



# Unlocking the Potential of Domain Aware Binary Analysis in the Era of IoT

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March 3rd, 2023

# History of Computing (Since 1980s)

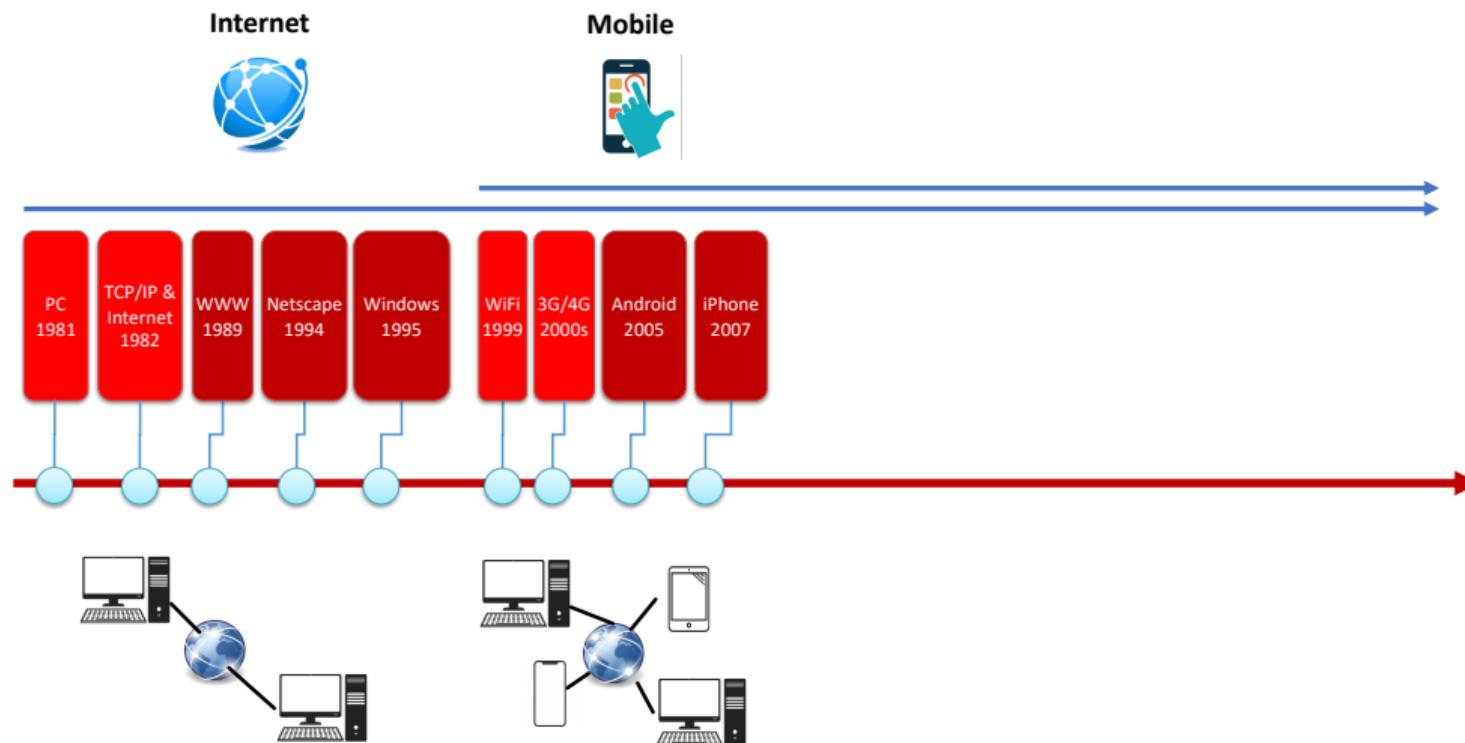


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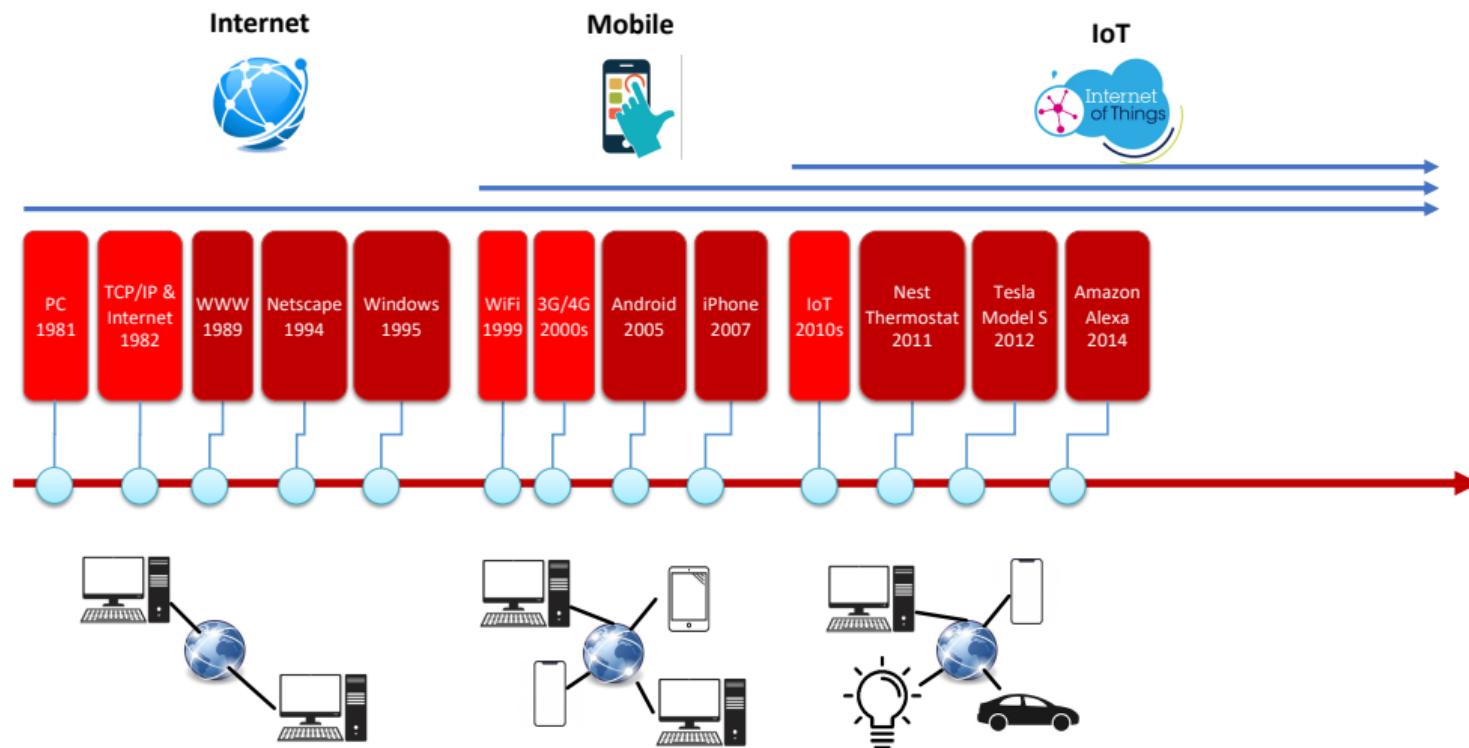
## Internet



