



Emulating Power Attacks with *gem5*

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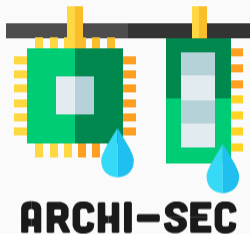
Journée thématique « sécurité matérielle et open-source »

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1. Motivation
2. State of the Art
3. The *gem5* simulator
4. Materials and methods
5. Final remarks

Motivation

Power attacks leverage the power distribution network of the target.

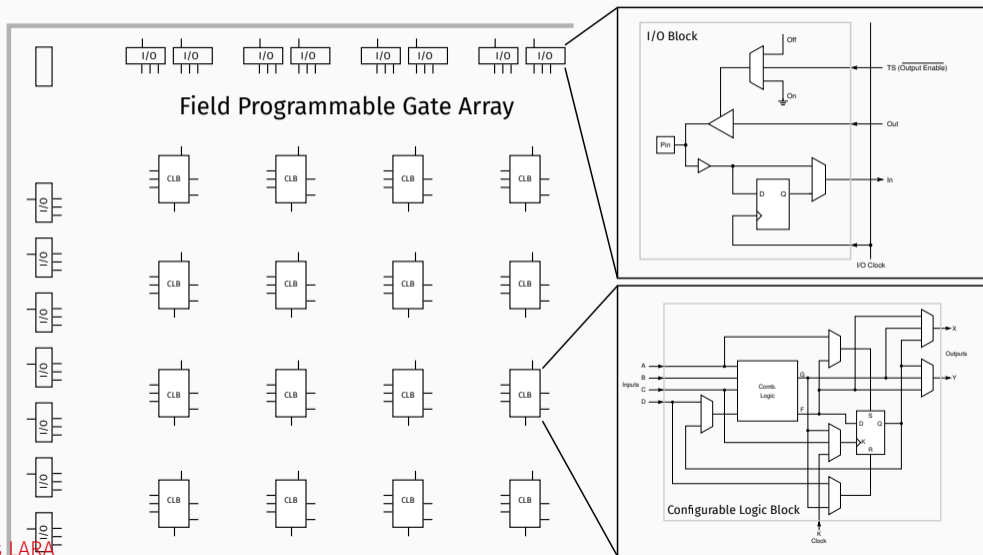
Attack goals

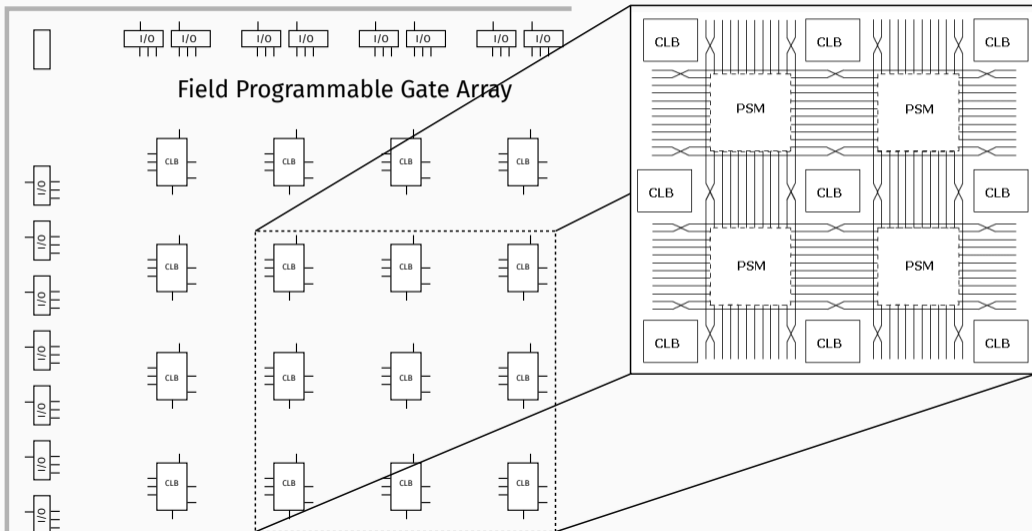
- Power analysis
- Covert data transmission
- Fault injection and denial of service

