ST's Condition Monitoring Solutions
Introduction

Condition-based Monitoring (CbM) and Predictive Maintenance (PM) are two maintenance strategies which aim at optimizing equipment efficiency and reducing service timing and costs during equipment lifecycle.

**Condition Monitoring (CM)** is the monitoring of several parameters such as equipment vibration and temperature to identify potential issues such as misalignments or bearing failures. Condition monitoring tools can, for instance, map equipment degradation when a vibration analysis shows a change in the harmonic frequency of rotating equipment components. Frequency analyses can be based both on vibrometer and microphone data. Also MCSA (Motor Current Signal Analysis) is used as a technique that is complementary with respect to Vibration Analysis. It offers benefits and works better on some specific anomalies like unbalance.

Continuous Condition Monitoring techniques can be applied on several pieces of equipment such as compressors, pumps, spindles and motors and can also be implemented to identify partial discharge on machine or vacuum leaks.

**Predictive Maintenance** is based on Condition Monitoring, anomaly detection and classification algorithms, and integrates predictive models which can estimate the remaining machine runtime left, according to detected abnormalities. This approach uses a wide range of tools, such as statistical analyses and Machine Learning to predict the state of the equipment.

**CONDITION BASED MONITORING TYPICAL APPLICATIONS**

<table>
<thead>
<tr>
<th>Factory Automation</th>
<th>Power, Energy &amp; Utilities</th>
<th>Home Appliances and Building Automation</th>
<th>Structural Health Monitoring</th>
</tr>
</thead>
<tbody>
<tr>
<td>Industrial motor vibration monitoring</td>
<td>Pipe flow monitoring</td>
<td>Compressor vibration monitoring</td>
<td>Infrastructure inclination monitoring</td>
</tr>
<tr>
<td>Bearings ultrasound monitoring</td>
<td>Temperature, humidity, gas monitoring</td>
<td>Washing machine vibration monitoring</td>
<td>Railway monitoring</td>
</tr>
<tr>
<td>Motor current monitoring</td>
<td>Acoustic monitoring</td>
<td>Vacuum cleaner monitoring</td>
<td>Bridge vibration monitoring</td>
</tr>
</tbody>
</table>

ST’S PORTFOLIO FOR CONDITION MONITORING AND PREDICTIVE MAINTENANCE IN INDUSTRY 4.0

Condition Monitoring and Predictive Maintenance are value-added yet challenging applications in Industry 4.0. ST has therefore deployed advanced ICs and an ecosystem of evaluation tools, software, documentation and online dashboards for remote monitoring, which are continuously updated to be in keeping with industrial needs.
ARCHITECTURE AND MAIN ELEMENTS: SMART SENSOR NODES AND GATEWAY

From designing smart sensor nodes and configuring embedded software running in sensor nodes and the gateway, to developing software to be integrated in the Cloud or company Enterprise Resource Planning (ERP) system, Predictive Maintenance requires a variety of skills and competencies. **Machine Learning** and **Artificial Intelligence** algorithms can be implemented to ensure technical abnormalities are detected early and equipment uptime is maximized.

Today market is mainly segmented in:

- New equipment (greenfield): Integration possible with power supply and existing sensors
- In-field maintenance (retrofit): Battery-powered simplifies installation

**Smart Sensor Nodes** and **Gateways** are key enablers of predictive analysis. They gather and log pre-processed, secure data to be displayed in visualization tools and used in other processing algorithms. Smart sensor nodes can also process data and detect anomalies by reducing computational latency. For example, smart sensor nodes can detect a small rise or a sudden increase in temperature indicating a probable device issue and future reliability problems.

**Gateway** combines and distributes processing power among smart sensor nodes and gateways with the aim of sending the right data at the right time to enterprise-level systems where more advanced analyses can be performed. Processing at the Edge can also use Machine Learning and Artificial Intelligence (AI) algorithms to enhance smart sensor node and gateway mission profiles and to broaden the scope of anomaly detection and classification.

