

# Security of Electronic Devices: Hardware Trojan Detection Through Machine Learning

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## Introduction

### What is a hardware Trojan (HT)?

Malicious inclusion or modification to the original design of the device to allow unauthorised access to the system to corrupt or retrieve secret information.

### Where are these Trojans?

This research is concerned with detection of HTs on Printed Circuit Boards (PCBs) inside electronic devices.

### Why should we even consider HTs?

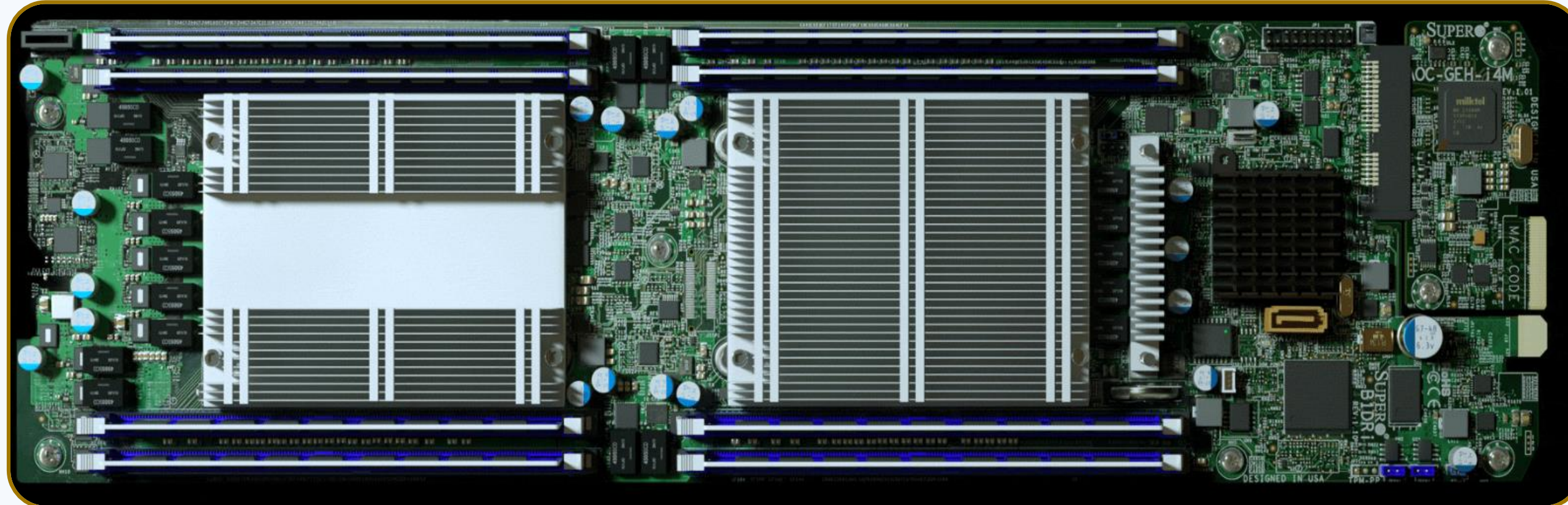
Given our dependence on electronic devices, HTs can have devastating impacts on modern society such as paralysing cloud services and financial systems.

### How can we stop them?

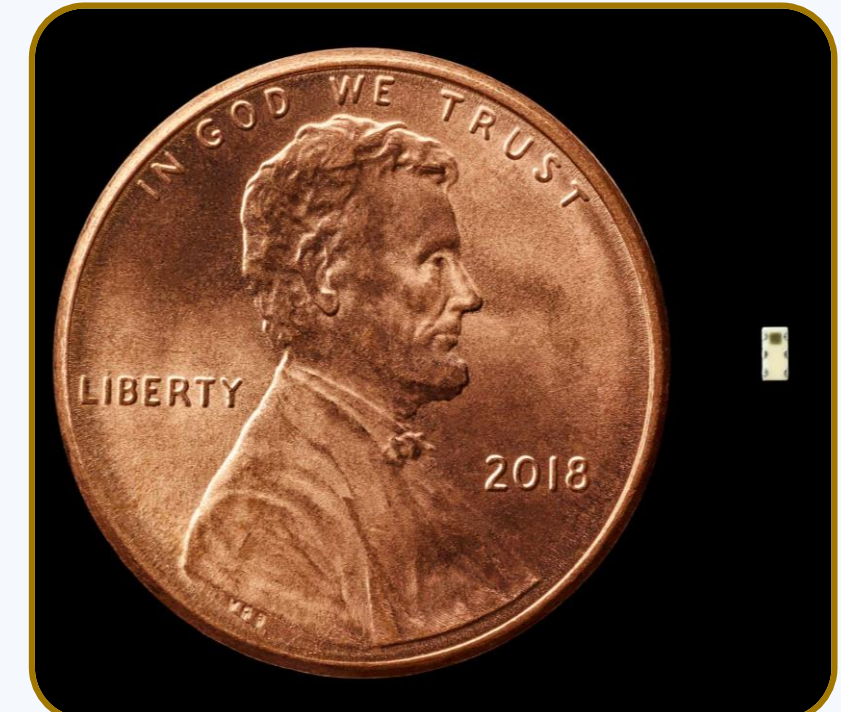
By prospectively developing detection and prevention techniques. The cost of preventing a disaster is lower than recovering from it!