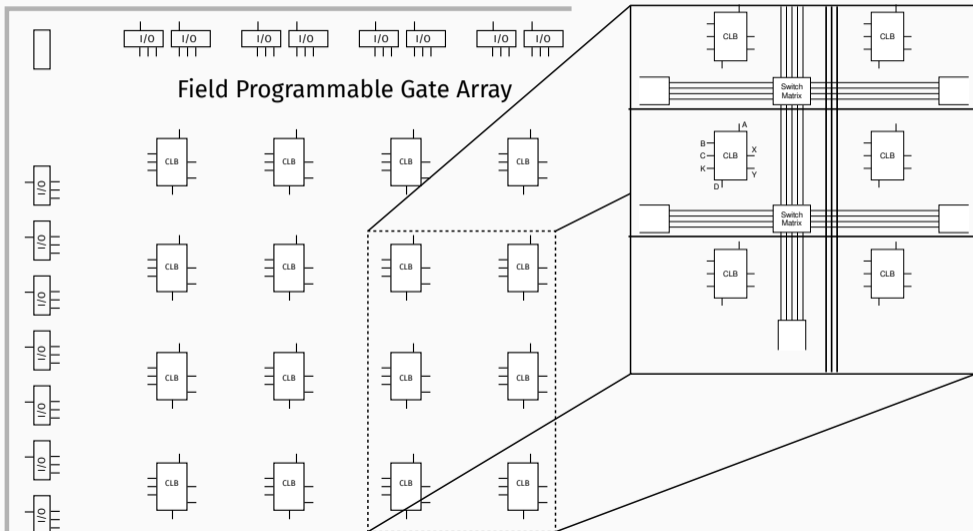
Power attacks leverage the power distribution network of the target.

Attack goals

- Power analysis
- Covert data transmission
- Fault injection and denial of service







Conventional

- physical access to the device
- sophisticated equipment
- physical tampering **and** logical tampering

Remote

- connected devices
- leverages the internal components of the chip (reconfigurable logic, memories)
- software vulnerabilities **and** logical tampering

Remote power analysis

- 2018 Zhao, M., & Suh, G. E.
FPGA-based remote power side-channel attacks.
- 2021 Schellenberg, F., Gnad, D. R., Moradi, A., & Tahoori, M. B.
An inside job: Remote power analysis attacks on FPGAs.

Internal sensors

- 2010 Franco, J. J. L., Boemo, E., Castillo, E., & Parrilla, L.
Ring oscillators as thermal sensors in FPGAs: Experiments in low voltage.
- 2013 Zick, K. M., Srivastav, M., Zhang, W., & French, M.
Sensing nanosecond-scale voltage attacks and natural transients in FPGAs.
- 2019 Gravellier, J., Dutertre, J. M., Teglia, Y., & Loubet-Moundi, P.
High-speed ring oscillator based sensors for remote side-channel attacks on FPGAs.
- 2019 Giechaskiel, I., Eguro, K., & Rasmussen, K. B.
Leakier wires: Exploiting FPGA long wires for covert-and side-channel attacks.
- 2021 Gravellier, J., Dutertre, J. M., Teglia, Y., & Moundi, P. L.
Sideline: How delay-lines (may) leak secrets from your SoC.
- 2023 Spielmann, D., Glamočanin, O., & Stojilović, M.
RDS: FPGA Routing Delay Sensors for Effective Remote Power Analysis Attacks.

Power covert channels

- 2010 Ziener, D., Baueregger, F., & Teich, J.
Using the power side channel of FPGAs for communication.
- 2021 Gnad, D. R., Nguyen, C. D. K., Gillani, S. H., & Tahoori, M. B.
Voltage-based covert channels using FPGAs.

Combined internal attacks

- 2023 Fella-Touta, A., Bossuet, L., & Lara-Nino, C. A.
Combined Internal Attacks on SoC-FPGAs: Breaking AES with Remote Power Analysis and Frequency-based Covert Channels.

Masking

- 2013 Prouff, E., & Rivain, M.
Masking against side-channel attacks: A formal security proof.

Isolation

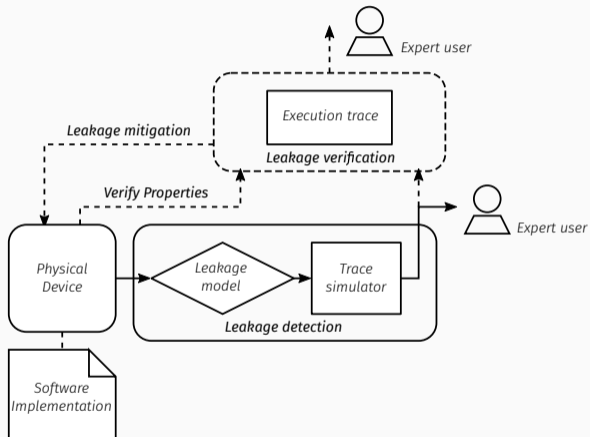
- 2019 Krautter, J., Gnad, D. R., Schellenberg, F., Moradi, A., & Tahoori, M. B.
Active fences against voltage-based side channels in multi-tenant FPGAs.

