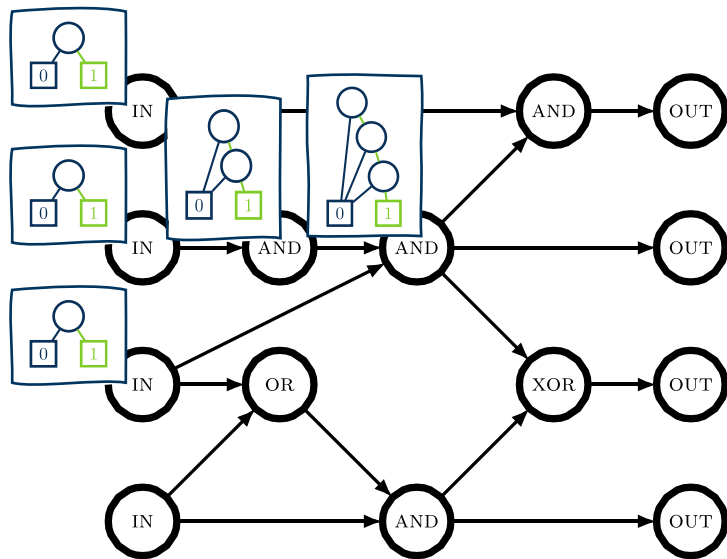
- *Hardware Description Language (Verilog or VHDL)*
- *constructed over cell library (e.g., NAND45)*
- *list of gates (sequential & combinational) and wires*
- *flatten vs. hierarchical (modules)*

CIRCUIT MODEL:

- *Directed Acyclic Graph (DAC)*
 → *vertices: gates, edges: wires*
- *limited set of combinational gates:*
 → NOT, AND, NAND, OR, NOR, XOR, XNOR

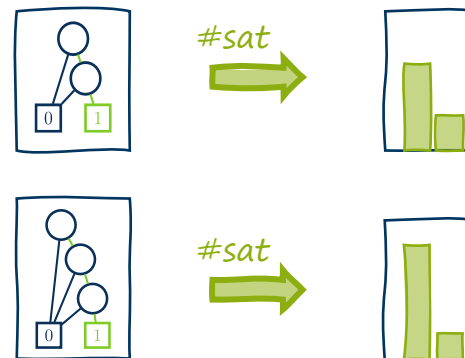
Verification approach

Checking Probability Distributions and Statistical Independence



REDUCED ORDERED BINARY DECISION DIAGRAMS:

- recursive generation of BDDs for each node
- requires topologically sorted graph



PROBABILITY DISTRIBUTIONS:

- counting satisfiable solutions ($\#P$ -complete)
- implicit assumption on i.i.d. inputs
- statistical independence on binary events

Verification approach

Analysis of Security and Composability Notions

RECAP OF DEFINITIONS

- *probing security:* $Pr[\mathbf{Q}|\mathbf{X}] = Pr[\mathbf{Q}]$
- *composability notions:* $Pr[\mathbf{Q}|\mathbf{S}] = Pr[\mathbf{Q}|Sh(\mathbf{X})]$

ANALYSIS

1. *construction of probing sets \mathbf{Q} (all combinations of d probes)*
2. *construction of set of unshared secrets \mathbf{X} (probing security)*
3. *construction of set of partial inputs \mathbf{S} (according to composability notion)*
4. *generation of joint distributions for all sets (using BDDs & #sat)*
5. *checking statistical independence according to definitions*

COMPLEXITY AND LIMITATIONS

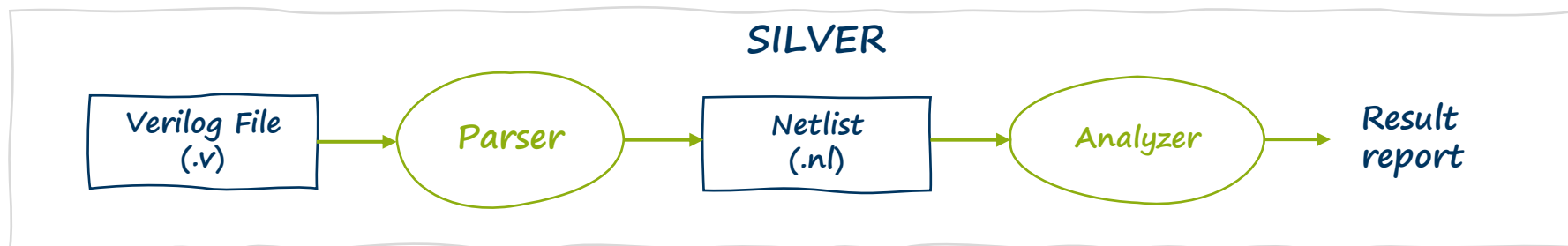
- *higher-order testing limited by circuit size and order d : #sets = $\binom{\#gates}{\#probes}$*
- *BDD sizes limited by number of variables (primary circuit inputs)*



