



# **AI Solutions**

Learning on STM32 with Cartesiam: for equipment monitoring and more

October 13th, 2020



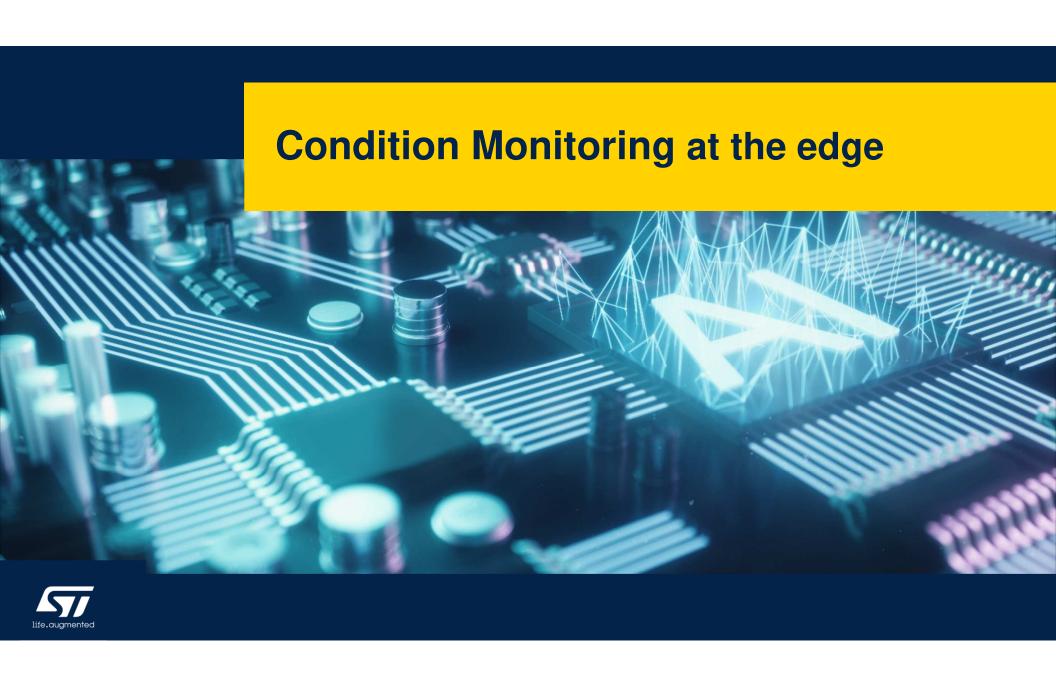


### Agenda

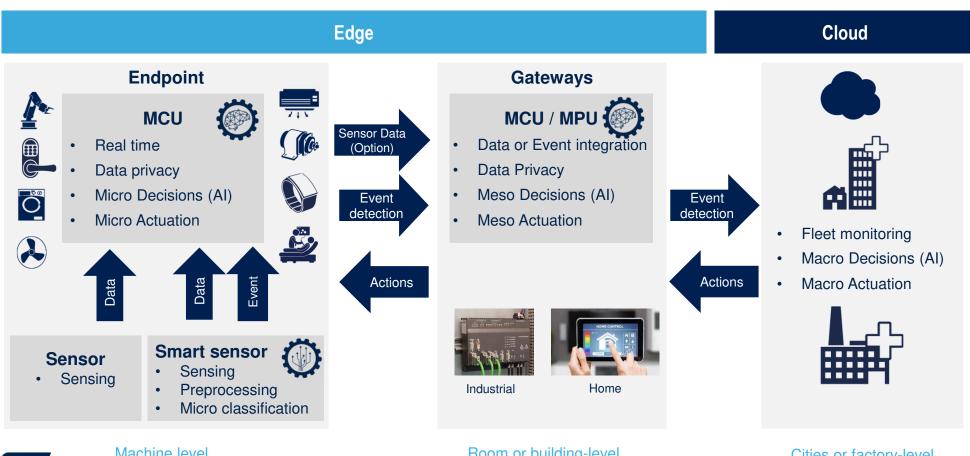
#### **Learning on STM32 with Cartesiam**

- 1 Condition Monitoring at the edge
- 2 Cartesiam and ST offers
- 3 Use cases and applications
- 4 Expand with STM32Cube.Al and connectivity
- 5 Q&A