Inspection of binaries

- 2018 Gnad, D. R., Rapp, S., Krautter, J., & Tahoori, M. B.
Checking for electrical level security threats in bitstreams for multi-tenant FPGAs.
- 2020 La, T. M., Matas, K., Grunchevski, N., Pham, K. D., & Koch, D.
FPGAdefender: Malicious self-oscillator scanning for Xilinx UltraScale+ FPGAs

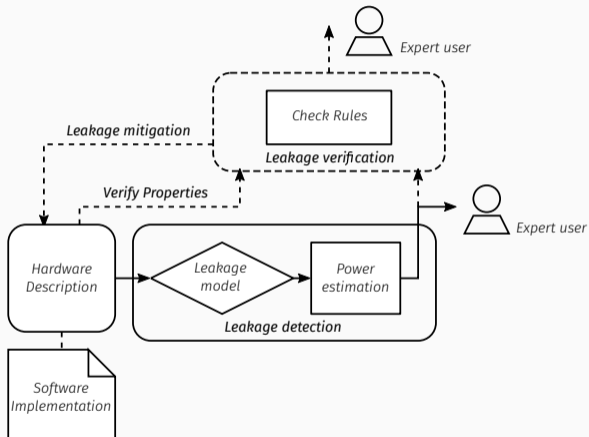
- Some of these techniques must be adjusted to the algorithm
- Require extensive testing to confirm their effectiveness
- Some protections might be more effective in a specific platform

Tooling for the study of power attacks



1

¹Buhan, I., Batina, L., Yarom, Y., & Schaumont, P. (2022, May). SoK: Design tools for side-channel-aware implementations. In *Proceedings of the 2022 ACM on Asia Conference on Computer and Communications Security (Asia CCS)* (pp. 756-770).



2

²Buhan, I., Batina, L., Yarom, Y., & Schaumont, P. (2022, May). SoK: Design tools for side-channel-aware implementations. In *Proceedings of the 2022 ACM on Asia Conference on Computer and Communications Security (Asia CCS)* (pp. 756-770).

Leakage verification

- 2013 S. A. Huss, M. Stöttinger, and M. Zohner.
AMASIVE: An Adaptable and Modular Autonomous Side-Channel Vulnerability Evaluation Framework.
- 2014 D. Walters, A. Hagen, and E. Kedaigle.
SLEAK: A Side-Channel Leakage Evaluator and Analysis Kit.
- 2018 Y. L. Corre, J. Großschädl, and D. Dinu.
Micro-architectural Power Simulator for Leakage Assessment of Cryptographic Software on ARM Cortex-M3 Processors. (MAPS)
- 2019 P. Slpsk, P. K. Vairam, C. Rebeiro, and V. Kamakoti.
KARNA: A Gate-Sizing based Security Aware EDA Flow for Improved Power Side-Channel Attack Protection.

Leakage verification

- 2020 A. Nahiyani, J. Park, M. T. He, Y. Iskander, F. Farahmandi, D. Forte, and M. Tehranipoor.
SCRIPT: A CAD Framework for Power Side-channel Vulnerability Assessment Using Information Flow Tracking and Pattern Generation.
- 2021 A. Jahania and V. Samadi Bokharaie.
Power side-channel leakage assessment and locating the exact sources of leakage at the early stages of ASIC design process. (PATCH)
- 2021 B. Gigerl, V. Hadzic, R. Primas, S. Mangard, and R. Bloem.
Coco: Co-Design and Co-Verification of Masked Software Implementations on CPUs.

Leakage detection

- 2019 M. He, J. Park, A. Nahiyani, A. Vassilev, Y. Jin, and M. Tehranipoor.
RTL-PSC: Automated Power Side-Channel Leakage Assessment at Register-Transfer Level.
- 2020 M. A. K. F., V. Ganesan, R. Bodduna, and C. Rebeiro.
PARAM: A Microprocessor Hardened for Power Side-Channel Attack Resistance
- 2020 Y. Yao, T. Kathuria, B. Ege, and P. Schaumont.
Architecture Correlation Analysis (ACA): Identifying the Source of Side-channel Leakage at Gate-level.
- 2020 D. Sijacic, J. Balasch, B. Yang, S. Ghosh, and I. Verbauwhede.
Towards efficient and automated side-channel evaluations at design time. (CASCADE)