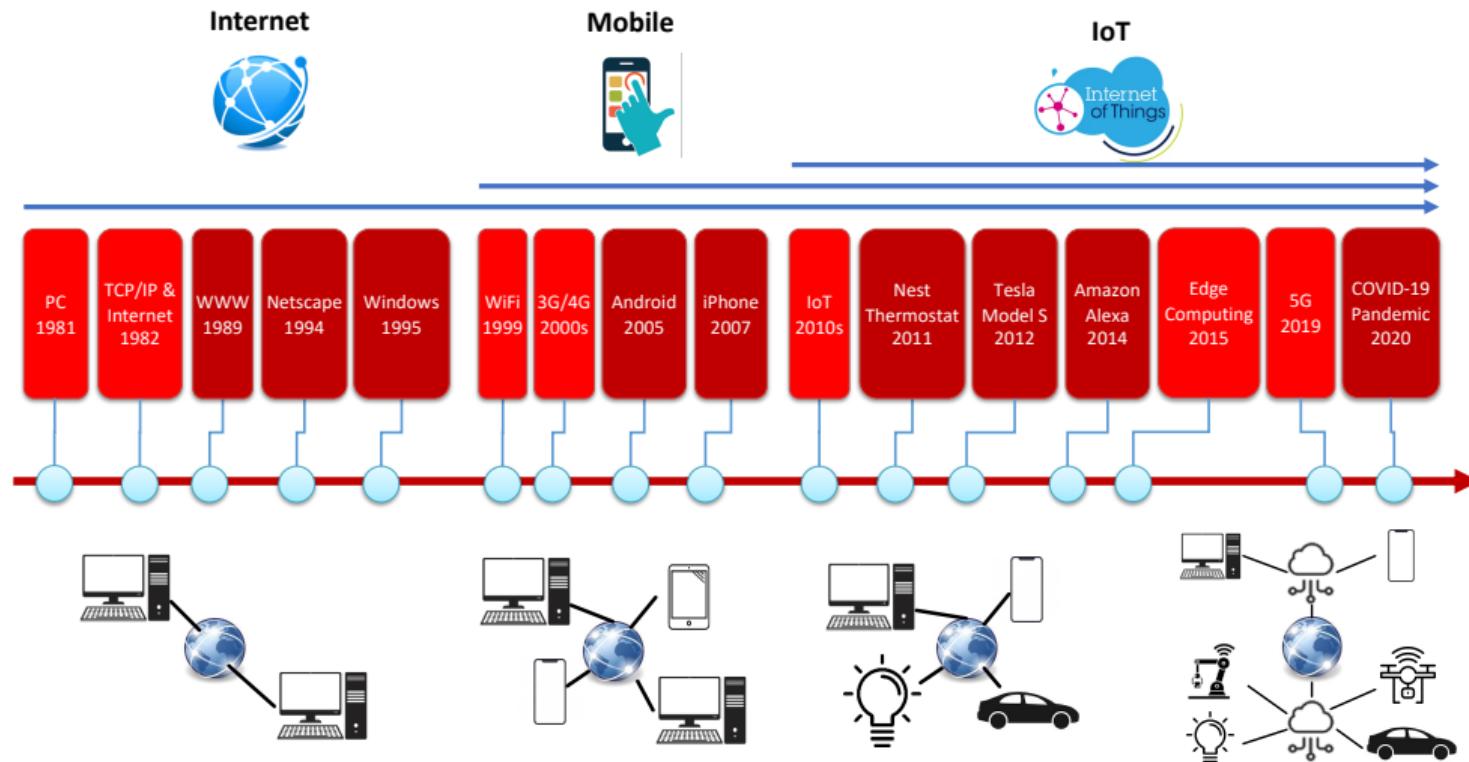
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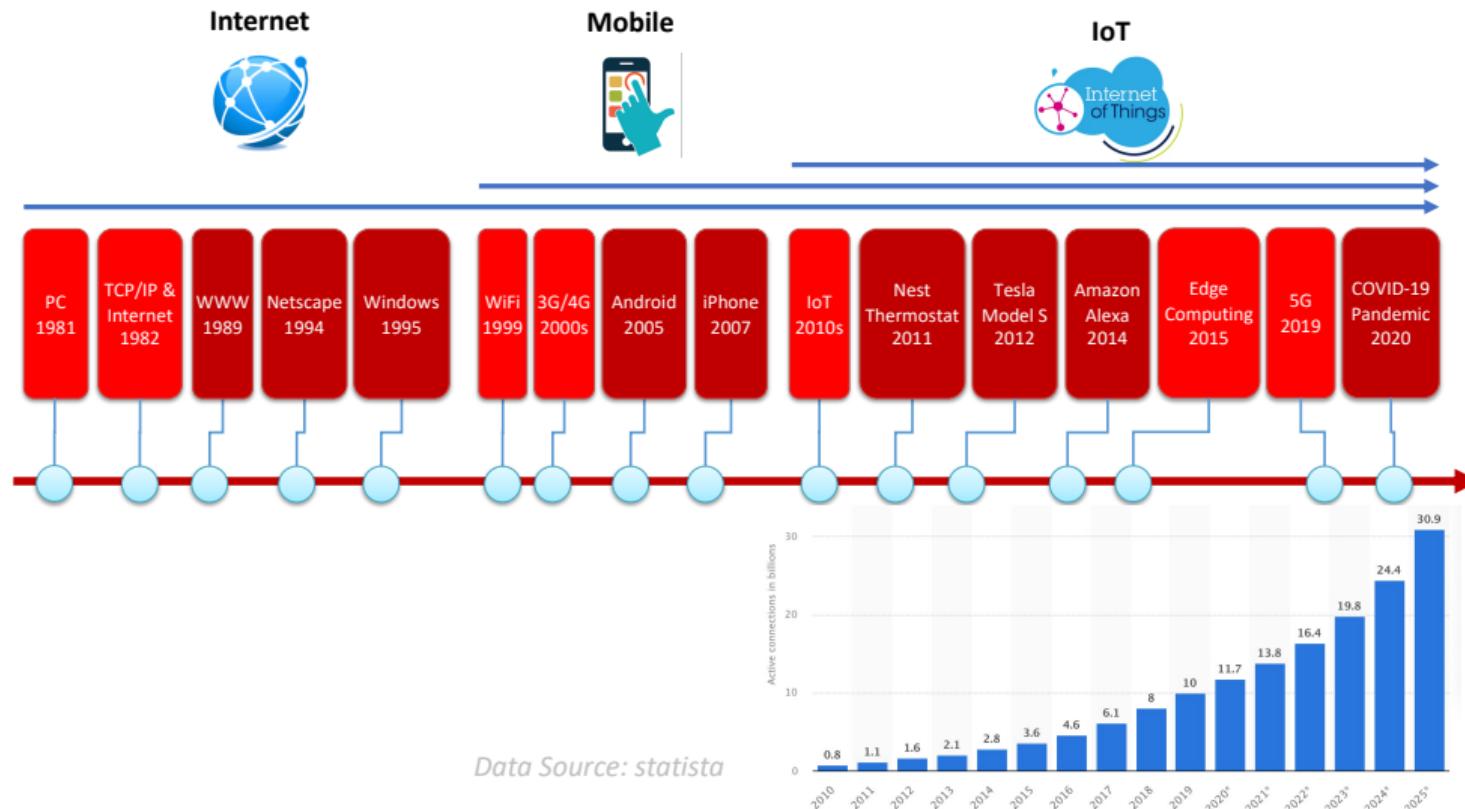
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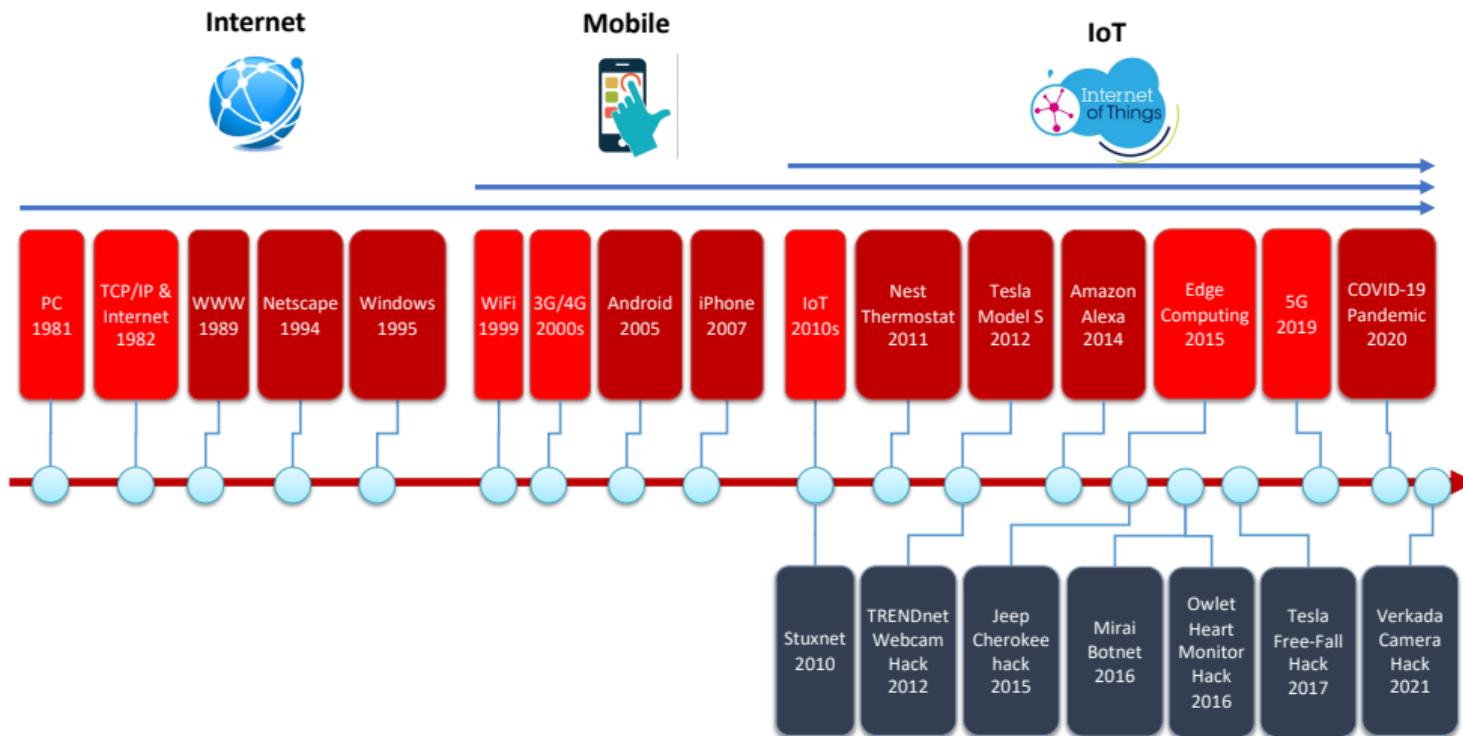
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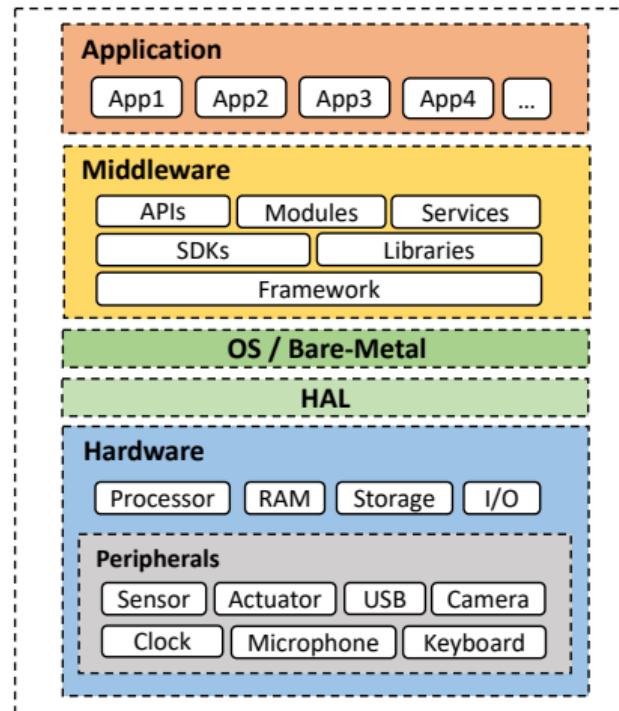
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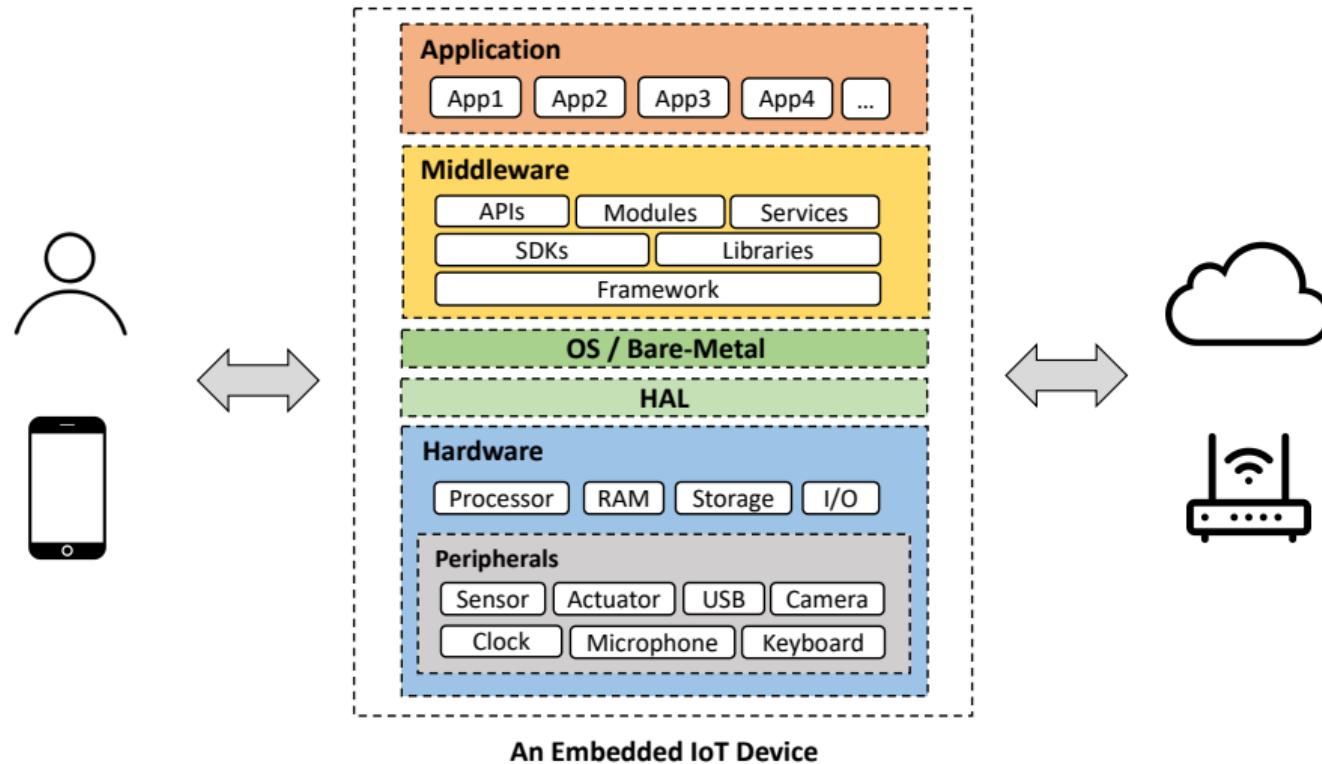
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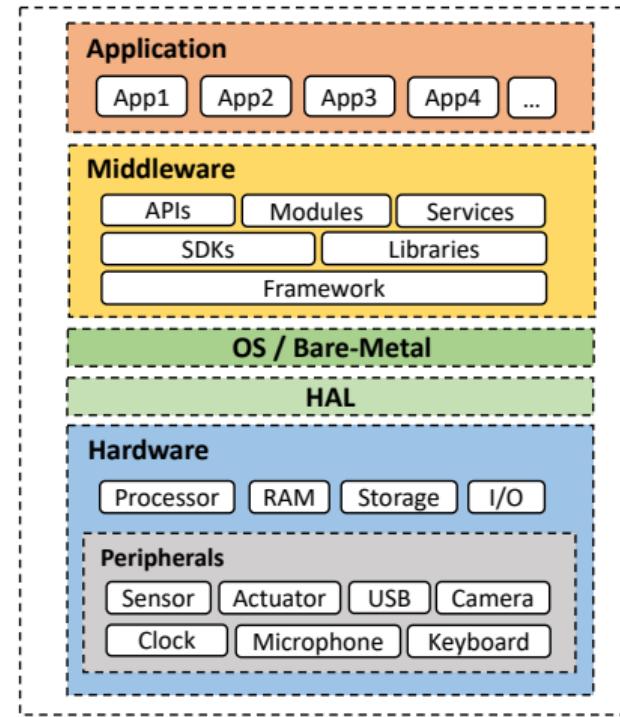
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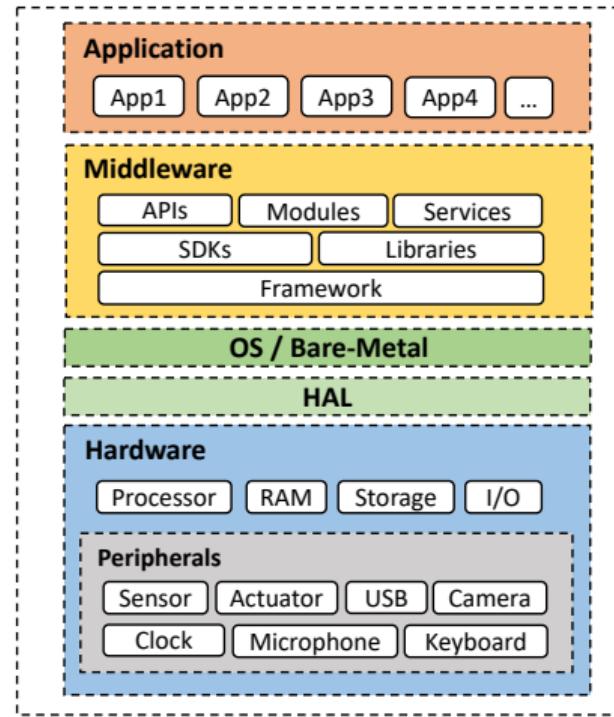
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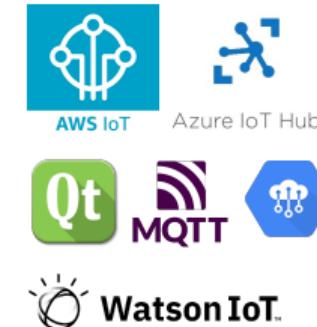
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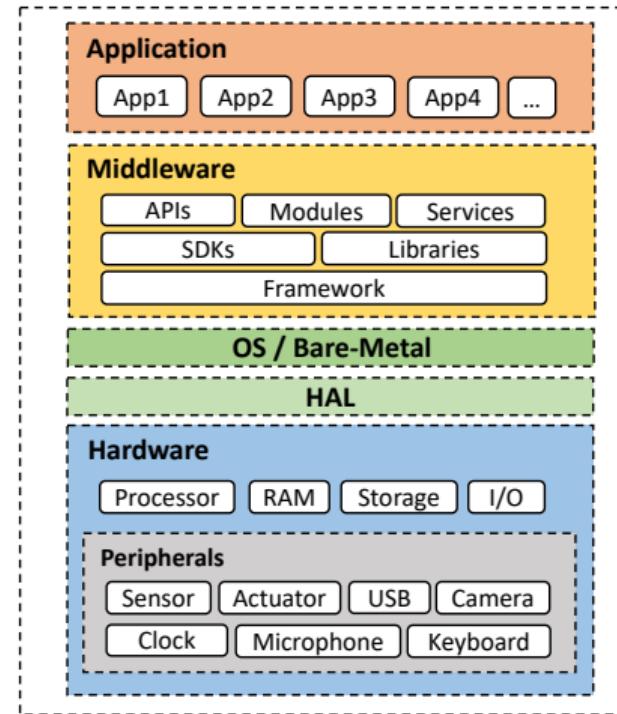
An Embedded IoT Device