Trojan size visualisation



PCBs are integral parts of electronic devices used across multiple industries



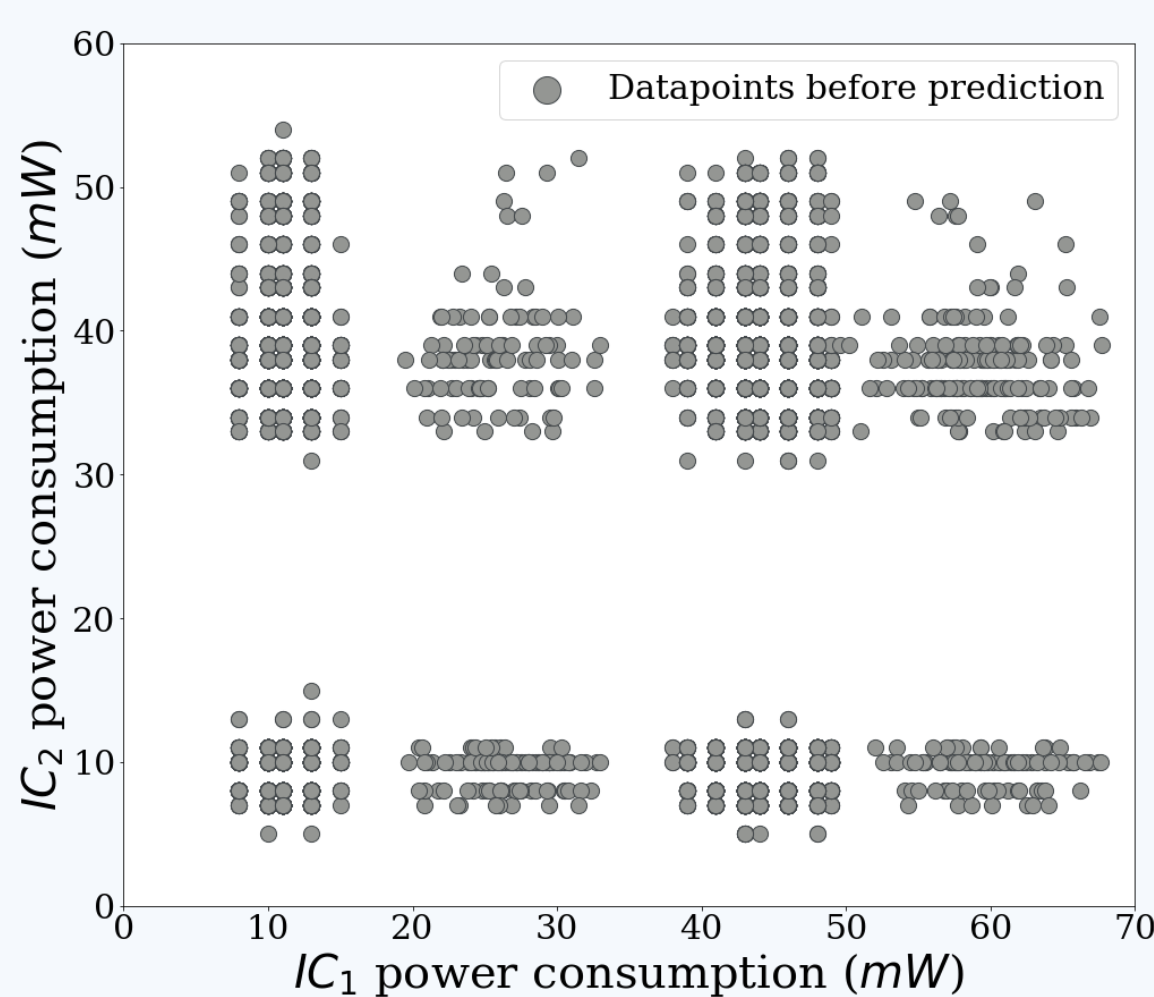
Trojan size visualisation

## Methodology

**Description:** I have developed a methodology that performs real-time detection of hardware Trojans on PCB's. Similar to how a doctor would check the heartbeat of a patient through electrocardiography for irregularities, my methodology monitors the PCB's power consumption pattern to identify anomalies. This is achieved by applying one class classification machine learning algorithms.