### Distributed AI from Edge to Cloud





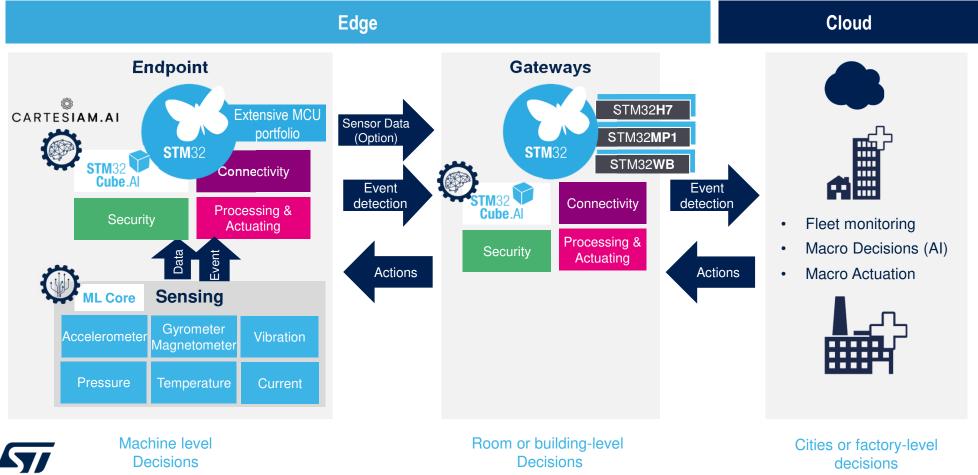
Machine level Decisions

Room or building-level Decisions

Cities or factory-level decisions

5

### Distributed AI from Edge to Cloud



### Benefits of AI inferencing and learning at the Edge

Realtime / low latency



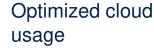
No privacy issue



Better user experience



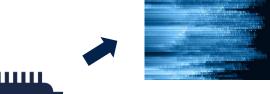
Reliable to connectivity loss











No need for large dataset collection



Adapt to local conditions



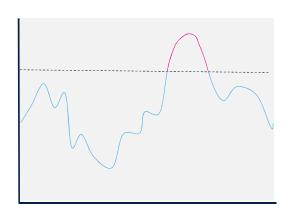
No need for extensive data scientist work



Edge inferencing benefits

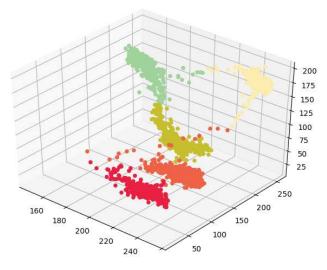
Edge learning benefits

### Benefits of AI vs traditional approach



Handcrafted rule based on experience in the field

Procedural programming



Rules learnt automatically from base of data

Learn from example



### Steps to a predictive maintenance system

# Data Acquisition

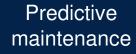
- Acquisition sensor setup
- Retrieve data over wired/ wireless connectivity
- Label data
- Store data



- Data cleaning / denoising
- Data visualization
- Preprocessing and Feature Extraction
- Feature Engineering



- Machine learning of the system behavior
- Semi-supervised learning at the edge for anomaly detection
- Supervised learning to classify anomalies



TIT

- Model deployment
- Remaining Life prediction models
- Overall efficiency optimization
- Operational systems integration

Edge - Factory Level (processed sensors data)

Company Level (ERP, etc.)



### Jump-start a predictive maintenance program

# 84% of surveyed companies interested to develop Predictive Maintenance



...but 25% started to implement

#### The challenges

- Data collection, cleaning and labelling
- IT security / infrastructure
- Lack skilled data scientists and embedded developers
- High investment cost
- Bridge gap between OT/IT teams

#### What we need today

- Algorithms relying on smaller dataset
- Learning at the edge
- Solutions to integrate Machine Learning capabilities without deep AI knowledge



Source : BearingPoint analytics

### **ST and Cartesiam offers**





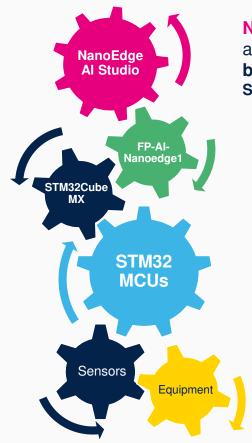


### FP-AI-NANOEDG1 with NanoEdge AI Studio

#### Develop ML-based condition monitoring solution in a couple of hours and without any data science skill







NanoEdge Al studio from CARTESIAM.AI allow you to generate free libraries on ST board such as STEVAL-STWINKT1B and STM32L562E-DK