Leakage detection

Tool	Year	Input	Target device	Masking	Open source
RTL-PSC	2019	RTL	AES	No	No
PARAM	2020	Gate layout	RISC-V	No	No
ACA	2020	Gate layout	RISC-V	No	No
CASCADE	2020	Gate layout	Generic ASIC	No	Yes

Leakage verification

AMASIVE	2013	RTL	Generic	No	No
SLEAK	2014	ISA	ARM Cortex A8	Yes	No
MAPS	2018	ISA	ARM Cortex M3	Yes	Yes
KARNA	2019	Gate layout	AES, Simon	No	No
SCRIPT	2020	Gate layout	AES	No	No
PATCH	2021	Gate layout	AES	No	No
COCO	2021	Gate layout	RISC-V	Yes	Yes

The *gem5* simulator



- A modular platform for computer-system architecture research
- Encompasses system-level architecture as well as processor microarchitecture
- Precursors :
 - m5 from the University of Michigan
 - GEMS from the University of Wisconsin
- Used by ARM Research, AMD Research, Google, Micron, Metempsy, HP, Samsung³

³<https://www.gem5.org/about/>

- Open source, free for use⁴
- Can emulate the operation of multiple processors including ARM and RISC-V
- Can be extended to model memory⁵ and network⁶ activity

⁴ Lowe-Power, J., Ahmad, A. M., Akram, A., Alian, M., Amslinger, R., Andreozzi, M., ... & Zulian, É. F. The gem5 simulator: Version 20.0+. arXiv:2007.03152.

⁵ Kim, Y., Yang, W., & Mutlu, O. Ramulator: A fast and extensible DRAM simulator. *IEEE Computer architecture letters*, 15(1), 45-49.

⁶ Agarwal, N., Krishna, T., Peh, L. S., & Jha, N. K. GARNET: A detailed on-chip network model inside a full-system simulator. In *2009 IEEE international symposium on performance analysis of systems and software* (pp. 33-42). IEEE.

Study of microarchitectural attacks

- 2021 France, L., Bruguier, F., Mushtaq, M., Novo, D., & Benoit, P.
Implementing Rowhammer Memory Corruption in the gem5 Simulator.
- 2021 Ayoub, P., & Maurice, C.
Reproducing spectre attack with gem5: How to do it right?
- 2023 Bossuet, L. & Lara-Nino, C.A.
Emulating Covert Data Transmission on Heterogeneous SoCs.

- Shallow learning curve
- Long simulation time for complex simulations
- May produce large volumes of data
- The code is updated very often (some of it), the documentation is not

Methods

- A *gem5* simulation creates a large set of statistics associated with the operation of the system
- These data can be used to study the different components in the simulated platform
- As the activity of the multiple underlying components would affect the power consumption of the entire system, we propose that the **simulation statistics** can be used to **approach the electrical behavior** of a simulated platform

$$power = dynamic + static$$

$$dynamic = voltage \times (2A \times ipc + 3pA \times dentry_misses) \quad (1)$$

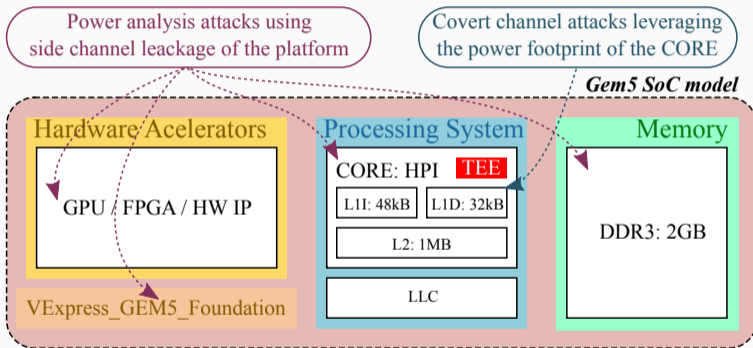
$$static = 4 \times temperature$$

- Our work builds on the *gem5* simulator publicly available⁷
- We focus on **ARM** platforms and use the *opt* level to conduct our experiments
- We employ the *full simulation* as it produces statistics which are closer to those observed in a physical device