SILVER

Statistical Independence and Leakage Verification

The General Verification Flow

**PARSER:**

- reads synthesized netlist (Verilog)
 - reduced number of gates supported
 - annotations for inputs/outputs
- creates (custom) intermediate representation
 - topologically sorted list of instructions
 - adds input, output, and refresh instructions

ANALYZER:

- constructs DAG from instructions
- elaborates DAG (ROBDD generation)
 - ROBDD for each gate in graph
 - recursive construction from input ROBDDs
- Generates probe combinations & performs analysis of security notions

List of Features

PROBING SECURITY

- *current version limited to Boolean masking*
 - *reports first failing combination of up to d probes*
- *standard (SW) and glitch-extended (HW) model*

COMPOSABILITY NOTIONS

- *d -Non-Interference (d -NI)*
- *d -Strong-Non-Interference (d -SNI)*
- *d -Probe-Isolating-Non-Interference (d -PINI)*

→ *standard (SW) and glitch-extended (HW) model*

OUTPUT UNIFORMITY

- *redefinition of uniformity over balanced outputs*
- *not covered in this talk (cf. paper for more details)*

```
[ 0.000] Netlist: test/isw/isw1.nl
[ 0.002] Parse: 16 gate(s) / 19 signal(s)
[ 0.005] Elaborate: 1 register stage(s) / 6 logic layer(s)
[ 0.006] probing.standard (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.007] probing.robust (d ≤ 1) -- FAIL. [1ms]   >> Probes: <out:line16>
[ 0.009] NI.standard (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.010] NI.robust (d ≤ 1) -- FAIL. [1ms]   >> Probes: <out:line16>
[ 0.010] SNI.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.011] SNI.robust (d ≤ 1) -- FAIL. [0ms]   >> Probes: <out:line15>
[ 0.012] PINI.standard (d ≤ 1) -- FAIL. [0ms]   >> Probes: <and:line6>
[ 0.012] PINI.robust (d ≤ 1) -- FAIL. [0ms]   >> Probes: <reg:line12>
[ 0.012] uniform.standard -- PASS. [0ms]
```

```
[ 0.000] Netlist: test/dom/dom1.nl
[ 0.002] Parse: 19 gate(s) / 22 signal(s)
[ 0.005] Elaborate: 1 register stage(s) / 5 logic layer(s)
[ 0.006] probing.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.008] probing.robust (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.010] NI.standard (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.013] NI.robust (d ≤ 1) -- PASS. [3ms]   >> Probes: <in:line1,in:line2>
[ 0.013] SNI.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.014] SNI.robust (d ≤ 1) -- FAIL. [0ms]   >> Probes: <out:line18>
[ 0.014] PINI.standard (d ≤ 1) -- FAIL. [0ms]   >> Probes: <and:line6>
[ 0.014] PINI.robust (d ≤ 1) -- FAIL. [0ms]   >> Probes: <reg:line14>
[ 0.015] uniform.standard -- PASS. [0ms]
```

```
[ 0.000] Netlist: test/hpc/hpc1_1.nl
[ 0.002] Parse: 22 gate(s) / 26 signal(s)
[ 0.004] Elaborate: 2 register stage(s) / 7 logic layer(s)
[ 0.004] probing.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.005] probing.robust (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.006] NI.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.009] NI.robust (d ≤ 1) -- PASS. [2ms]   >> Probes: <in:line1,in:line2>
[ 0.009] SNI.standard (d ≤ 1) -- PASS. [0ms]   >> Probes: <in:line1,in:line2>
[ 0.009] SNI.robust (d ≤ 1) -- FAIL. [0ms]   >> Probes: <out:line21>
[ 0.011] PINI.standard (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.013] PINI.robust (d ≤ 1) -- PASS. [1ms]   >> Probes: <in:line1,in:line2>
[ 0.013] uniform.standard -- PASS. [0ms]
```

Discussion: Advantages & Limitations

ADVANTAGES:

→ **Completeness**

SILVER supports all recent and established security and composability notions.

→ **Soundness**

SILVER avoids false negatives & overhead due to direct conformity to the security notions.

→ **Verbosity**

SILVER directly reports failing probes, allowing an easier fix of masked design.

LIMITATIONS:

→ **Performance:**

Due to its direct conformity with security notions, SILVER is slower than language-based approaches (e.g., maskVerif).