NEW

FP-AI-NANOEDG1: code example demonstrating Cartesiam library's integration into STM32 ecosystem

Run condition monitoring on all STM32 portfolio

Select **sensor** adapted to your application to monitor vibration, current, temperature, etc





## MCUs and sensors for condition monitoring







High Perf MCUs







Wireless MCUs



#### MEMS & Sensors



LPS22HH	High Accuracy – Compact Size Absolute <b>Pressure Sensor</b>
LPS27HHW LPS33HW	Water Resistant Absolute <b>Pressure Sensor</b>
STTS22H	Digital Temperature Sensor
STLM20	Analog Temperature Sensor







Acoustic

IIS3DWB	Ultra Wide Bandwidth Accelerometer
ISM330DLC ISM330DHCX	Wide Bandwidth Accelerometer + Gyroscope
IIS2DH	Wide Bandwidth, Ultra-low- power <b>Accelerometer</b>
IIS2MDC	Low-Noise, Low Power Magnetometer

MP23ABS1TR	Analog Differential Microphone
IMP34DT05-A	Digital Top Port Microphone





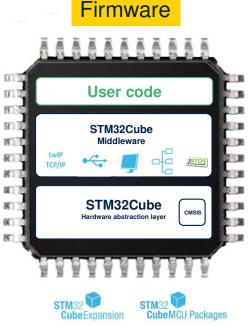
### STM32 Ecosystem fundation

### Making it easy to start development, develop Proof of Concept

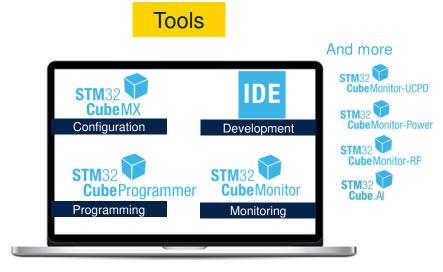




Hardware



NANOEDGE AI STUDIO





macOS® 🐧





### SensorTile Wireless Industrial Node

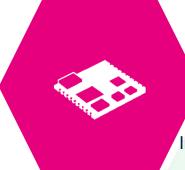
STEVAL-STWINKT1



Inference on STM32L4R9



#### Capture data



#### Industrial-grade sensors

- Industrial scale 9-DoF motion sensors including accelerometer, gyrometer and an ultra wide-band vibrometer with ultra low noise
- · Very high frequency audio and ultrasound microphone
- High precision temperature and environmental monitoring
- Micro SD card for standalone data logging
- BLE4.2 connectivity and WiFi expansion board
- USART

www.st.com/stwin









### FP-AI-NANOEDG1

#### Initial Setup

- Download FP-AI-NANOEDG1 on www.st.com
- •Flash STM32 Board

#### **Data Acquisition**

- •Use FP to acquire data onto the microSD™ card
- •Extract logs using the Python™ scripts provided

### Machine Learning Library Generation

- •Generate a Machine Learning library with NanoEdge™ AI Studio based on the data acquisition
- •Download the library from the Cartesiam website



#### Install Library

- Replace the stub provided with the function pack by the newly generated library
- Rebuild firmware
- Program the new firmware

#### Learn

 Learn the nominal modes on the edge

#### Detect

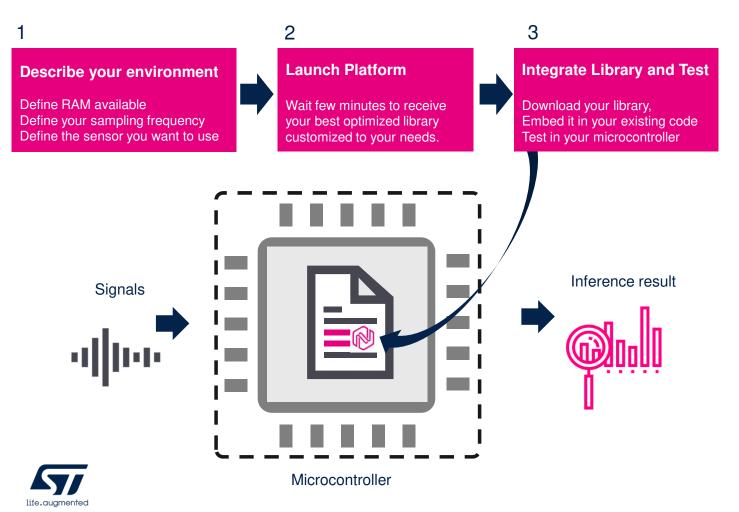
- Monitor anomalies in detection mode
- Go back to learn mode to acquire new modes