⁷ <https://www.gem5.org/>

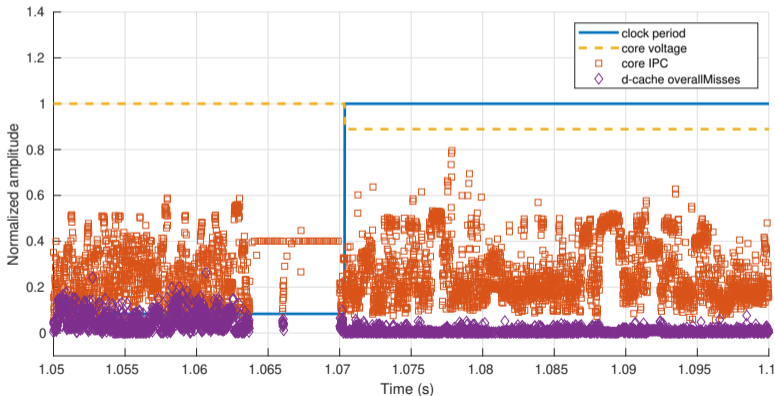
- From every execution of the simulation, *gem5* dumps statistics with a rate of $1E - 3$
- We modified this dump rate to $2.5 \times freq_core$
- It was possible to use a core frequency of 10MHz and an acquisition rate of 25MHz
- We modulated the core frequency to segment the statistics

- *High performance in-order* processor model (Cortex A-53)
- Single core to reduce the complexity of the simulation
- 2GB *DDR3_1600_8x8* unit which was emulated using Ramulator
- L1 and L2 caches as well as a memory management unit
- *VExpress_gem5_Foundation* machine type which allows to execute the *ArmTrustedFirmware* workload
- Included the OP-TEE runtime in the simulation



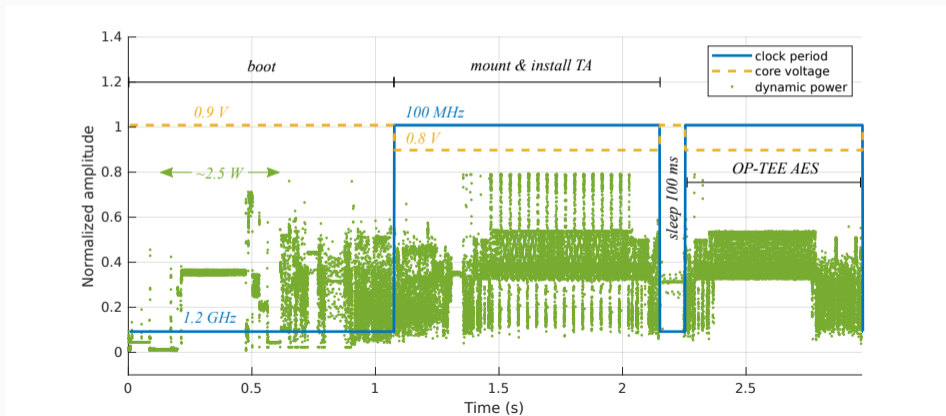
Modeling the power dissipation of a system (cont.)

$$\text{dynamic} = \text{voltage} \times (2A \times \text{ipc} + 3pA \times \text{dentry_misses})$$



Modeling the power dissipation of a system (cont.)

$$\text{dynamic} = \text{voltage} \times (2A \times \text{ipc} + 3\text{pA} \times \text{dentry_misses})$$



Correlation Power Analysis

- We used as case study the power analysis of AES
- We simplified the implementation to the essential operations $c = SBOX(p \oplus k)$
- We tested two key values ($0x2B$, $0x7E$) to analyze whether it was possible to find useful information in the *gem5* output

Require: k , an 8-bit random integer

Require: SBOX, the substitution box of AES

Require: f, f' , two frequencies of the core with $f' < 2f_s$

for $i = 0$ **to** 255 **do**

 cpu_freq $\leftarrow f'$

{Pull trigger}

 SBOX($i \oplus k$)