**KEY PRODUCTS**

**ST SENSORS FOR INDUSTRY 4.0 - A COMPLETE PORTFOLIO**

ST offers high-performance, cost-competitive sensors and Inertial Measurement Units (IMUs) with 10-Year Product Longevity Commitment, including Vibration Sensors and ultra-sound analog microphones enabling vibration analysis from simple Pass/Fail monitoring to high-accuracy, frequency-based data analysis. Our portfolio also includes a wide range of environmental sensors for temperature, humidity and pressure sensing and smart MEMS Sensors with advanced programmable digital features such as Finite State Machine and the Machine Learning Core. Thanks to Unico-GUI framework, smart sensors can be programmed to identify patterns implementing AI algorithms (decision tree) in a local classification engine. This offloads computation from the main controller, allowing it to focus on high-level processing and enables the possibility to explore more power efficient architectures, bringing unprecedented value also in terms of overall system cost.

**Vibration**

- **ISM30WB** *Ultra-wide bandwidth (up to 6kHz), low-noise 3-axis digital Vibration sensor**
- **ISM330DHCX** *Wide Bandwidth Accelerometer + Gyroscope with Machine Learning Core**
- **ISM21CL** *High-accuracy, high-resolution, low-power, 2-axis digital inclinometer with Machine Learning Core**
- **ISM29D2C** *Low Noise, Low-Power Magnetometer**
- **ISM330DLC** *iNEMO Inertial measurement unit (IMU): 3D accelerometer and 3D gyroscope with digital output**

**Acoustic**

- **IMP23ABU** *Analog bottom port microphone with frequency response up to 80kHz for Ultrasound analysis**
- **IMP34DOT** *Digital Top Port Microphone**

**Environmental**

- **LPS22HH** *High-Accuracy - Compact Size Absolute Pressure Sensor**
- **LPS27HW** *Water Resistant Absolute Pressure Sensor**
- **STTS22** *Digital Temperature Sensor**
- **STLM20** *Analog Temperature Sensor**
- **HTS221** *Relative humidity and temperature Sensor**

**Note**: *10-years longevity**
STM32: 32-BIT MCUS AND MPUS

ST offers a large portfolio of STM32 Arm® Cortex® from M0 to M7-based microcontrollers addressing many different markets. The STM32 products can be effectively used to develop embedded AI solutions, thanks to the STM32 AI framework, and thanks to a broad ecosystem of Partners to ease the implementation of Predictive Maintenance algorithms on MCU and MPU edge devices.

STM32 compatible with STM32Cube.AI ecosystem

THE BENEFIT OF EDGE PROCESSING AND THE ROLE OF AI

Condition Monitoring and Predictive Maintenance systems include a several smart sensor nodes in the equipment, which are directly connected to the cloud or connected via intermediate gateways. Computation is performed inside the smart sensor or on the local microprocessor, either in gateways or in the cloud, depending on the expected latency and on how far the raw data and processed data are sent over connectivity. Edge processing occurs when the computation of data is carried out directly in the smart sensor node or at the gateway, in order to save power consumption and ensure data is kept confidential, allowing companies to analyze critical information at the node level and to reduce anomaly detection time. Combining edge and cloud computing technologies could help to develop predictive maintenance techniques and enhance their efficiency and effectiveness. Indeed, working on data at the edge, close to the sensor, allows companies to detect machine deterioration at the node level and to take immediate and informed corrective actions, thus preventing further damage and machine failures.

Long-term analysis and actions to determine trends and optimize local analysis models can be managed on the cloud, enabling more complex analytics on large amounts of pre-processed data coming from multiple nodes.

Benefits of Edge processing:

- Confidentiality: data is not sent to the cloud and is locally stored on the device or the equipment
- Cost reduction: latency and throughput of high-volume time-series asset data is significantly optimized. Reducing the amount of useless machine data sent and stored in the cloud leads to significant benefits, as it enables real-time distributed applications and eliminates the need for complex systems.
- Lower latency: minimal delay in the repair of equipment is essential for assets which are mission-critical.

Processing at the Edge can also use Artificial Intelligence (AI) such as Machine Learning (ML) algorithms to enhance smart sensor node and gateway mission profiles and to broaden the scope of anomaly detection and classification.