FP-AI-NANOEDG1

Cartesiam

### NanoEdge Al Studio





#### **NANOEDGE AI** by Cartesiam

- The only commercially available solution bringing capabilities such as LEARNING, UNDERSTANDING and ANALYZING data directly into microcontrollers.
- A software component to easily and instantaneously bring AI software update to your solutions

## **Uses cases & applications**





## Monitoring using vibration sensors









#### **Problem**

- Reduce unexpected failure and allow post-sales customer service to plan maintenance
- ➤ A home appliance leader want to upgrades its offerings to improve level of service

#### **Solution**

State and environment have been learnt with FP-AI-NANOEDGE function pack, an obstructed pipes will generate abnormal vibration and will be detected and signaled

### Home Appliance monitoring



#### **Problem**

- ➤ Billions of gallons of water are wasted every year because of leakage.
- Consequence can be worst when there is a dangerous liquid or gaz leak

#### **Solution**

➤ Without changing any part in the HW design, embed a ML brick into STM32 MCUs that could identify leak with a 100% accuracy by monitoring pipes behaviors



### Leak Detection



### Circuit breakers



#### **Problem**

➤ The mechanical ageing of circuit breakers is virtually impossible to anticipate, leading to untimely power outages and costly production stoppages

#### **Solution**

- Circuit breaker aging can be analyzed from vibration patterns during switching
- NanoEdge AI solution has been successfully implemented inside circuit breaker to learn normal pattern of switch and help anticipate predictive maintenance





### Reflow oven maintenance

#### **Problem**

 Lacroix want to monitor reflow ovens condition, as xxx varies based on xxx

#### **Solution**

- The solution was developed in a few weeks and installed on external sensors.
- They immediately started to detect anomalies and had a solution up and running a few weeks after they started the project by learning behaviour locally?
- They estimate that they saved between 20 to 50 times in elapsed time and cost vs if they had to develop the same solution from scratch





### Monitoring using current sensors







### Air conditioner filter monitoring



#### **Problem**

- In an air conditioning system, it is very difficult to detect when a filter is clogged.
- ➤ The engineers had imagined installing cameras to film the colorimetry of the filters and compare it to a pre-learned model to detect when a filter was obstructed. They did not succeed.

#### Solution

- ➤ At the time of the first start-up of an air conditioner, NanoEdge AI learns the "shape" of the high-frequency directly inside the motor control card. No additional sensor is needed.
- When the filter is slightly obstructed, the shape of the high frequency current is alternated and detected by the NanoEdge Al library.









#### **Problem**

- > Doors are critical part of the elevator; issue can have serious impact on user or elevator itself
- however monitoring opening and closing over the time is not an easy task.