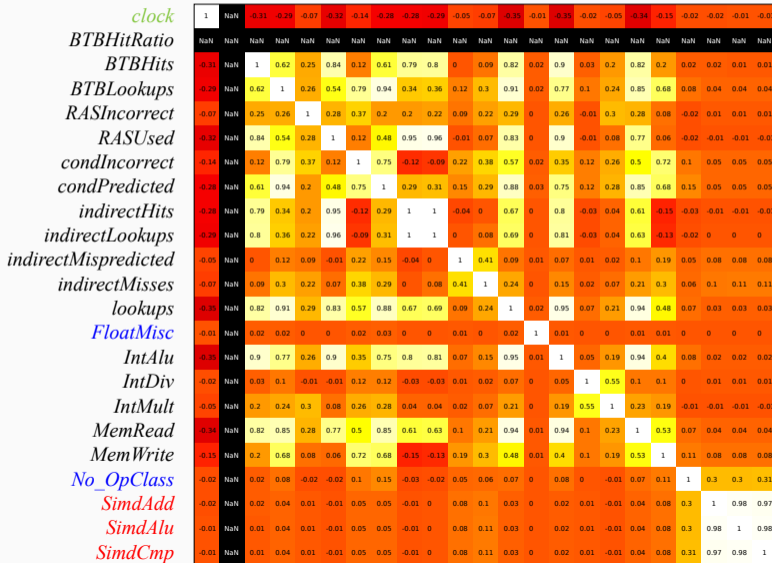
 cpu_freq $\leftarrow f$

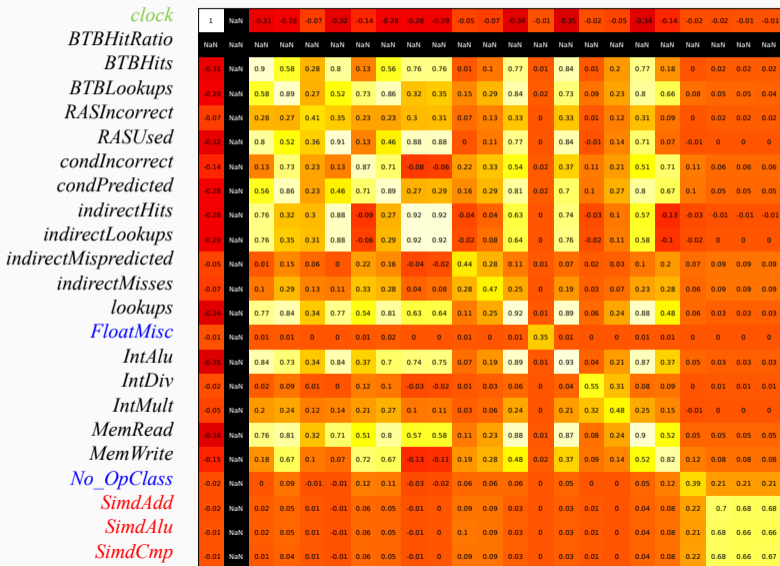
{Release trigger}

 wait

end for

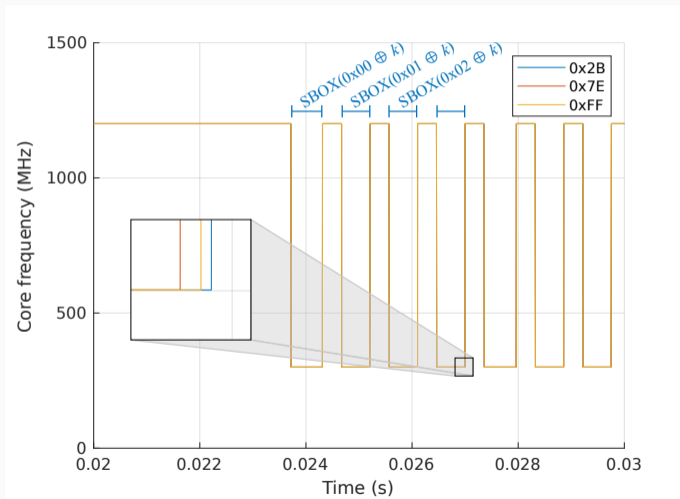
- We obtained over 800 files holding multiple metrics from the simulation
- It was not practical to process all these data with the usual statistical techniques
- We devised a statistical analysis to identify statistics of interest

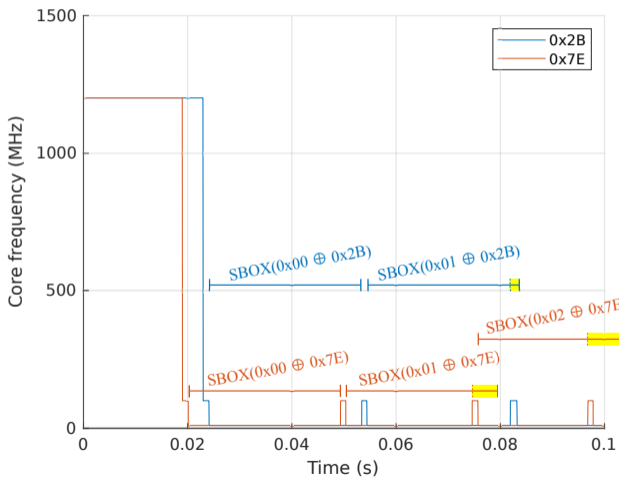




- The auto-correlation discards statistics which are similar
- The cross-correlation finds statistics which change with the secret value
- Low cross-correlation statistics:
 - `dcache.tags.totalRefs`
 - `dtb_walker_cache.tags.totalRefs`
 - `icache.tags.totalRefs`
 - `mmu.alignFaults`
 - `mmu.itb.flushedEntries`
 - `mmu.prefetchFaults`