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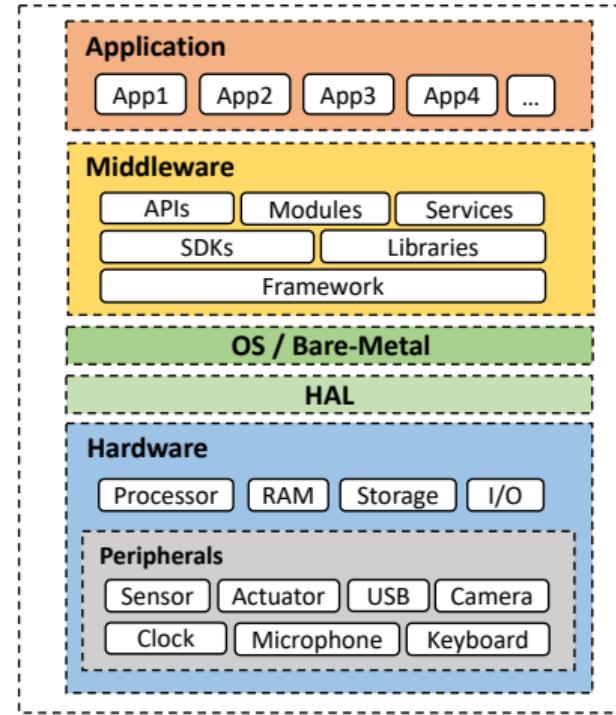
RTOS



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# Domain-Aware Binary Analysis

Binary code analysis is *challenging*

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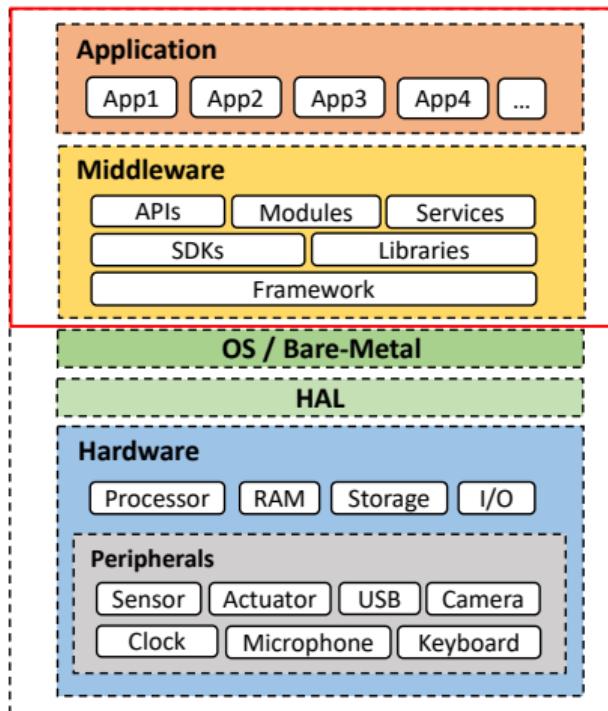
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- ▶ Domain-specific challenges

### ② *Learn from the domain*

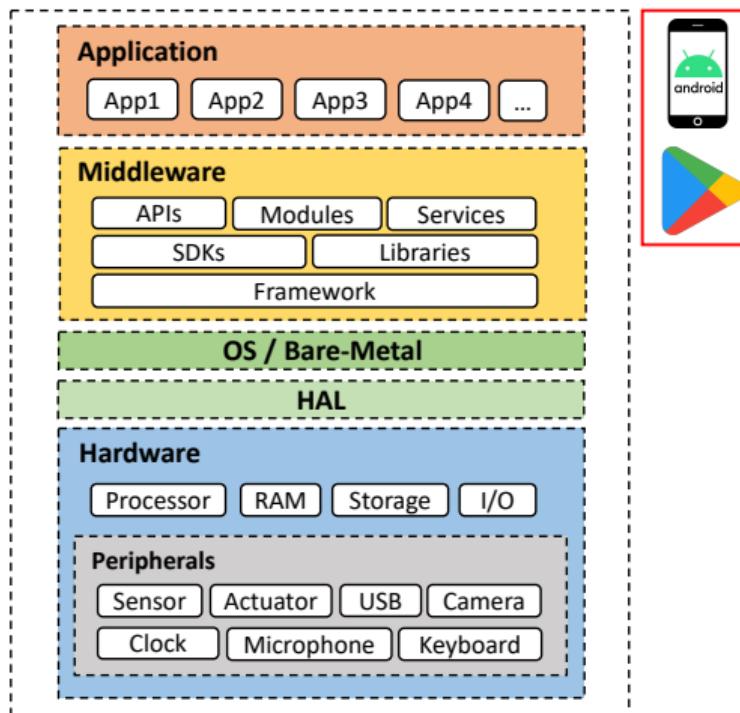
- ▶ Unique domain insights for binary analysis
- ▶ Novel techniques and methodology
- ▶ Transition to other domains

# Our Recent Works on (IoT) Binary Analysis



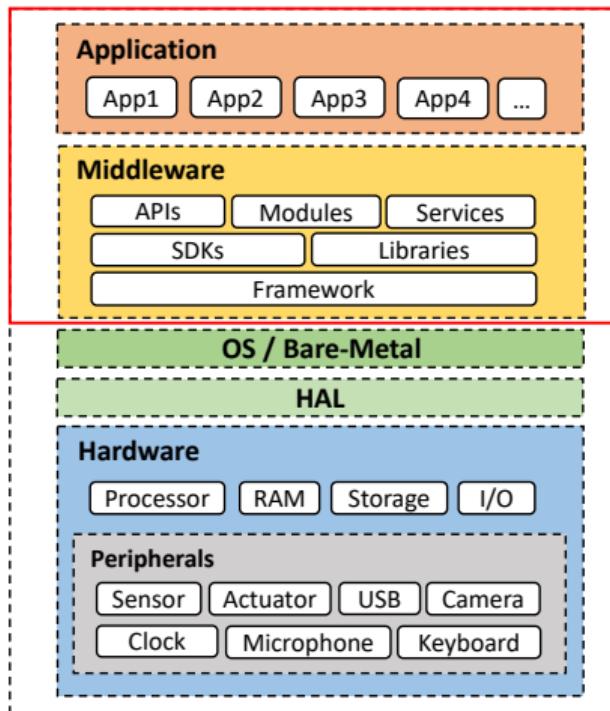
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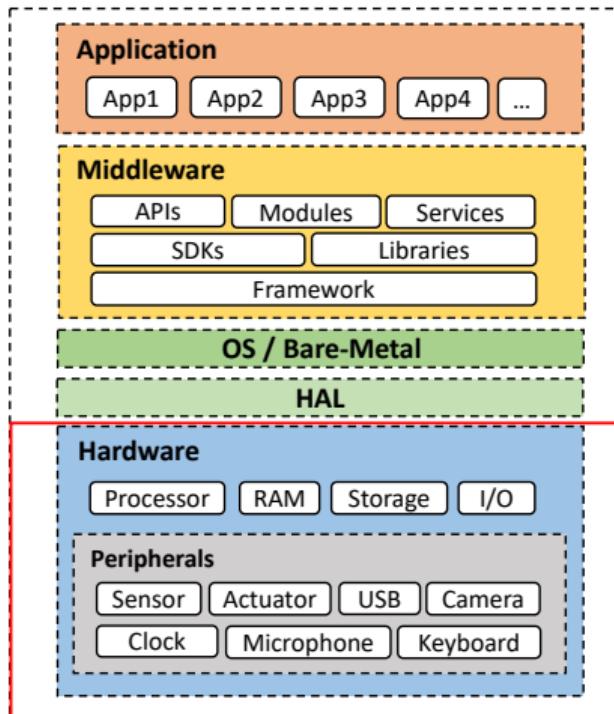
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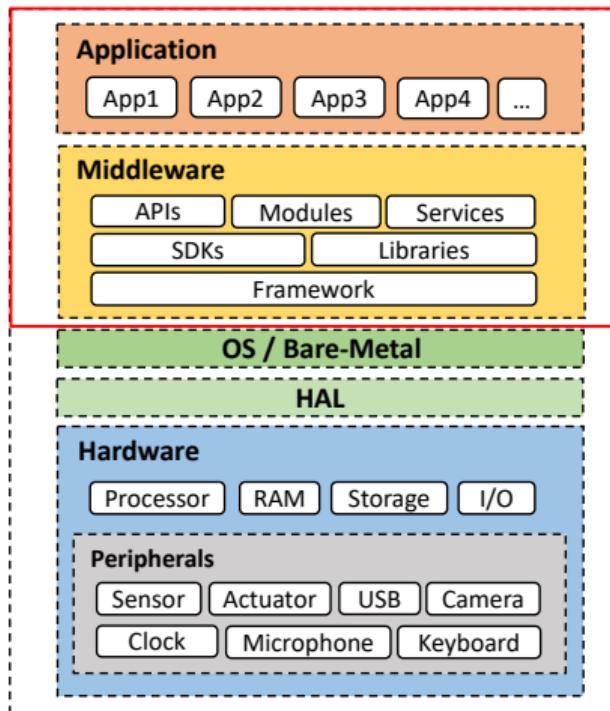
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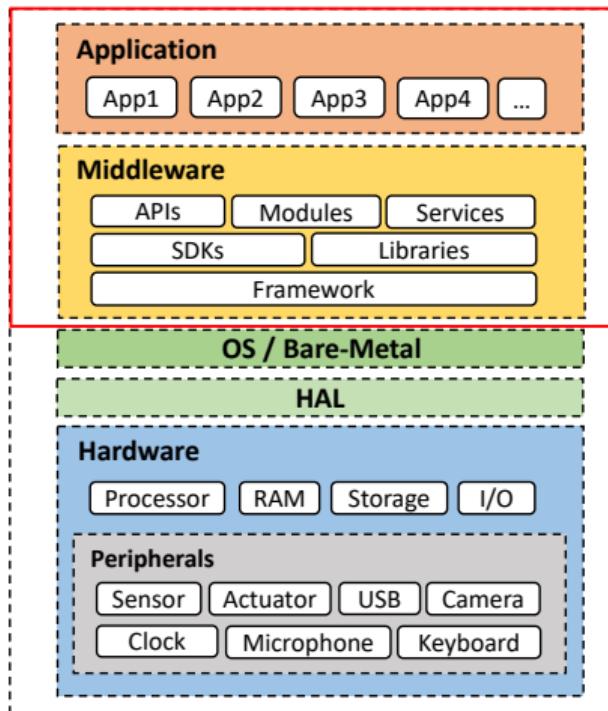


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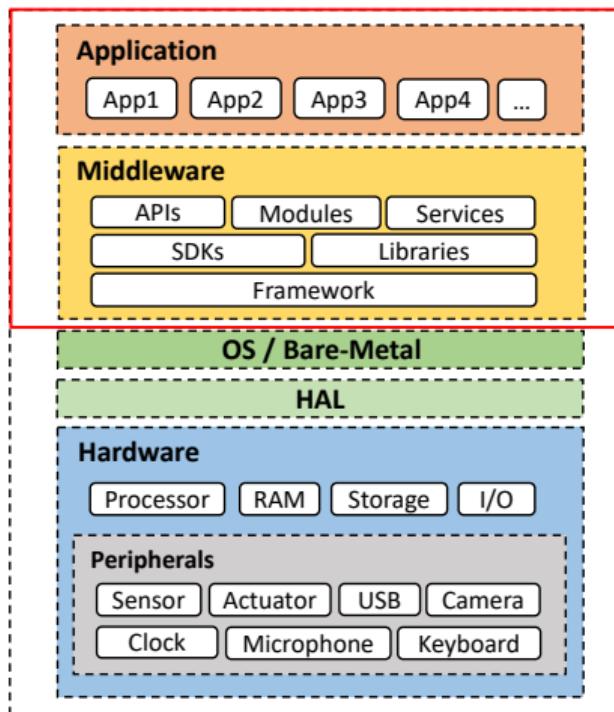
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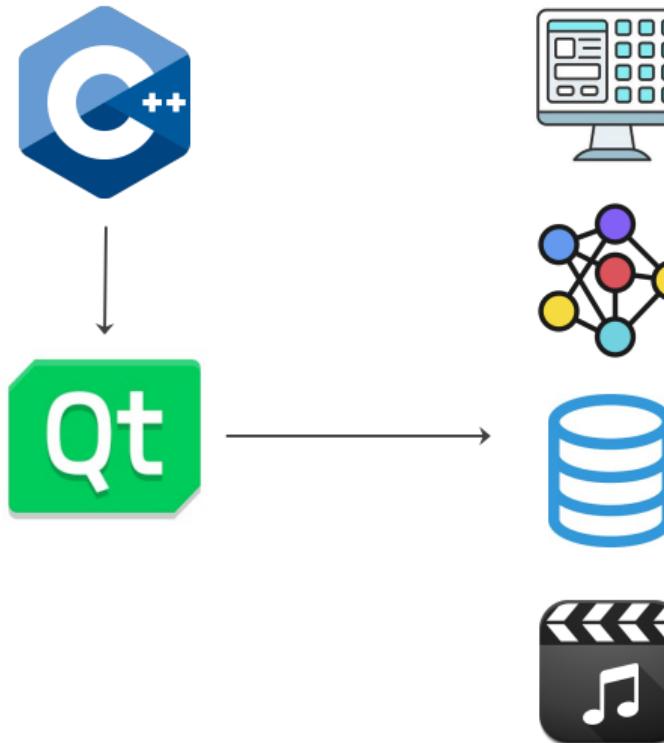