Nanodeg™ AI Studio* (NanoEdgeAIStudio) is a new Machine Learning (ML) technology to bring true innovation easily to the end-users. In just a few steps, developers can create an optimal ML to address anomaly learning, detection and classification, regression and outliers library for their project, based on a minimal amount of data. Nanodeg™ AI Studio makes it easier for users to integrate such cutting-edge machine-learning capabilities quickly, easily, and cost-effectively into their equipment. No Machine learning or data-science expertise is needed.

*Nanodeg™ AI Studio is available under 3-months evaluation license for free experiments, for more info (hyperlink to https://www.st.com/en/development-tools/nanoedgeaiassistantstudio.)
ST is a leading supplier in power management and mixed-signal ICs for mobile applications, offering a wide range of products from simple power management ICs up to highly-integrated devices that mix power management blocks with advanced analog and digital functionalities.

Connectivity is an increasingly important aspect of condition monitoring, as data is only useful if it can be acted upon. Wireless connectivity technologies have developed enormously in recent years, spurred on by the IoT and, now, the Industrial IoT (IIoT) which is primarily where condition monitoring resides. A range of wired and wireless communication solutions complement our offering: IO-Link-compatible devices for industrial wired connectivity, and a portfolio of wireless technology such as Bluetooth Low Energy SoCs and network processors, as well as LPWAN SoCs and transceivers supporting LoRa, Sigfox and licence-free ISM and SRD frequency bands.

ST’s current sense amplifier IC portfolio offers a large variety of high-performance devices. Current sensing solutions add valuable safety and protection features to system designs. They provide information to control current in power systems and avoid overheating and short circuits, enabling Motor Current Signal Analysis with specific processing like FFT Advantages are complementary respect to Vibration Analysis.

**High-side**
- if ground line cannot be cut (return to neutral by chassis)
- if multiple outputs power supply (all currents are combined in Gnd line)
- if application is sensitive to RF disturbances and requires Gnd line continuity

**ST solution**
TSC series STEVAL-AETKT1V2 : Evaluation kit for high voltage bidirectional current sense amplifiers

**ST solution**
TSZ: very high-accuracy zero drift 5 V op amps
TSV79: 50 MHz-bandwidth 5 V op amps

**POWER MANAGEMENT**

**DC/DC converters**
- **ST1PS0X**: 400 mA Nano-Quiescent™ Synchronous step-down converters
- **L7W3**: 60 V 300 mA Synchronous step-down switching regulator with 10 µA quiescent current
- **L6W3**: 38 V 3 A Synchronous step-down converter with 17 µA quiescent current
- **L6W41**: 38 V 1.5 A Synchronous step-down converter with low quiescent current

**Low Dropout (LDO) Linear Regulators**
- **STL020**: 200 mA ultra-low quiescent current LDO
- **LDL030**: 300 mA ultra-low noise LDO with power good and soft start
- **LDL025**: 250 mA ultra-low noise LDO
- **LDL030**: 300 mA very low dropout current linear regulator IC
- **LD19130S**: 300 mA very low quiescent current, with green mode linear regulator IC
- **LDS7100**: 1A ultra low drop, with bias, linear regulator IC

**CONNECTIVITY SOLUTIONS**

**NFC & RFID**
- **ST25DV-02C**: Dynamic NFC / RFID tags

**Bluetooth Low Energy**
- **BlueMRG-£P**: Programmable Bluetooth® LE 5.2 Wireless SoC
- **BlueMRG-2**: Highly energy-efficient Bluetooth 5.2 Wireless SoC
- **STM32WB**: Multi-protocol (Bluetooth 5.0 / BLE 5.1) Wireless SoC with integrated balun
- **RALF-6000/D3**: Balun for S2-LP
- **S2-LP**: Ultra-low-power, high-performance, sub-1GHz transceiver
- **S2-LPTX**: Ultra-low-power, high-performance, sub-1GHz transmitter