- When we set $f' = 10\text{MHz}$ and $f_s = 25\text{MHz}$ the fidelity of the analysis decreased
- Capturing 20 traces took over 72h for each key value and yielded 1TB of statistics in each case





- We performed a *Student's t-test* to see if the leakages' distribution differed from one another
- The secret values were the key values `0x2B` and `0x7E`
- Using the raw leakages, no statistics overtook the leakage detection threshold of 4.5
- This confirmed the null hypothesis of the *t-test* that both sets followed the same distribution

- Get a larger set of traces for each key
- Apply signal processing techniques to improve the synchronization of the traces
- Consider attacks on various statistics at the same time

Simple Power Analysis

- As we noticed some accuracy in the timing behavior we attempted to perform timing analysis
- It is quite costly to simulate RSA or ECC
- We analyzed a simple binary-field double-and-add 1024-bit multiplication implemented in C
- **Goal** : Determine whether we could identify the power footprint of large arithmetic operations

Require: $g(t)$, an irreducible polynomial for \mathbb{K}

Require: $a, b \in \mathbb{K}$, two random integers

Require: f, f' , two frequencies of the core with $f' < 2f_s$

cpu_freq $\leftarrow f'$

{Pull trigger}

for $i = 0$ to 5 **do**

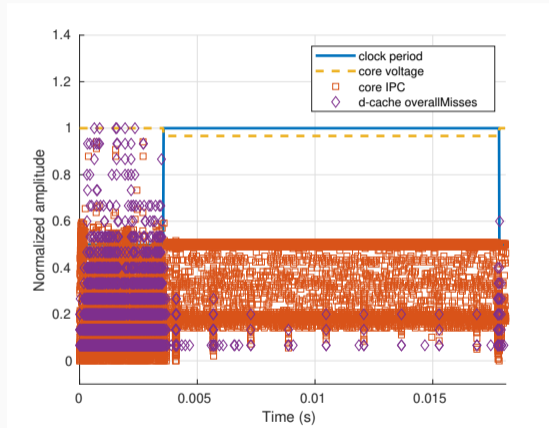
$a \times b \in \mathbb{K}$

end for

cpu_freq $\leftarrow f$

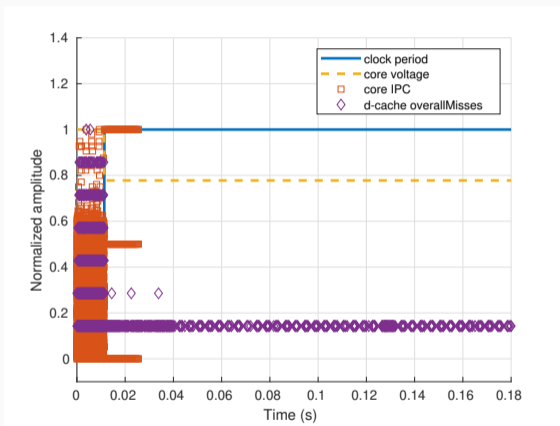
{Release trigger}

- We set the core frequency to 600 MHz and used an acquisition rate of $4E - 8$
- This allowed us to see the activity of the core during processing



We could not find any timing pattern which corresponded with the execution of the multiplications.

- We decreased the core frequency
- This would improve the sampling ratio

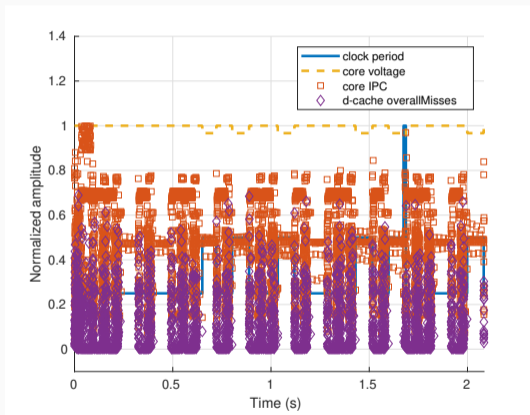


The quality of the statistics made them unusable.