DEMO

SILVER

CONCLUSION

Your free takeaway for today :)

Formal Verification of Masking Schemes in Hardware

1. **Secure implementation of masking schemes in hardware is a challenging:**
 - *manual, complex, and error-prone task requiring longstanding expertise*
 - *downstream testing & evaluation results in long development cycles*
2. **Formal verification provides early feedback to designers (shorten development cycles)**
 - *ISW d-probing model to define adversarial capabilities*
 - *composability notions reduce complexity in verification and construction*
 - *direct conformity with security notions avoids false negatives*

SILVER

is an **easy-to-use** tool for **sound** and **complete** verification of the **security** and **composability** of masked implementations.

Open Challenges and Future Work

1. HANDLING COMPLEXITY

- *verification of larger circuits and complex systems*
- *verification of higher-order security*

2. IMPROVING SECURITY NOTIONS

- *efficient construction of gadgets (randomness, area, latency, performance, power, ...)*

3. NON-CRYPTOGRAPHIC HARDWARE DESIGNS

- *verification of micro-controllers, CPUs, etc.*

4. BEYOND FORMAL VERIFICATION

- *automated generation of secure designs*
- *automated repairing and optimization of designs (computer-aided design)*

5. AND MUCH MORE...

FURTHER DETAILS

Source code, documentation, contact details, references

SOURCE CODE & TOOL:

<https://github.com/Chair-for-Security-Engineering/SILVER>

DOCUMENT:

<https://eprint.iacr.org/2020/634.pdf>

CONTACTS:

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Pascal Sasdrich (pascal.sasdrich@rub.de)

Amir Moradi (amir.moradi@rub.de)

README.md

🔗 SILVER - Statistical Independence and Leakage Verification

This repository contains the source code for the paper [SILVER - Statistical Independence and Leakage Verification](#).

🔗 Features

SILVER is a framework written in C++ which particularly relies on Reduced Ordered Binary Decision Diagrams (ROBDDs) and the concept of statistical independence of probability distributions. This framework allows to analyze and verify masked implementations (given as verilog design or instruction list) against the following security notions (using different security models as reference):

- Probing Security (standard / robust model)
- Non-Interference Security (standard / robust model)
- Strong Non-Interference Security (standard / robust model)
- Probe-Isolating Non-Interference Security (standard / robust model)
- Uniformity (of output sharing)

🔗 Contact and Support

Please contact Pascal Sasdrich (pascal.sasdrich@rub.de) if you have any questions, comments, if you found a bug that should be corrected, or if you want to reuse the framework or parts of it for your own research projects.

- [ISW03]** Yuval Ishai, Amit Sahai, David A. Wagner: *Private Circuits: Securing Hardware against Probing Attacks*. (CRYPTO 2003: 463-481)
- [BBD+15]** Gilles Barthe, Sonia Belaïd, François Dupressoir, Pierre-Alain Fouque, Benjamin Grégoire, Pierre-Yves Strub: *Verified Proofs of Higher-Order Masking*. (EUROCRYPT 2015: 457-485)
- [BBD+16]** Gilles Barthe, Sonia Belaïd, François Dupressoir, Pierre-Alain Fouque, Benjamin Grégoire, Pierre-Yves Strub, Rébecca Zucchini: *Strong Non-Interference and Type-Directed Higher-Order Masking*. (CCS 2016: 116-129)
- [BDF+17]** Gilles Barthe, François Dupressoir, Sebastian Faust, Benjamin Grégoire, François-Xavier Standaert, Pierre-Yves Strub: *Parallel Implementations of Masking Schemes and the Bounded Moment Leakage Model*. (EUROCRYPT 2017: 535-566)
- [FGP+18]** Sebastian Faust, Vincent Grosso, Santos Merino Del Pozo, Clara Paglialonga, François-Xavier Standaert: *Composable Masking Schemes in the Presence of Physical Defaults & the Robust Probing Model*. (IACR TCHES 2018(3): 89-120)
- [BBC+19]** Gilles Barthe, Sonia Belaïd, Gaëtan Cassiers, Pierre-Alain Fouque, Benjamin Grégoire, François-Xavier Standaert: *maskVerif: Automated Verification of Higher-Order Masking in Presence of Physical Defaults*. (ESORICS 2019: 300-318)
- [CS20]** Gaëtan Cassiers, François-Xavier Standaert: *Trivially and Efficiently Composing Masked Gadgets With Probe Isolating Non-Interference*. (IEEE Transactions on Information Forensics & Security 15, 2020: 2542-2555)



Thank you!

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