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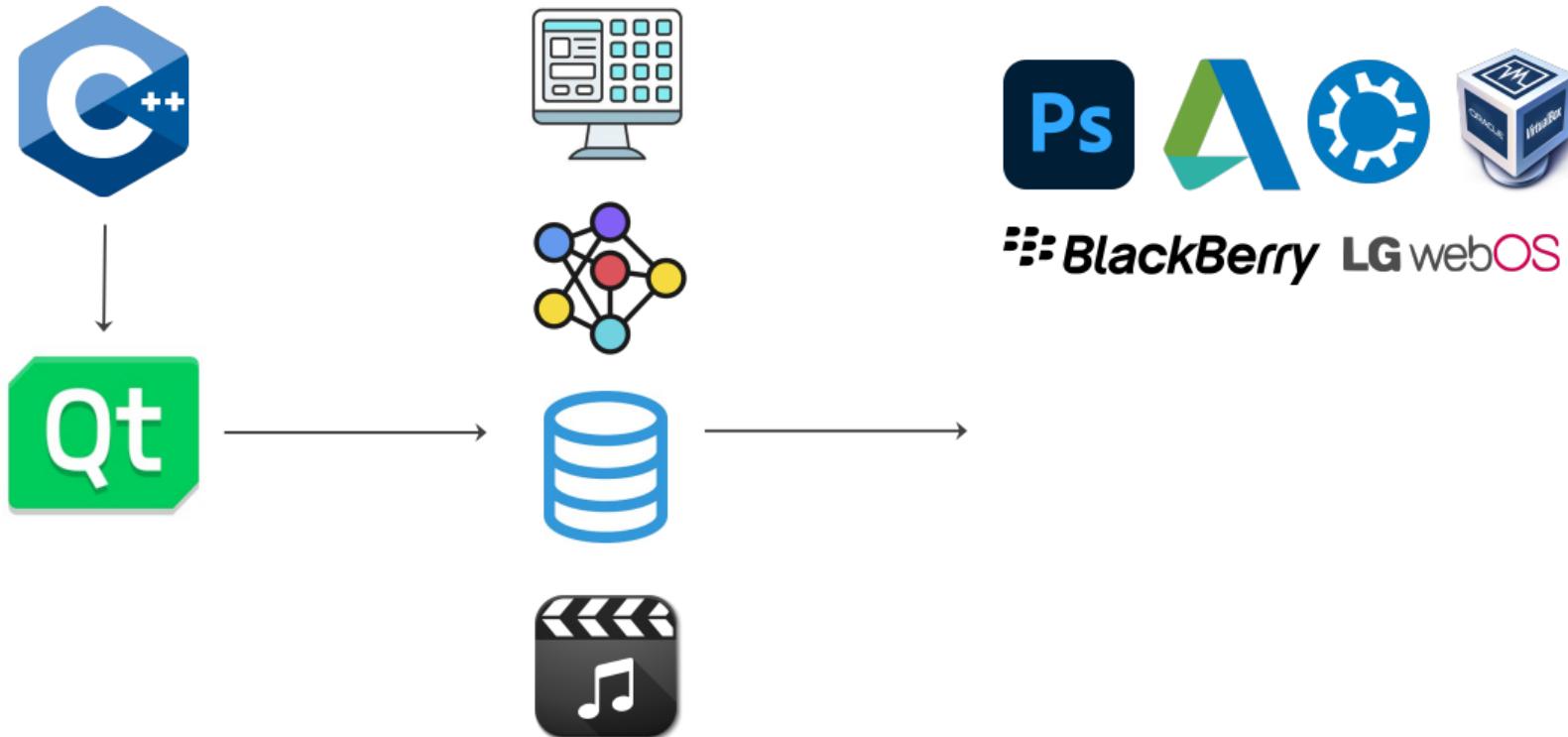
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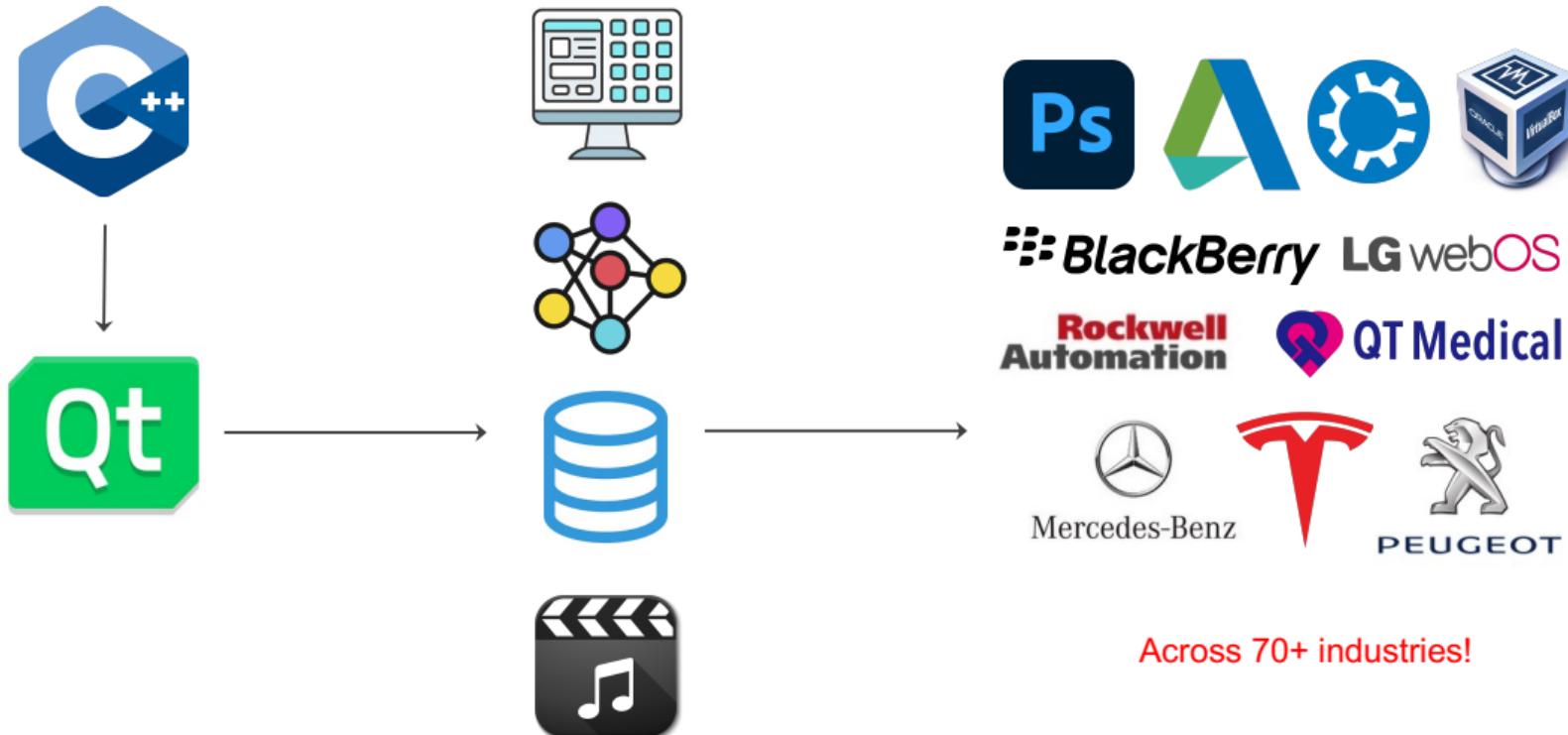
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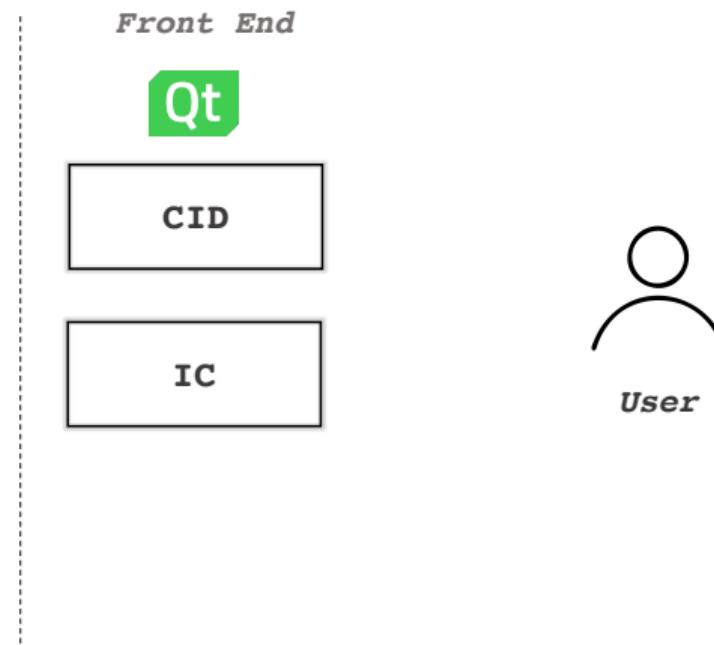
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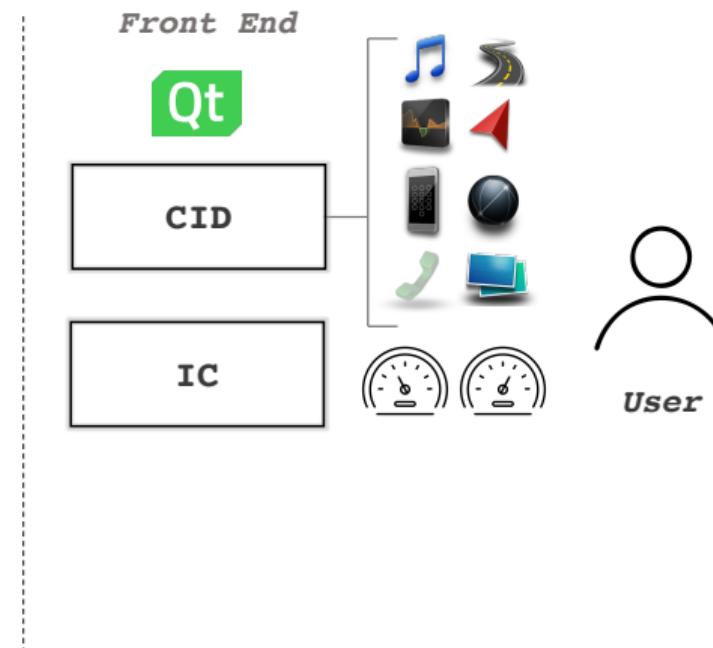
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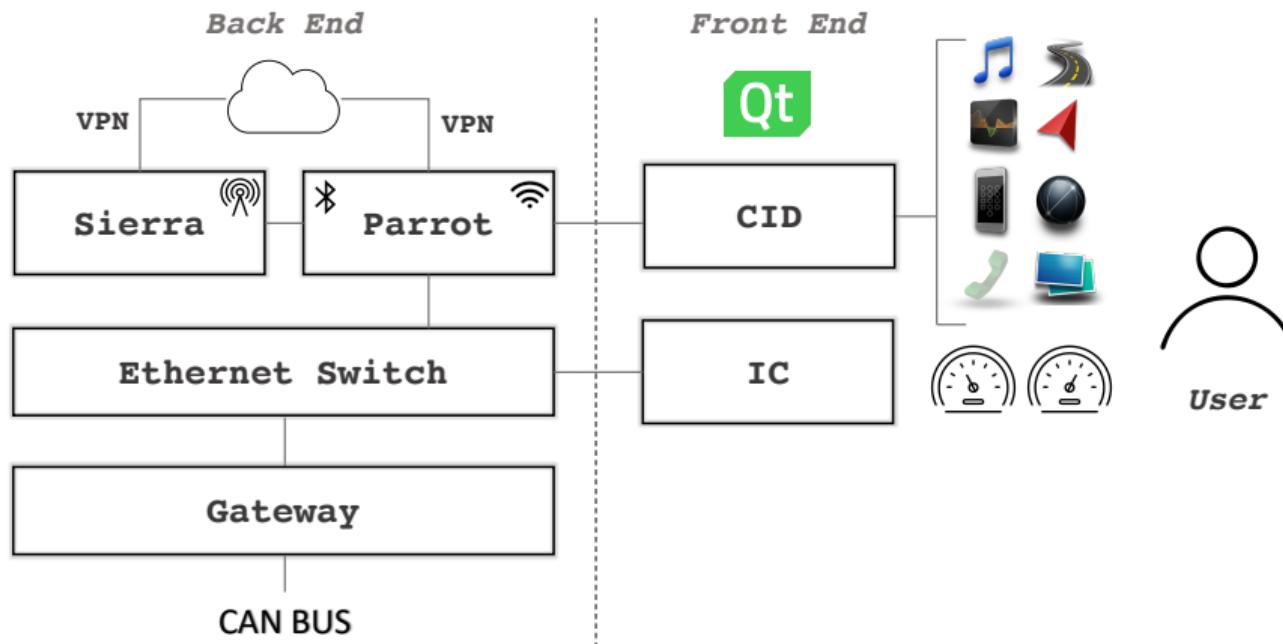
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## Binary RE Challenges