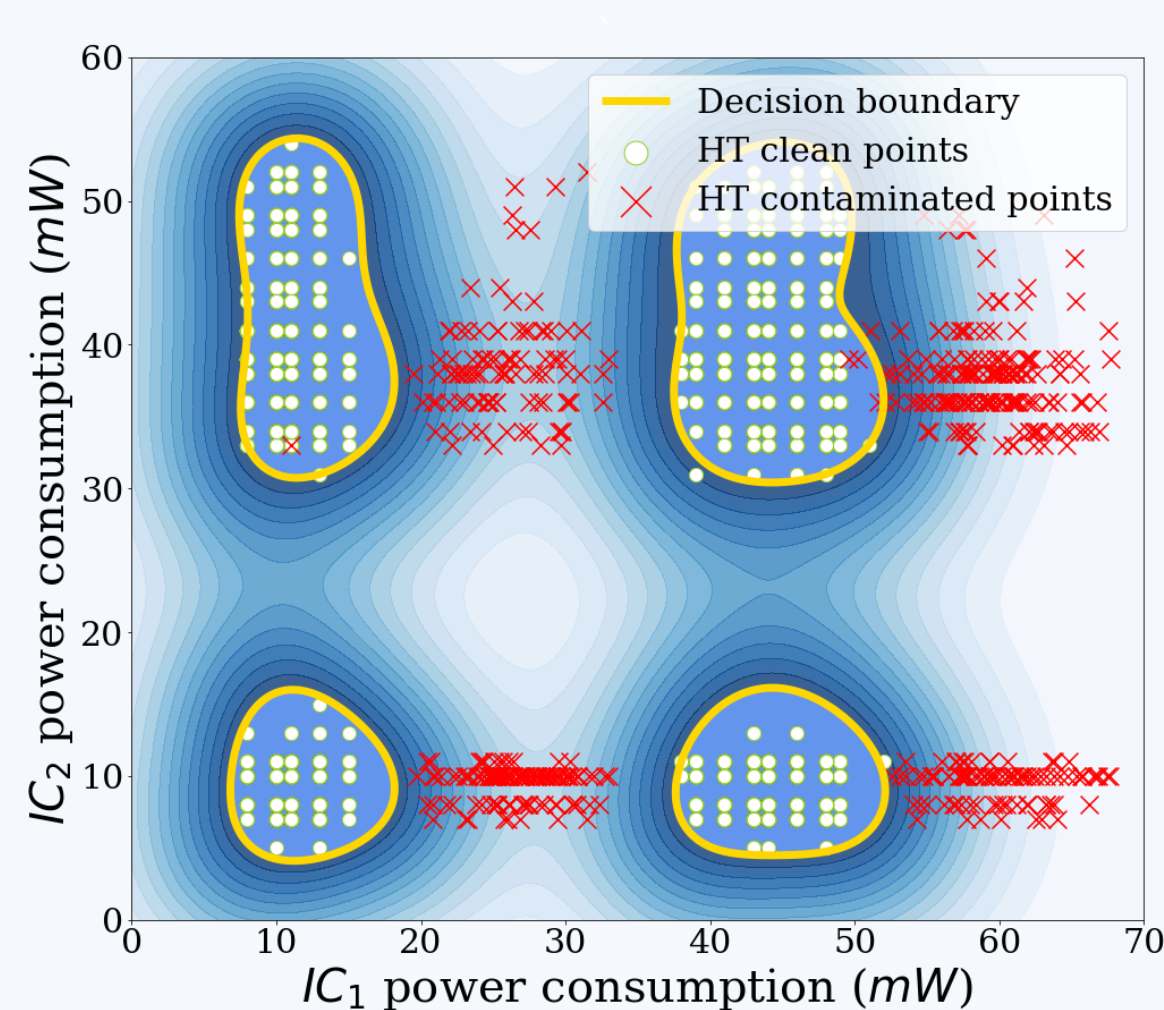
### Task:

Separate Trojan infected datapoints from regular points.



