Confidential Al Overview

Kevin Townsend, Linaro Trusted Firmware Tech Forum 11 May 2023



What is 'Confidential AI'?

- An attempt to demonstrate end-to-end security best practices
- Making use of the security features on modern Cortex-M hardware
- Based on open source software and open standards
- With Al/ML workloads as a test case

Project Goals

- Vendor neutral: TFLM or MicroTVM Cloud vendor neutral
- Emulation-friendly: mps2_an521 (M33) mps3_an547 (M55)
- Open source firmware: MCUBoot, TF-M, Zephyr
- Open standards: TLS, X.509 certificates, COSE

What would that look like ... ?



Core Components in a Secure IoT System





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Confidential AI Proof of Concept



Device Provisioning



Device Provisioning



Best Practice: Storage-Free Key Derivation

- Safest way to store a key is never store it!
- Private key storage is high risk
- Derive device-bound key w/HUK
- Key regenerated at boot
- Persistent across updates
- Generate a CSR (MbedTLS, etc.)
- Send CSR to CA for signing
- X.509 cert stored in the open
- * This same approach is also be used to derive a device UUID





Best Practice: Mutual TLS

- Basic TLS authentication only validates the **SERVER** identity
- TLS optionally includes **Client Authentication**, where the server also asks the client device to provide proof of it's identity



Basic TLS





Mutual TLS





Client Authentication?





LITE Bootstrap Server

- Written in golang
- Basic Certificate Authority (CA) functionality:
 - Certificate Signing Request (CSR) processing
 - Verify certificate status
 - Certificate updates, etc.
- Authenticated REST API
 - Requiring a pre-shared X.509 certificate and key to connect to REST API
- Callback to register devices on **cloud provider(s)** during CSR processing
- Secondary TCP server demonstrating Mutual TLS on the server side
- Proof of concept!

Github: https://github.com/Linaro/lite_bootstrap_server



X.509 Certificate Provisioning Workflow



Secure Inference



Secure Inference



Secure Data Pipeline



Secure Data Pipeline



Secure Data Path





COSE Payload Encryption

- **TLS may not always be available**, or you may need to protect payloads before or after the TLS connection (untrusted NS firmware, public MQTT endpoint, etc.)
- COSE allow for flexible encryption using modern cyphers, but **performance is problematic** (particularly signing operations)
- COSE encryption is new compared to COSE signing (as used in attestation tokens)
 - Library support for ENCRYPT/ENCRYPT0 is still very poor
 - C libraries like t_cose are making an effort to improve this, but still a WIP
- Our initial proposal for **Efficient COSE encryption** was presented at Linaro Connect 2023: <u>LHR23-313: Secure IoT Data Flow</u>
- Current Rust demonstration of this approach (**'flow**') is available at: <u>https://github.com/Linaro/zephyr_confidential_ai/tree/main/tools/flow</u>



Attestation Tokens: What from Where, and When?



AI Attestation Token

- Entity Attestation Tokens (EAT) allow devices to make claims about their status
- This can include:
 - Device ID
 - Software and hardware versions
 - Inference engine and model versions
- Model outputs are associated with a specific attestation token
- Tokens can be transmitted during device connection, or on system state changes
- Why bother?
 - Defective or malicious models can and eventually will be deployed
 - Attestation tokens allow us to know which outputs to reject or remove in the data aggregation phase once a security issue is identified



Testing it Out



Platform: QEMU

- QEMU has <u>Arm v8M-profile support</u> including emulated security functions such as:
 - MPU (Memory Protection Unit Extension)
 - PXN (Privileged Execute Never)
 - S (Security Extension)
- We used the following platforms emulated in QEMU, which also include networking support:
- mps2_an521_ns (Arm Cortex M33)
 - MPS2 is an FPGA-based Arm development board
 - It runs an Arm model defined in <u>Application Note AN521</u>
- mps3_an547_ns (Arm Cortex M55)
 - MPS3 is an evolution of MPS2
 - It runs an Arm model defined in <u>Application Note AN547</u>
 - This model is also known as Arm® Corstone™ SSE-300





Application Code and Component Repositories



TF-M

— Confidential AI Proof of Concept Application: https://github.com/Linaro/zephyr_confidential_ai

Open Source Components:

- LITE Bootstrap <u>https://github.com/Linaro/lite_bootstrap_server</u>
 - MCUBoot https://github.com/mcu-tools/mcuboot
 - https://git.trustedfirmware.org/TF-M/trusted-firmware-m.git/
 - Zephyr RTOS <u>https://github.com/zephyrproject-rtos/zephyr</u>
 - MicroTVM https://tvm.apache.org/docs/topic/microtvm/index.html
- TFLM <u>https://www.tensorflow.org/lite/microcontrollers</u>
 - MbedTLS <u>https://github.com/Mbed-TLS/mbedtls</u>
- COSE <u>https://github.com/laurencelundblade/t_cose</u>

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