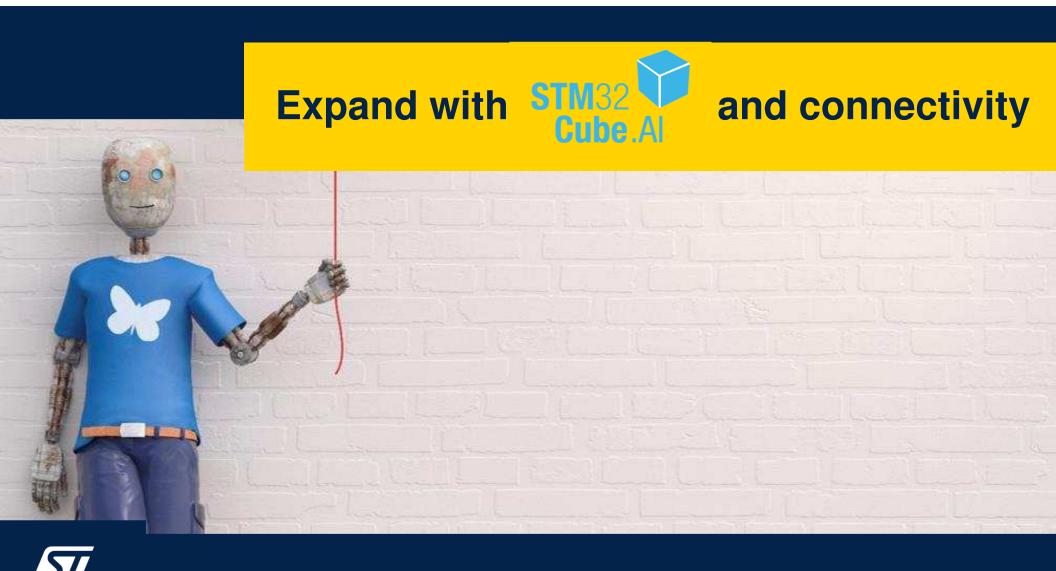
#### Solution

- > Learn the opening / closing current pattern NanoEdge AI learns directly inside the motor control card or adding an ammeter.
- > When the current pattern is slightly different due to any source opposite force on the door, NanoEdge Al library running on STM32 will directly report an anomaly.



### Elevator door monitoring





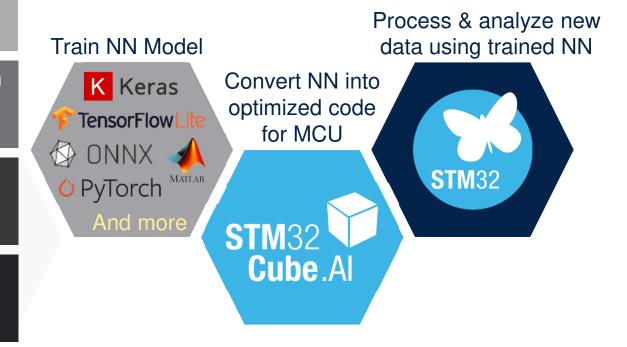
### Teach your STM32 to classify anomalies with STM32Cube.Al tool 27

**STM**32**Cube**.Al offers interoperability with state-of-the-art Deep Learning design frameworks

Any framework that can export models in **ONNX** open format can be imported, including quantized models

Automatic and fast generation of an STM32-optimized library

On-device validation enable fast comparison of model accuracy vs different memory / quantization options







life.augmented

### Making Al Accessible Now

#### Leader in Arm® Cortex®-M 32-bit General Purpose MCU



## Add connectivity with FP-IND-PREDMNT2

#### Take advantage of BLE and WIFI through application and dashboard



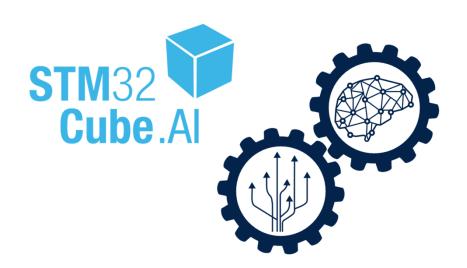
Monitor device and log data locally over BLE

DSH-PREDMNT web-based dashboard to monitor anomalies, log data/parameter and trigger re-training



### STM32 solutions for AI

#### An extensive toolbox to support easy creation of your Al application



Al extension for STM32CubeMX to map pre-trained Neural Networks



**Software examples** for Quick prototyping Audio, Motion and Vision Function packs On **ST development Hardware** 



STM32 **Community** with dedicated Neural Networks topic



Trainings, hands on, MOOCs and partners **videos** 



STM32 AI Partner Program
with dedicated Partners providing
Machine or Deep Learning engineering
services

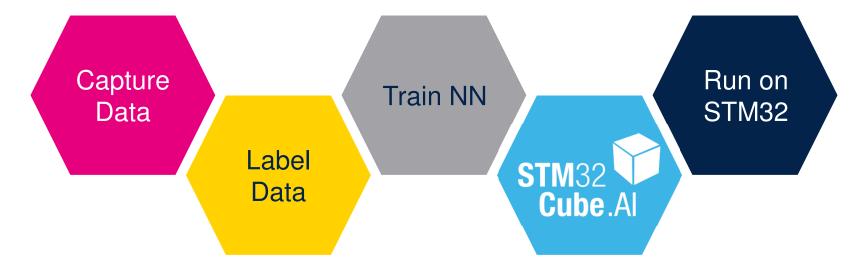


### For more information



### www.st.com/STM32CubeAl









## Releasing your creativity





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# Thank you