- ▶ **Control Flow Graph (CFG) Recovery.** Indirect control flow transfers such as callbacks and indirect calls [PCvdV<sup>+17</sup>, VDVG<sup>C+16</sup>]

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- ▶ **Control Flow Graph (CFG) Recovery.** Indirect control flow transfers such as callbacks and indirect calls [[PCvdV<sup>+</sup>17](#), [VDVGC<sup>+</sup>16](#)]
- ▶ **Symbol Recovery** (e.g., names/types of functions/variables). Code stripping during binary compilation [[TTN<sup>+</sup>19](#), [SCD<sup>+</sup>18](#)]

# Key Insights

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### ② Qt's Dynamic Introspection

- ▶ Originally designed for run-time class member query and update
- ▶ *We repurpose it to recover rich semantic symbols from the binary program*

# Qt's Signal and Slot Mechanism

```
1 MainWindow::MainWindow() {
2     ...
3     // Create lineEdit instance
4     v0 = operator.new(0x30)
5     QLineEdit(v0) ——————→
6     *(this + 0x30) = v0
7     ...
8
9
10
11
12
13
14
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Signal

Slot

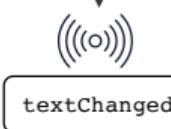
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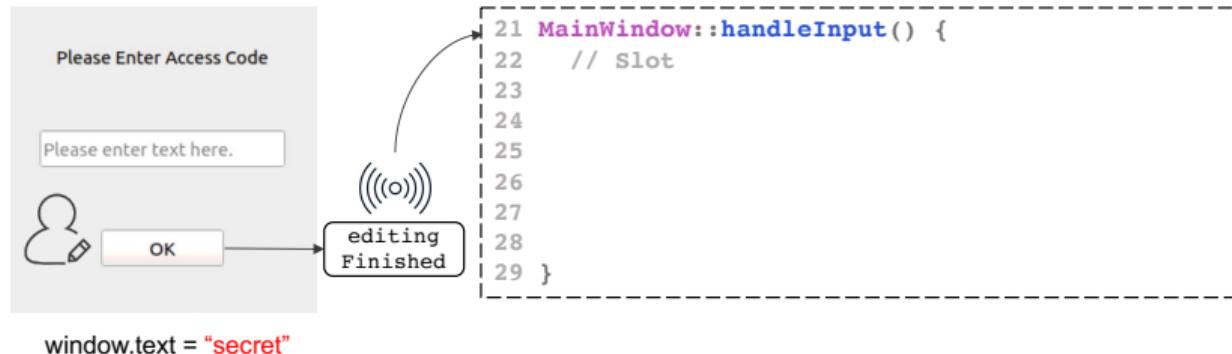
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```
16 MainWindow::updateText(QString v1) { ←
17     // Slot
18     if (v1 != null)
19         *(this + 0x48) = v1 // this->text
20 }
```

# Qt's Dynamic Introspection



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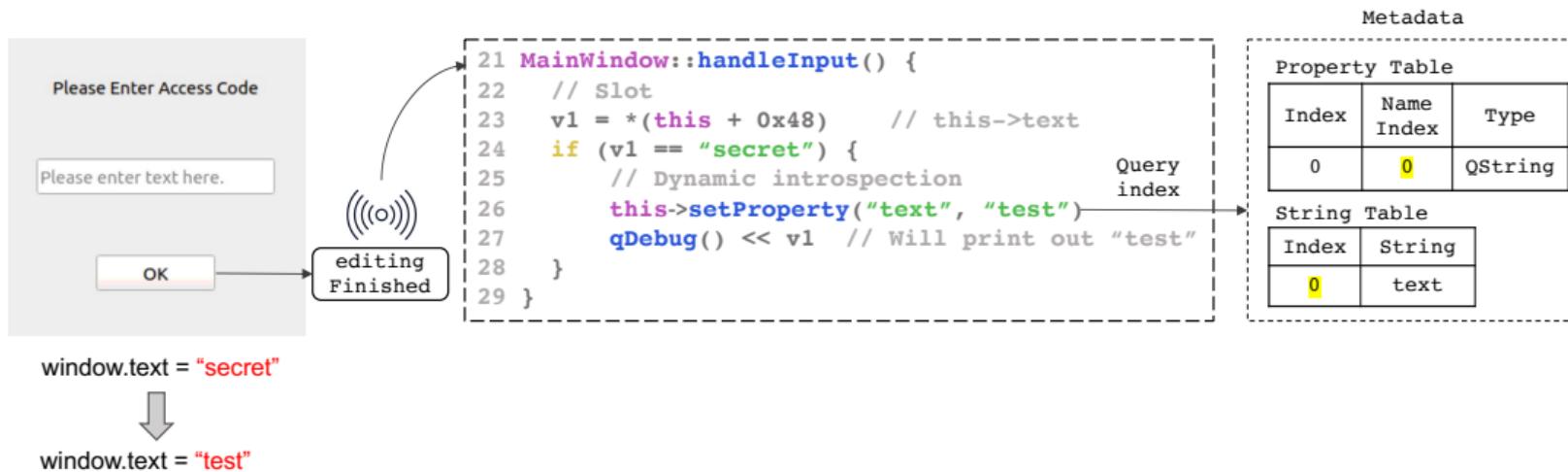
```
21 MainWindow::handleInput() {  
22     // Slot  
23     v1 = *(this + 0x48)      // this->text  
24     if (v1 == "secret") {  
25         // Dynamic introspection  
26     }  
27 }  
28 }  
29 }
```

window.text = "secret"

# Qt's Dynamic Introspection



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# Application: Egg Hunt in Tesla Infotainment

The image shows a screenshot of the Tesla infotainment system's main menu. At the top left is a photo of a silver Tesla Model X. Below it are several circular icons: a four-pointed star, a key, and a lock. To the right of these are sections for CLIMATE (Interior 66°F), CONTROLS, FUEL CHAMBER (Current Output: 300R), and LOCATION. The main content area displays two entries:

- Tesla Back to the Future Easter Egg** (December 1, 2020): A description states that to activate this Easter egg, the vehicle needs to be at exactly 121 miles (or 121 km) of range, then touch the bar... Below this is a small image of a silver Tesla Model X driving on a road with a rainbow gradient.
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Easter eggs in Tesla vehicles

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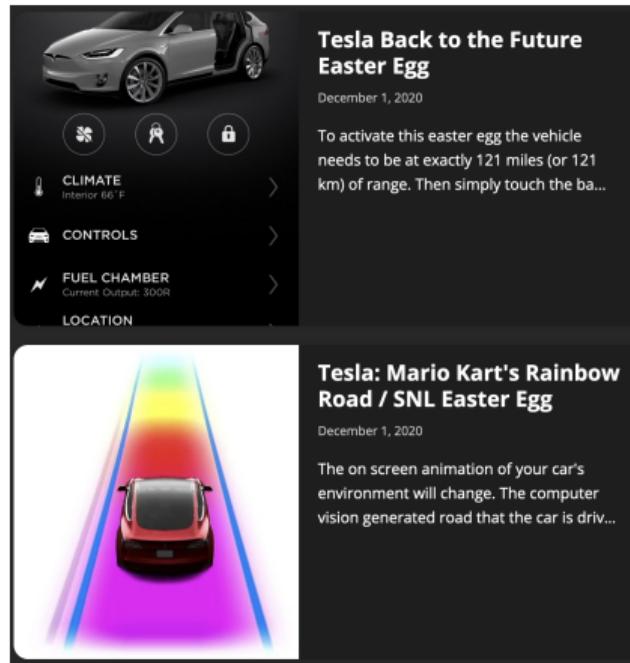
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Easter eggs in Tesla vehicles

- ▶ Do they raise security concerns?
- ▶ How to systematically identify them?
  - ▶ Coverage-based fuzzing (emulation required)
  - ▶ **Input validation analysis on Qt binaries**

# Application: Egg Hunt in Tesla Infotainment

## Experiment Setup

- ▶ Use input validation analysis to extract hidden commands from Tesla firmware
- ▶ Identify user input variables from the recovered Qt symbols
- ▶ Analyze the recovered Qt control flow

Class Name	Var./Func. Name
QLineEdit	text()
QLineEdit	text
QAbstractSpinBox	text
QDoubleSpinBox	text
QSpinBox	text
QDateTimeEdit	text
TextField	text
PasswordTextField	text
WebEntryField	text
NavigationSearchBox	text
CompleterTextField	text
ExtEntryField	text

Table: Identified user input variables.

# Application: Egg Hunt in Tesla Infotainment

Category	Content	Description
Easter Egg	"007"	Submarine Easter egg
	"modelxmas"	Show holiday lights
	"42"	Change car name
	"mars"	Turn map into Mars surface
	"transport"	Transport mode
	"performance"	Performance mode
	"showroom"	Showroom mode
Access Token	SecurityToken1	Enable diagnostic mode
	SecurityToken2	Enable diagnostic mode
	crc(token)==0x18e5a977	Enable developer mode
	crc(token)==0x73bbee22	Enable developer mode
Master Pwd	"3500"	Exit valet mode

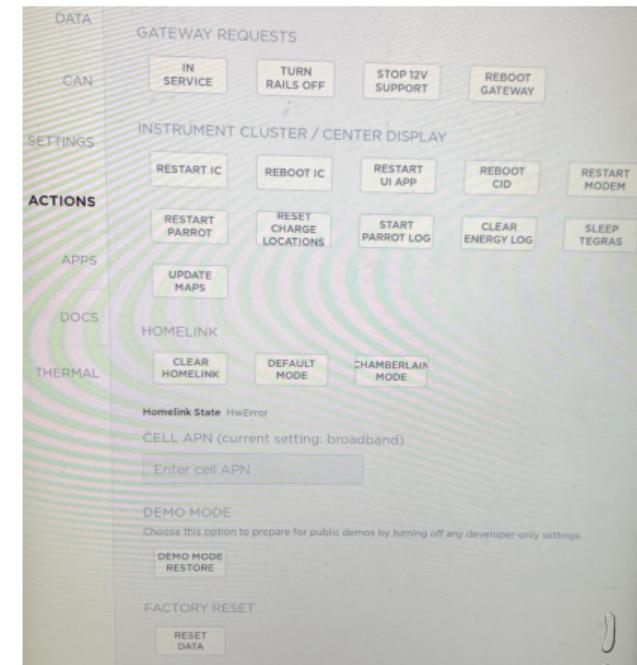
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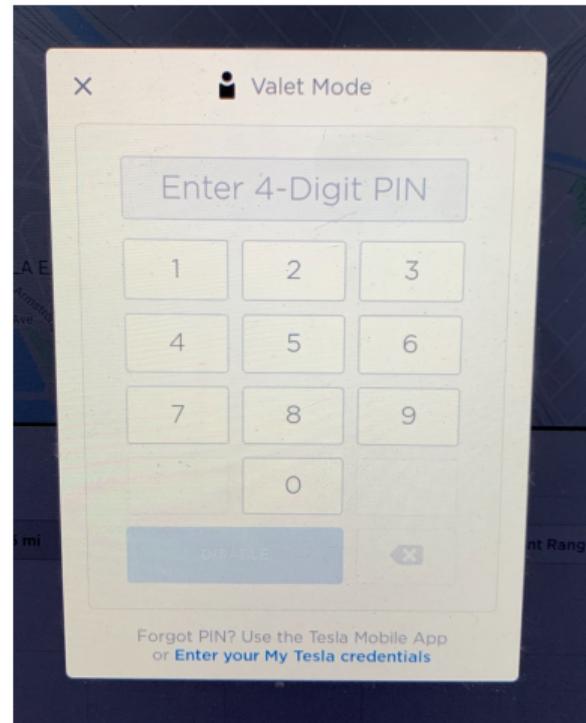
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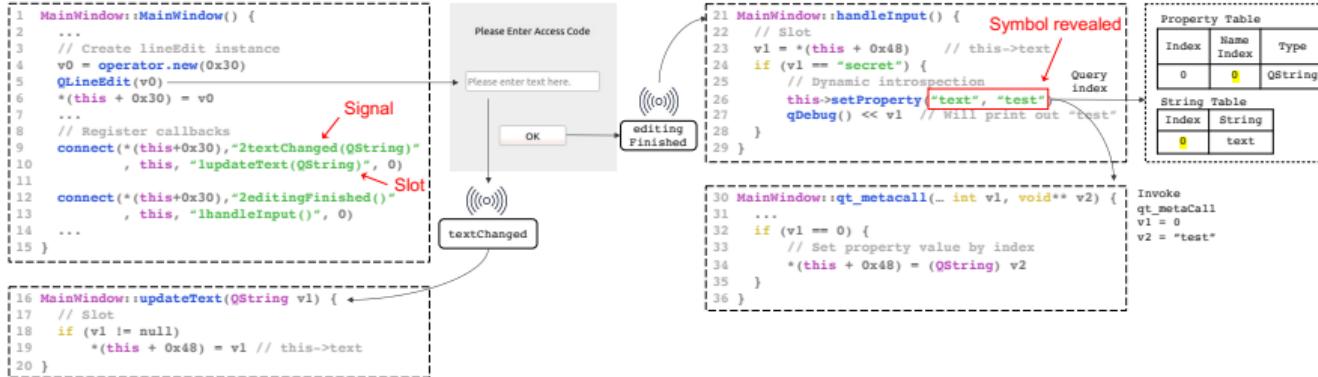
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## Disclosure

The Tesla security team acknowledged our findings in 2022/4 and have eliminated the feasible paths for exploiting these hidden commands in the latest firmware.