**WLAN**
- **STM32WB**: Bluetooth LE 5, Zigbee, Thread, proprietary Wireless SoC (integrated balun)

**Wired Connectivity**
- **L6364**: IO-LINK Dual Device transceiver
- **STM32F4L**: low power differential line transceiver for data transmission of smart RF applications in full-duplex mode

**Cellular**

**WPAN**

**ST25DV-I2C**
- Dynamic NFC / RFID tags

**L6364**
- IO-LINK Dual Device transceiver

**STM32F4L**
- low power differential line transceiver for data transmission of smart RF applications in full-duplex mode

**TSZ**
- very high-accuracy zero drift 5 V op amps

**TSV79**
- 50 MHz-bandwidth 5 V op amps
FROM CBM TO PDM FOLLOW YOUR PATH WITH ST SOLUTIONS

ST provides different hardware and software solutions to help designers in their job. Starting from the Product Evaluation Boards, that can be used to perform a comprehensive evaluation of ST’s products, arriving to the Solution tailored to exploit one or more features of the application with a kit of HW and SW packages.

Particularly for Condition Based Monitoring, the set of tools allow to move step by step along the development flow.

ST offers a broad range of solutions. Solutions are presented as a set of products that enable our customers to deliver best performance with cutting edge technology in their application domain. Our solutions are offered at many different levels, varying from basic functional elements of an application to entire subsystems where appropriate.

Each solution is accompanied by a solution evaluation kit, allowing rapid evaluation of the products, within a proven design, in order to accelerate your prototyping and development process.

DESIGN SUPPORT HARDWARE
REFERENCE DESIGN AND
DEVELOPMENT KITS

STMicroelectronics has developed smart sensor nodes and SW packages to emulate a typical architecture where smart sensor nodes can be either connected with Gateway or directly with WPAN connectivity to the data lake on premise or in Cloud application. Particularly two families of smart sensor nodes have been developed in a typical IO Link sensor to Master vertical integration (STEVAL-BFA001V2B) or wireless node with multi connectivity options from Bluetooth, to WIFI, to Cellular (STEVAL-STWINK1B). Related SW for IO Link stack, vibration analysis, cloud application and much more complete the offer with following solutions.

Data Cleaning/Denoising
Data Visualization
Preprocessing
Feature Extraction
Feature Engineering
Machine learning of the system behaviour
Semi-supervised learning at the edge for anomaly detection
Supervised learning to classify anomalies
Model deployment
Remaining Life prediction models
Overall efficiency optimization
Operational system integration

Data Acquisition
Condition Monitoring
Anomaly detection & classification
Predictive maintenance

ST Solutions

Data Acquisition
Condition Monitoring
Anomaly detection & classification
Predictive maintenance

Edge - Factory Level (processed sensor data)
Company Level (ERP, etc.)
**SOLUTION END TO END**

**Data Acquisition**

**Condition Monitoring**

**HW Component**
- STEVAL-STWINKT1B
- STEVAL-STWINWFV1
- P-L496G-CELL02

**SW Component**
- DSH-PREDMNT
- FP-IND-PREDMNT1
- STSW-STWINCELL

**SL-PREDMNT-S2C**
A Condition monitoring sensor to cloud for vibration analysis with WiFi and Cellular Connection

**HW Component**
- STM32MP157C-DK2
- STEVAL-IDP004V2
- STEVAL-BFA001V2

**SW Component**
- DSH-PREDMNT
- X-LINUX-PREDMNT
- STSW-BFA001V2 / STSW-IPD4PREDMNT

**SL-PREDMNT-E2C**
A Condition monitoring sensor to cloud for vibration analysis with WiFi and Cellular Connection

**SOLUTIONS FOR ANOMALY DETECTION**

**Data Acquisition**

**Condition Monitoring**

**Anomaly detection @ the Edge**

**HW Component**
- STEVAL-STWINKT1B
- STM32L562E-DK

**SW Component**
- FP-AI-NANOEDG1
- FP-AI-PREDMNT2
- FP-AI-MONITOR1
- DSH-PREDMNT2
- NANOEDGE AI Studio

**Anomaly Detection with NanoEdge Studio**