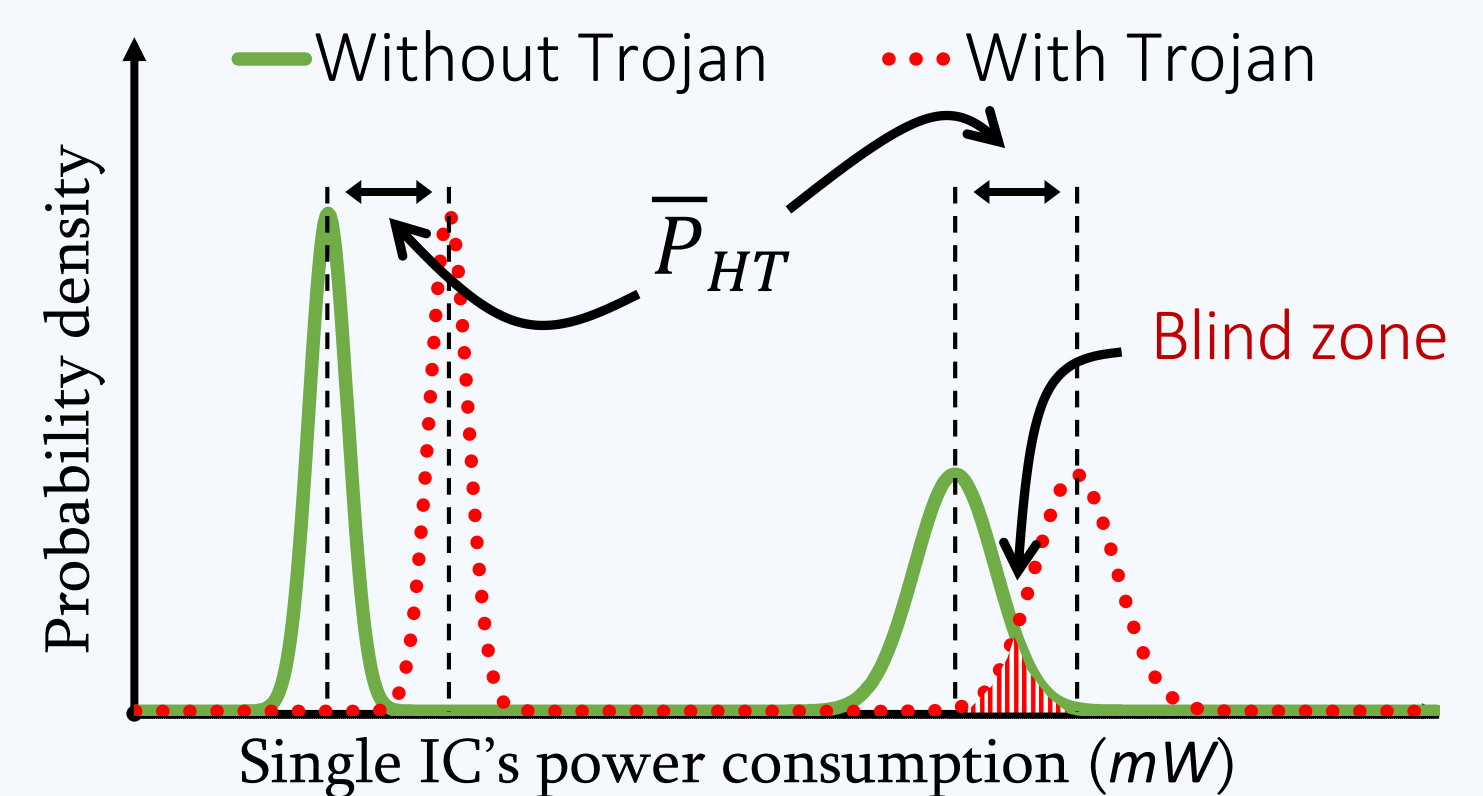
### Solution!

Red points outside the decision boundary are labelled as Trojans.



### But how?

Adding a Trojan on the PCB causes a shift in the anticipated power consumption curves.



**Results:** Simulations returned HT detection classification results with an accuracy above 99.7% when the HT had an average power consumption as low as 40mW. The machine learning (ML) model is low-cost in terms of computation and memory, requiring as little as 20KB memory storage. Further, the simulation results have been validated through real-life experiments on a prototype PCB.

## Conclusion

This research targets hardware Trojans on printed circuit boards, an issue which has been proven to exist, but not sufficiently addressed. We proposed a power analysis method for detecting such HT components. We then applied ML techniques to detect stealthier HTs, powered from legitimate chips on the PCB. The results can have a significant impact in improving the level of electronic security, reducing the potential harm from HTs to society.

## References

- G. Piliposyan, S. Khursheed, "PCB Hardware Trojan Run-time Detection Through Machine Learning", submitted to IEEE Trans. Emerging Topics in Computing.
- G. Piliposyan, S. Khursheed and D. Rossi, "Hardware Trojan detection on a PCB through differential power monitoring", IEEE Trans. Emerging Topics in Computing, doi: 10.1109/TETC.2020.3035521.
- www.bloomberg.com/news/features/2018-10-04/the-big-hack-how-china-used-a-tiny-chip-to-infiltrate-america-s-top-companies, last access 22/1/2022.

*Though they are small and they are silent, make no mistake...  
...for when awake, they fake and break!*