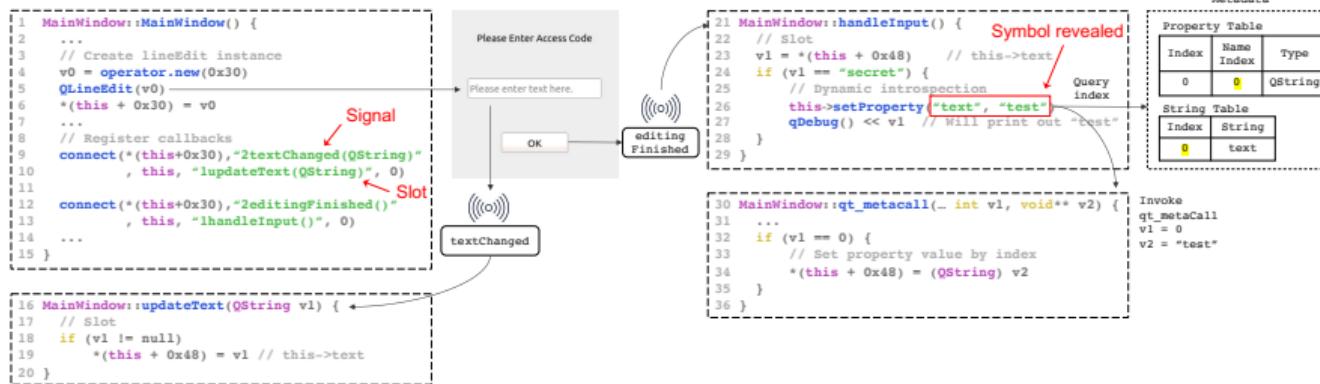
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## QTRE

- A static analysis tool that leverages Qt's unique insights for function callback and symbol recovery

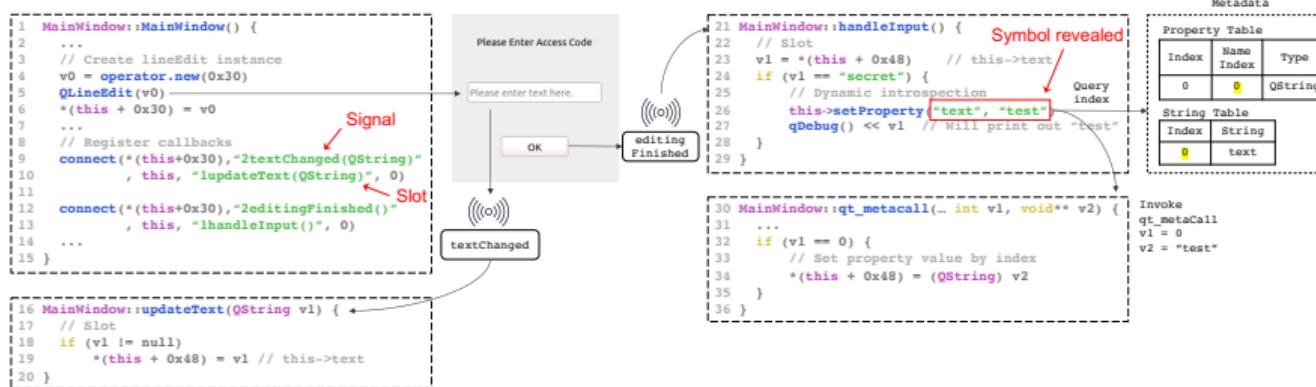
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- It additionally recovered (based on GHIDRA) 10,867 callbacks and 24,973 symbols among 123 binaries
- We demonstrate an application of input validation analysis with QTRE, and extracted 12 unique hidden commands five new to the public.

The source code will be released at <https://github.com/OSUSecLab/QtRE>.

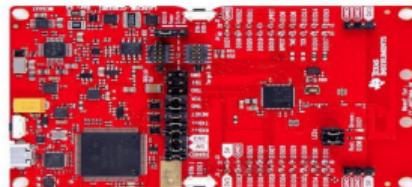
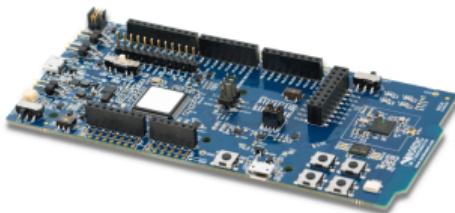
# Bluetooth Low Energy

**Bluetooth™**  
**4.0** 

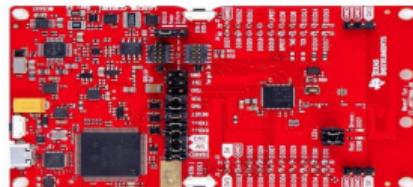
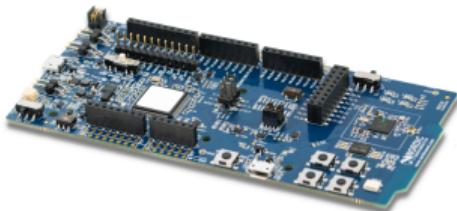
*Low Energy*



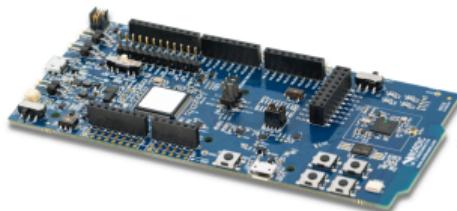
# Low Technical Barrier for IoT Development



# Low Technical Barrier for IoT Development



# Low Technical Barrier for IoT Development



AWS IoT



Azure IoT Hub

# Low Technical Barrier for IoT Development



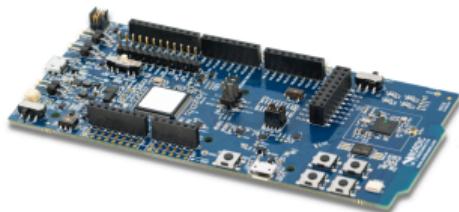
AWS IoT



Azure IoT Hub



# Low Technical Barrier for IoT Development



AWS IoT

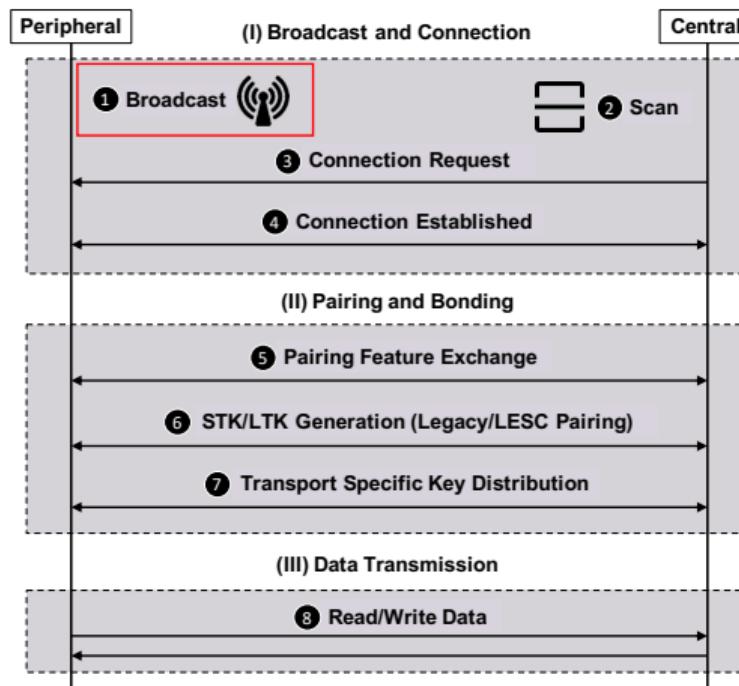


Azure IoT Hub



**Are they secure?**

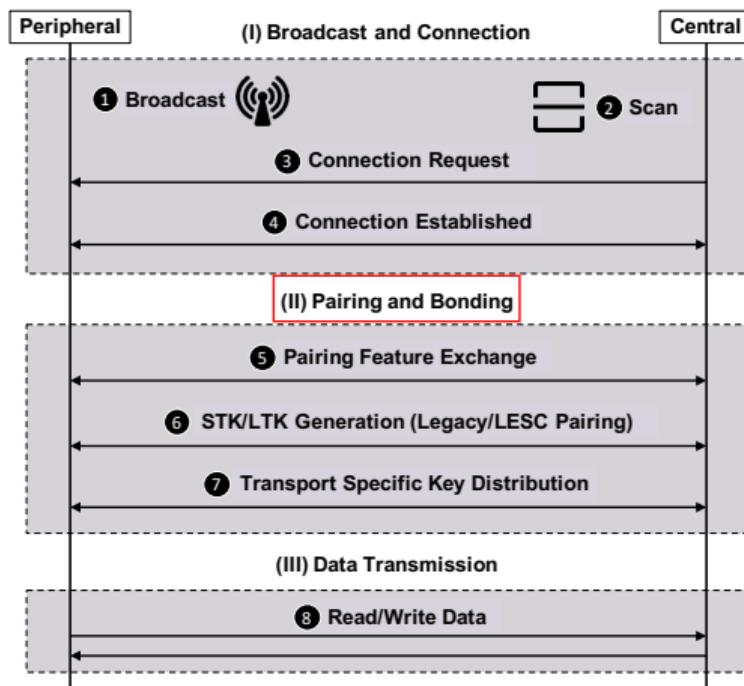
# BLE Link Layer Vulnerabilities



## Vulnerabilities

- ① **Identity Tracking.** Configure static MAC address during broadcast [[DPCM16](#)].

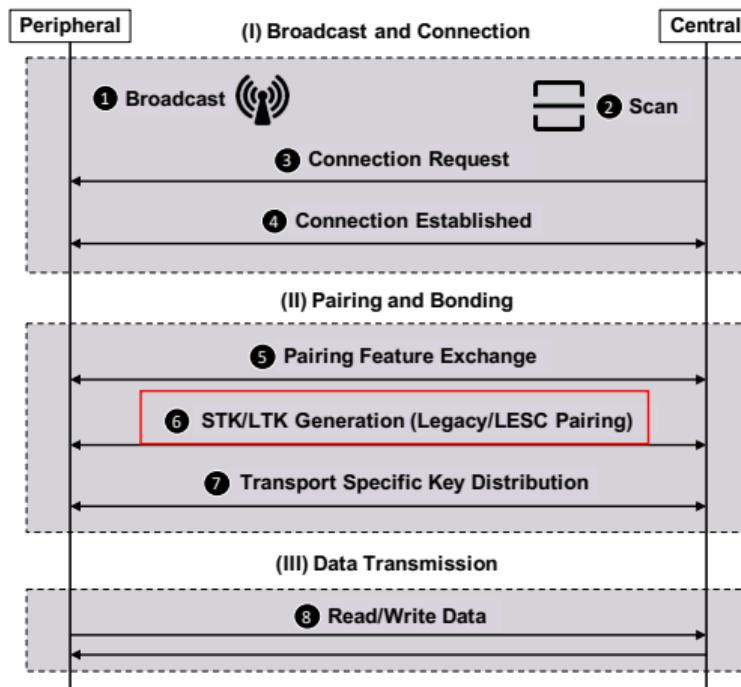
# BLE Link Layer Vulnerabilities



## Vulnerabilities

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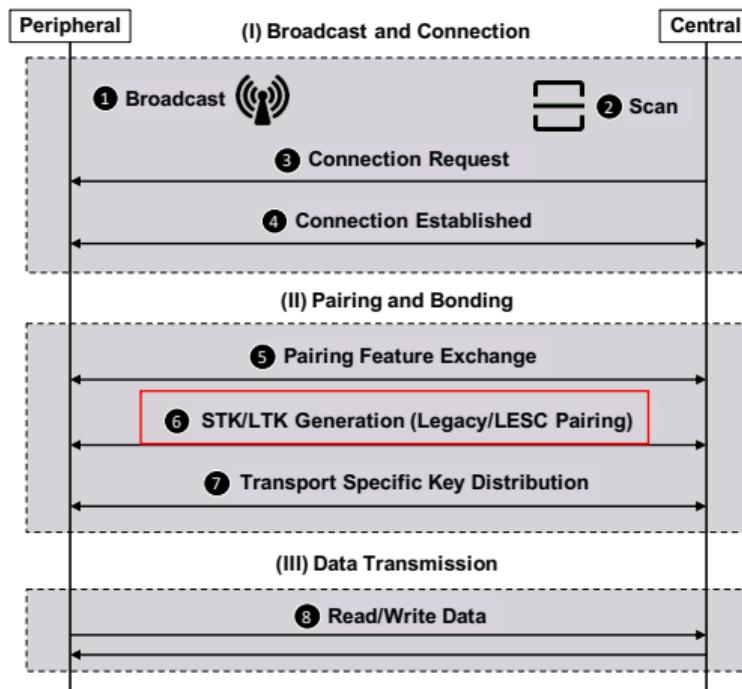
# BLE Link Layer Vulnerabilities