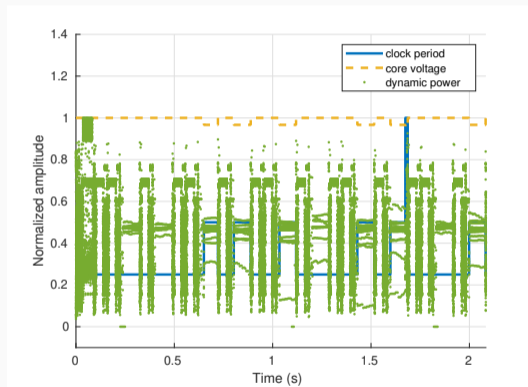
Covert data transmission

- It is possible to use the power footprint of the platform to transfer information covertly
- The adversary leverages the activation of modules in the platform to produce a discernible pattern in the energy consumption of the circuit
- The receiver is generally another component within the system which would not normally be allowed to share a communications channel with the sender

- Employ a trusted application (OP-TEE) to induce a power fluctuation on the platform
- Execute the *optee_example_aes* with a basic “test message” input once or twice



The operations performed by the AES TA have a significant impact on the statistics.



Which would produce a discernible pattern in the power footprint of the system.

Improving the simulation statistics

How it started (2020)

“When `--stats-root` is given, only stats that are under the root *SimObjects* get dumped.”

How it is going (2023)

1. Argument `--stats-root` is defined in *common/Options.py*
 - Even when *Options.py* is imported :
“error: unrecognized arguments: `-stats-root`”
2. Parameter “stats_root” used in the *run* method of *common/Simulation.py*
 - Even though every simulation calls *run()* :
Stats are not filtered even when `--stats-root` is defined.

How to do it

1. Define the `--stats-root` argument in the simulation script :

```
parser.add_argument("--stats-root", action="append", default=[])
```

2. Implement the stat filtering in the simulation script :

```
def main():
...
    instantiate(options)

    stat_root_simobjs = []
    for stat_root_str in options.stats_root:
        stat_root_simobjs.extend(root.get_simobj(stat_root_str))
    m5.stats.global_dump_roots = stat_root_simobjs
    ...
    run()
```


Limitations

1. Can enable statistics at the level of *SimObjects* (cpu, l2, mmu)

```
--stats-root='system.bigCluster.clk_domain'
--stats-root='system.bigCluster.cpus[0]'
--stats-root='system.bigCluster.l2'
```

2. Custom *SimObjects* must define the *path_list* attribute

```
def path_list(self):
    if self._parent:
        return self._parent.path_list() + [self._name]
    else:
        # Don't include the root node
        return []
```

Using the Binary multiplication application, core frequency 100/200 MHz, dump rate of 1E-3.

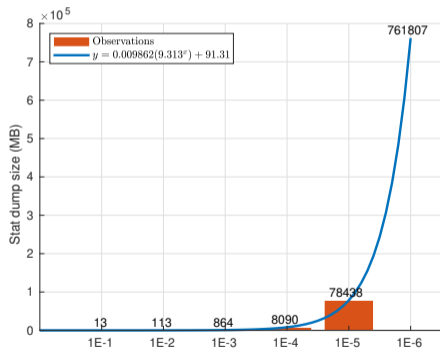
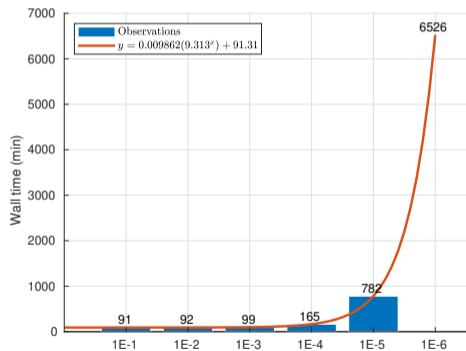
Data volume

1GB → 864 MB

Simulation time

103 min → 99 min

Using the Binary multiplication application, core frequency 100/200 MHz.



Filtering

Create a *SimObject* whose attributes are the statistics of interest. Only whitelist this *SimObject*.

Dump rate

Power analysis does not require a large number of samples, just some samples at the precise time.

Final remarks

- We have investigated the feasibility of using the *gem5* simulator to emulate SCAs on microprocessor systems
- The use of a simulator would like *gem5* allow us to solve problems found in the study of power attacks
- However, some challenges must be overcome to improve the usability of this platform:
 - improve the production of statistics to make their reporting more concise
 - implement mechanisms for enabling or disabling statistics with fine granularity

The multiple sets of statistics used in our experiments as well as the scripts created for processing the data can be accessed freely on <https://github.com/CarlosAndresLARA/power-gem5>

Thanks !