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# BLE Link Layer Vulnerabilities



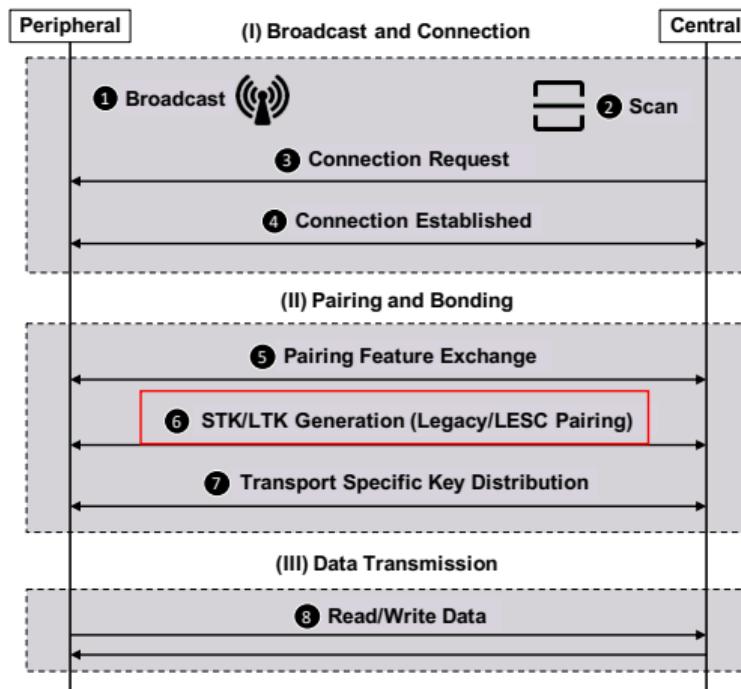
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# BLE Link Layer Vulnerabilities



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# An Example of a Just Works Pairing Vulnerability

## Read Only Memory

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11 260c8   0x20003268
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## Register Values

r1 = 0x0  
r2 = 0x0

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## Register Values

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Correct Firmware Disassembling



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Value computation



Register Values

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Motivations  
oooo

QtRE  
oooooooo

FirmXRay  
oooo●○○

AutoMap  
ooooooo

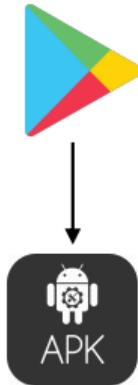
Takeaway  
ooo

References  
o

# Firmware Collection

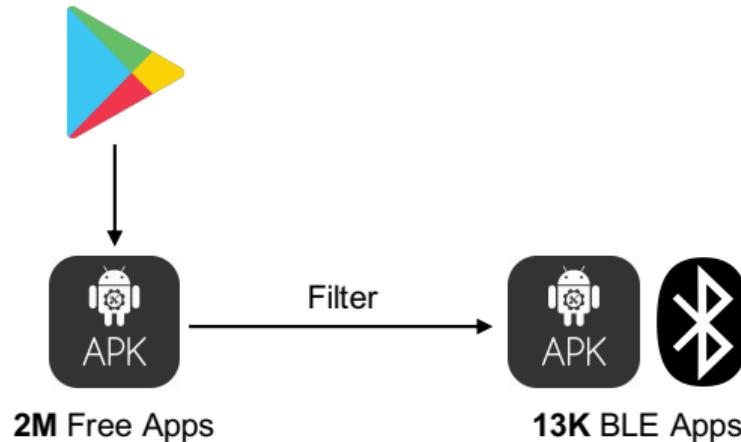


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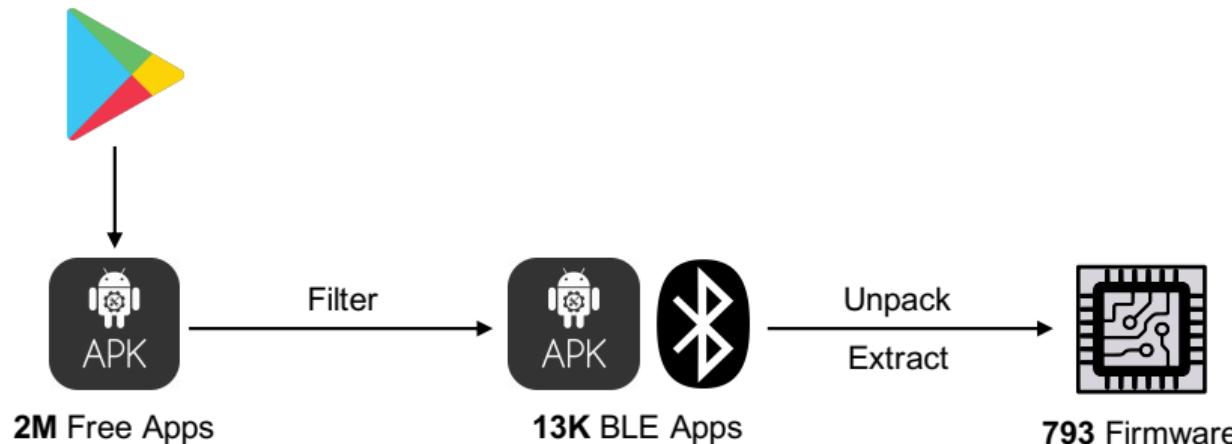


**2M** Free Apps

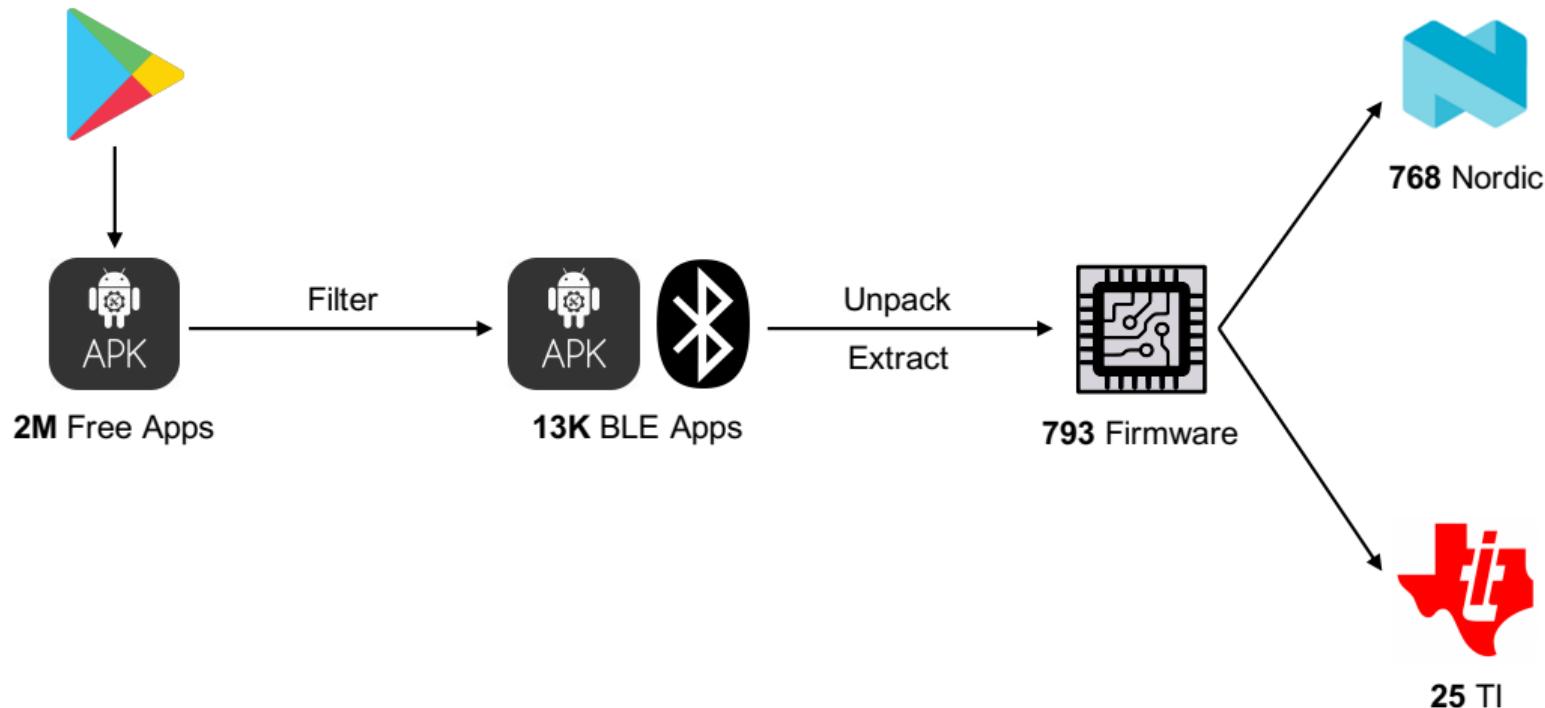
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# Experiment Results

## Identity Tracking Vulnerability Identification

Among the 538 devices, nearly all of them (**98.1%**) have configured random static addresses that do not change periodically.

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Firmware Name	Mobile App	Category	# Device
cogobeacon	com.aegismobility.guardian	Car Accessory	4
sd_bl	fr.solem.solemwf	Agricultural Equip.	2
LRFL_nRF52	fr.solem.solemwf	Agricultural Equip.	2
orb	one.shade.app	Smart Light	1
sd_bl	com.rainbird	Agricultural Equip.	1

Table: Firmware using private MAC address.

# Experiment Results

## Active MITM Vulnerability Identification

**385 (71.5%)** devices use Just Works pairing, which essentially does not provide any protection against active MITM attacks at the BLE link layer.

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Item	N	T	Total	%
<b># Total Device</b>	513	25	538	100
<b># Device w/ active MITM vulnerability</b>	384	1	385	71.5
# Device w/ Just Works pairing only	317	1	318	59.1
# Device w/ flawed Passkey implementation	37	0	37	6.9
# Device w/ flawed OOB implementation	30	0	30	5.6
<b># Device w/ secure pairing</b>	6	24	30	3.8
# Device w/ correct Passkey implementation	3	24	27	3.4
# Device w/ correct OOB implementation	3	0	3	0.4

Table: Pairing configurations of devices (N:Nordic, T:TI).

# Experiment Results

## Passive MITM Vulnerability Identification

**98.5%** of the devices fail to enforce LESC pairing, and thus they can be vulnerable to passive MITM attacks if there is no application-layer encryption.

# Experiment Results

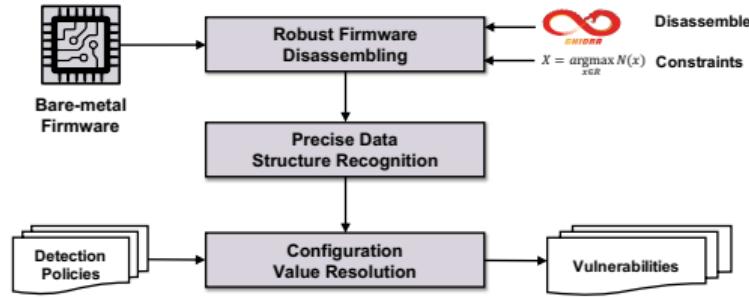
## Passive MITM Vulnerability Identification

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Firmware Name	Mobile App	Category	# Version
DogBodyBoard	com.wowwee(chip	Robot	16
BW_Pro	com.ecomm.smart_panel	Tag	1
Smart_Handle	com.exitec.smartlock	Smart Lock	1
Sma05	com.smalife.watch	Wearable	1
CPRmeter	com.laerdal.cprmeter2	Medical Device	4
WiJumpLE	com.wesssrl.wijumple	Sensor	1
nRF Beacon	no.nordicsemi.android.nrfbeacon	Beacon	1
Hoot Bank	com.qvivr.hoot	Debit Card	1

Table: Firmware that enforce LESC pairing.

# FirmXRay [CCS'20]

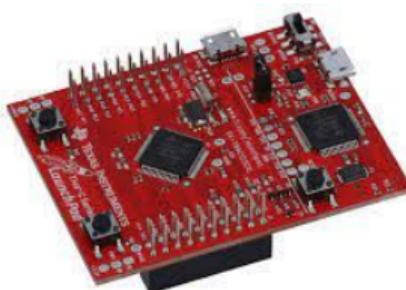
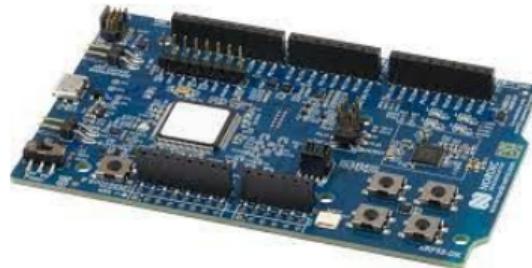


## FIRMXRAY

- ▶ A static analysis tool based on Ghidra for detecting BLE link layer vulnerabilities from bare-metal firmware.
- ▶ A scalable approach to efficiently collect bare-metal firmware images from only mobile apps.
- ▶ Vulnerability discovery and attack case studies.

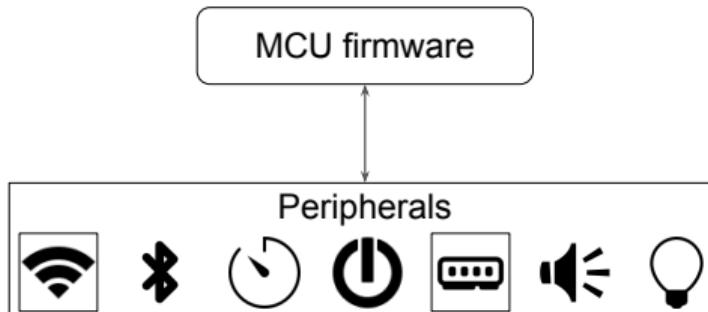
The source code is available at <https://github.com/OSUSecLab/FirmXRay>.

# Microcontroller Unit (MCU)



- ▶ The chip inside the board
- ▶ Ubiquitous (e.g., drone, smart light bulb)

# Microcontroller Unit (MCU)



- ▶ Peripherals are inside the provided board
- ▶ Firmware controls peripherals through peripheral registers
- ▶ Peripheral executes firmware through the corresponding interrupt

# Microcontroller Unit (MCU)

## MCU Firmware Vulnerabilities

- ① Memory corruption
- ② Privacy leakage
- ③ Peripheral malfunctioning

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- ② **Re-hosting.** Emulating firmware without hardware

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Common Challenge  
Modeling Peripheral Processing

# An Example of Processing a Peripheral Register

Execution just based on the firmware code



```
1:  REG_CLOCK = 0x40023800;
2:  *REG_CLOCK = 0x1000000; // set 24-bit
3:  if (*REG_CLOCK & 0x2000000) == 0) { // check 25-bit
4:      return HAL_ERROR;
5:  }
6:  Freq = HAL_RCC_GetSysClockFreq();
7:  return HAL_OK;
```

```
[REG_CLOCK] 0x40023800 = <uninitialized>
```

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[REG_CLOCK] 0x40023800 = 0x1000000
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[REG_CLOCK] 0x40023800 = 0x3000000
```

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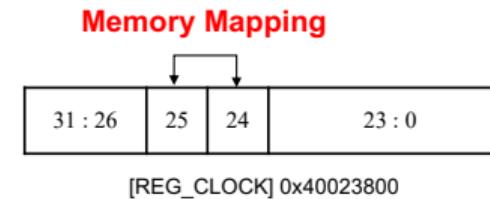
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```
[REG_CLOCK] 0x40023800 = 0x3000000
```

# Hidden Memory Mapping

Peripheral register bits get simultaneously updated by the MCU hardware  
As some bits are semantically relevant (e.g., clock status)



24 bit - Clock enable  
0 OFF  
**1 ON**

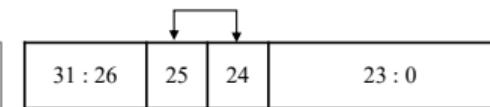
25 bit - Clock ready flag  
0 Unlocked  
**1 Locked**

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3: if (*REG_CLOCK & 0x2000000) == 0) {
4:     return HAL_ERROR;
5: }
6: Freq = HAL_RCC_GetSysClockFreq();
7: return HAL_OK;
```

## Memory Mapping



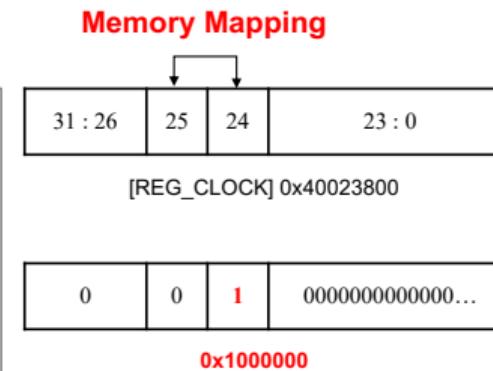
24 bit - Clock enable  
0 OFF  
1 ON

25 bit - Clock ready flag  
0 Unlocked  
1 Locked

# Hidden Memory Mapping

Peripheral register bits get simultaneously updated by the MCU hardware  
As some bits are semantically relevant (e.g., clock status)

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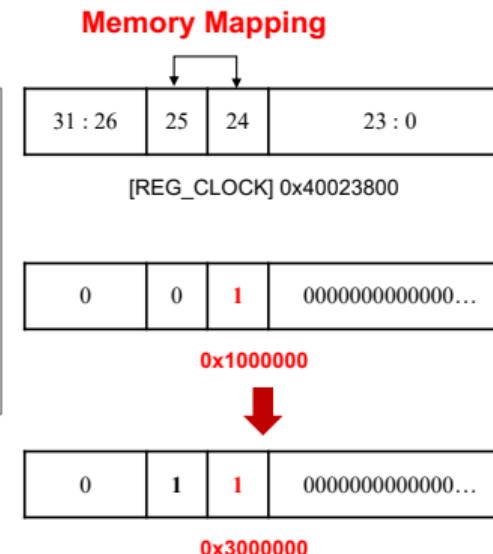
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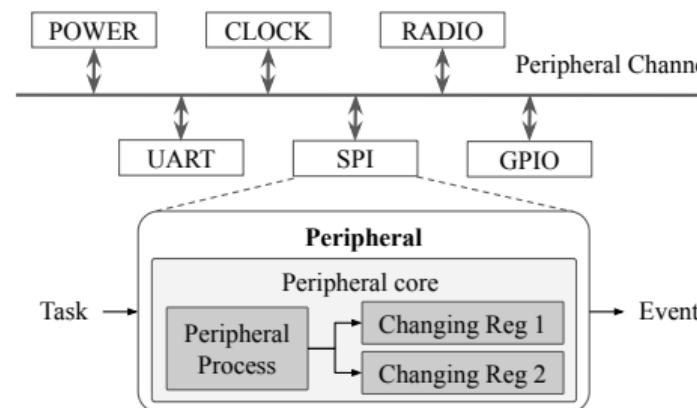
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# Hidden Memory Mapping

## Root cause: Autonomous Peripheral Operation

Hardware feature in microcontroller architectures. The peripheral performs its operation without CPU intervention to save energy.



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Hardware feature in microcontroller architectures. The peripheral performs its operation without CPU intervention to save energy.

### Bit 24 PLLRDY: Main PLL (PLL) clock ready flag

Set by **hardware** to indicate that PLL is locked.

0: PLL unlocked

1: PLL locked

### Bit 1 SBF: Standby flag

This bit is set by **hardware** and cleared only by a POR/PDR (power-on reset/power-down reset) or by setting the CSBF bit in the PWR\_CR register

0: Device has not been in Standby mode

1: Device has been in Standby mode

# AUTOMAP Overview

## Challenges

- ① Nearly infinite number of possible writes to peripheral registers
- ② Cannot infer memory mappings from code-level
- ③ Dependency of peripheral register writes

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## Challenges

- ① Nearly infinite number of possible writes to peripheral registers
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## Solutions

- ① On-demand memory mapping inference
- ② Differential memory introspection through hardware-in-the-loop
- ③ Memory context preparation by executing previous peripheral registers write intrusions

# Experiment Setup

- ▶ Three MCUs
  - ▶ Nordic NRF52832
    - ▶ 41 example firmware included in SDK
  - ▶ STMicroelectronics STM32F103
    - ▶ 5 real-world firmware from  $\mu$ EMU [[ZGLZ21](#)]
  - ▶ STMicroelectronics STM32F429
    - ▶ 4 real-world firmware from  $\mu$ EMU [[ZGLZ21](#)]

# Experiment Results

## Identity Memory Mapping in Example Firmware

At least one memory mapping is discovered in every firmware. Even single register write can affect multiple other registers.

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MCU	Firmware	# of Writes Causing M.M	Max # of M.M by single write
NRF52832	bk_freertos	21	7
	bk	9	3
	bk_RTC	21	7
	bk_systick	9	3
	bsp	35	11

Table: Memory mapping result on example firmware of NRF52832

# Experiment Results

## Integrating AUTO MAP with $\mu$ EMU

AUTO MAP with  $\mu$ EMU can cover at most 15.59% more basic blocks than  $\mu$ EMU.

# Experiment Results

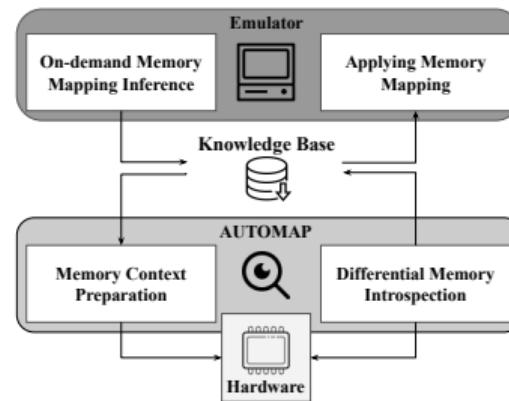
## Integrating AUTO\_MAP with $\mu$ EMU

AUTO\_MAP with  $\mu$ EMU can cover at most 15.59% more basic blocks than  $\mu$ EMU.

Firmware	# executed BBs		BBs portion of AUTO_MAP not in $\mu$ EMU	
	AUTO_MAP	$\mu$ EMU	#	%
Drone	1,413	1,410	5	0.35%
Gateway	1,385	1,248	216	15.59%
Steering_Iron	1,402	1,289	116	8.27%
Reflow_Oven	845	830	17	2.01%
Robot	1,035	964	77	7.43%

Table: Fuzzing result comparison between  $\mu$ EMU and both AUTO\_MAP and  $\mu$ EMU.

# AutoMap [RAID'22]



## AUTOMAP

- ▶ Discover memory mapping in peripheral registers.
- ▶ Propose AUTOMAP to discover memory mappings systematically.
- ▶ Emulate firmware properly with memory mappings and execute more basic blocks when AUTOMAP integrates with  $\mu$ EMU.

The source code is available at <https://github.com/OSUSecLab/AutoMap>.

# Takeaways

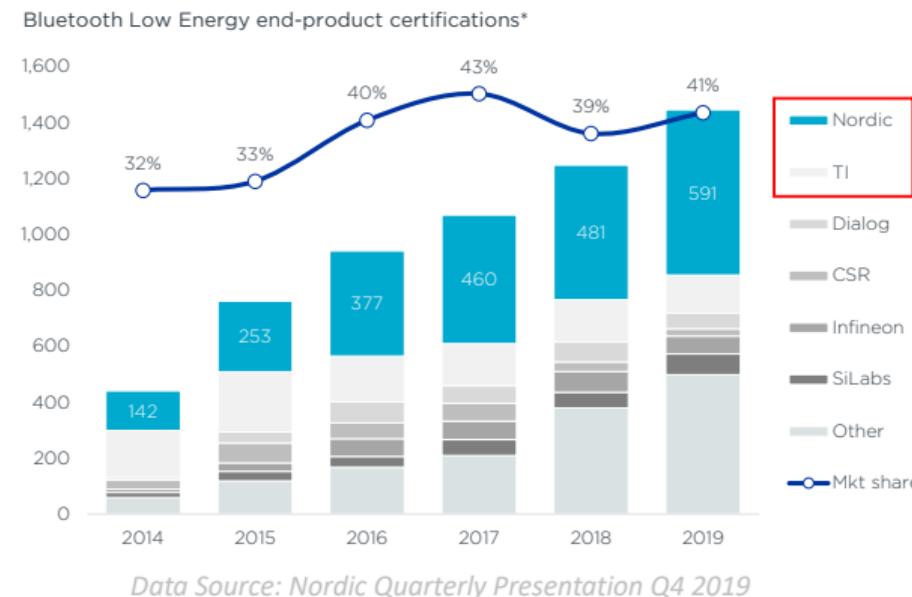


- ▶ The need to analyze new domains for heterogeneous IoT binary analysis
- ▶ New domains (mechanisms, architecture, API...) lead to new *insights* and *techniques*
- ▶ Should be encouraged as long as the domain is *valuable*

# The Potentials of Domain-Aware Analysis

Name	Category	# Repository	%
Qt	Framework	45,635	35.70%
ROS	Robotics	16,796	13.14%
Boost	Framework	6,205	4.85%
MFC	Framework	4,409	3.45%
Cocos2d	Game Engine	3,587	2.81%
OpenFrameworks	Framework	3,264	2.55%
JUCE	Framework	2,204	1.72%
PCL	Robotics	1,719	1.34%
imgui	GUI	1,557	1.22%
wxWidgets	GUI	1,076	0.84%
Cinder	Framework	1,042	0.82%
Allegro	Game Engine	958	0.75%
Godot	Game Engine	682	0.53%
GamePlay	Game Engine	561	0.44%
dlib	Framework	547	0.43%
FLTK	GUI	518	0.41%
GTK++	GUI	436	0.34%
LibU	Framework	425	0.33%
raylib	Game Engine	376	0.29%
gtkmm	GUI	349	0.27%

Top C++ frameworks for software development.



# The Potentials of Domain-Aware Analysis



Azure IoT Hub

RTOS

- ➊ Systematically vetting domain-specific applications

# The Potentials of Domain-Aware Analysis



Azure IoT Hub

RTOS

Watson IoT™



- ① Systematically vetting domain-specific applications
- ② Extension to other IoT domains, architectures, frameworks...

# The Potentials of Domain-Aware Analysis



- ① Systematically vetting domain-specific applications
- ② Extension to other IoT domains, architectures, frameworks...
- ③ Support various security applications (e.g., Qt-Fuzz, Automap-Fuzz)

# The Potentials of Domain-Aware Analysis



- ① Systematically vetting domain-specific applications
- ② Extension to other IoT domains, architectures, frameworks...
- ③ Support various security applications (e.g., Qt-Fuzz, Automap-Fuzz)
- ④ Generalize methodology and insights to other similar domains

Thank You

# Unlocking the Potential of Domain Aware Binary Analysis in the Era of IoT

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March 3rd, 2023

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