

# tinyML<sup>®</sup> Talks

*Enabling Ultra-low Power Machine Learning at the Edge*

## “The Future of Personalized Connected Healthcare”

Andrew Baker - Maxim Integrated

January 5, 2021



[www.tinyML.org](http://www.tinyML.org)



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**EDGE IMPULSE**



maxim  
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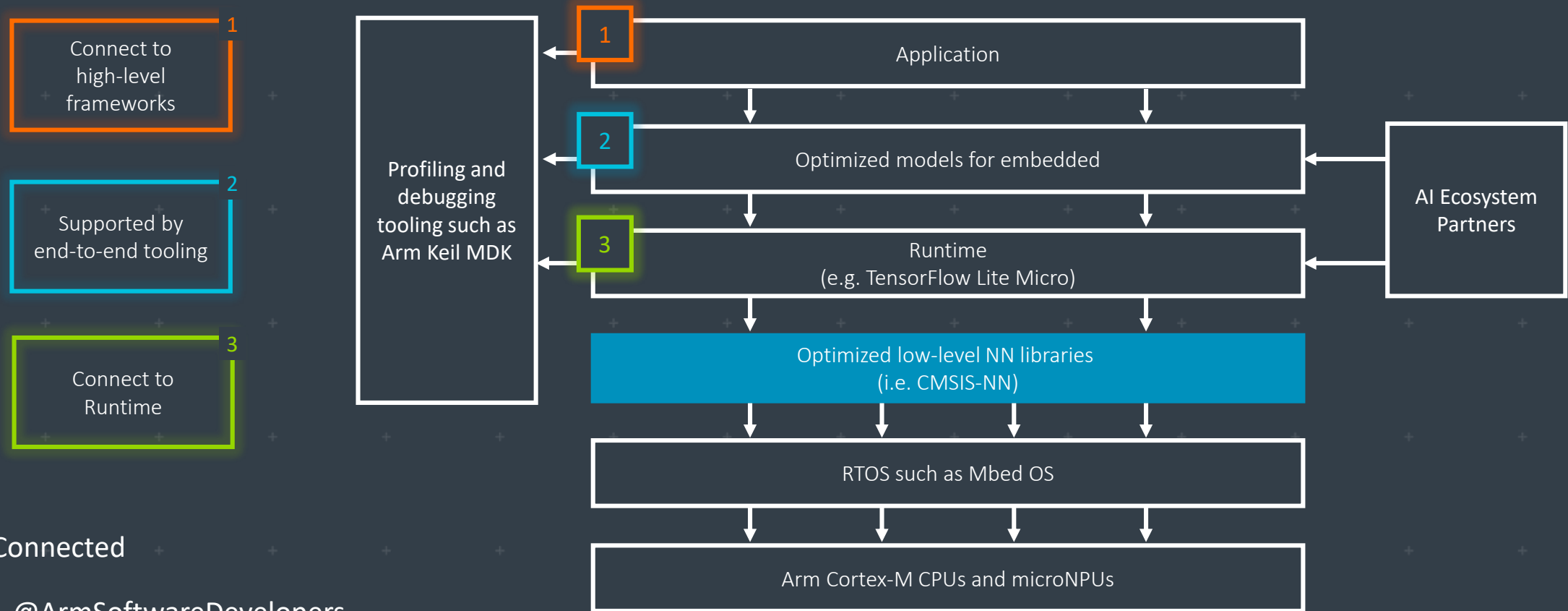
**RealityAI®**



**SynSense**

Additional Sponsorships available – contact [Bette@tinyML.org](mailto:Bette@tinyML.org) for info

# Arm: The Software and Hardware Foundation for tinyML



Stay Connected

 @ArmSoftwareDevelopers

 @ArmSoftwareDev

Resources: [developer.arm.com/solutions/machine-learning-on-arm](https://developer.arm.com/solutions/machine-learning-on-arm)



# WE USE AI TO MAKE OTHER AI FASTER, SMALLER AND MORE POWER EFFICIENT



**Automatically compress** SOTA models like MobileNet to <200KB with **little to no drop in accuracy** for inference on resource-limited MCUs



**Reduce** model optimization trial & error from weeks to days using Deeplite's **design space exploration**



**Deploy more** models to your device without sacrificing performance or battery life with our **easy-to-use software**

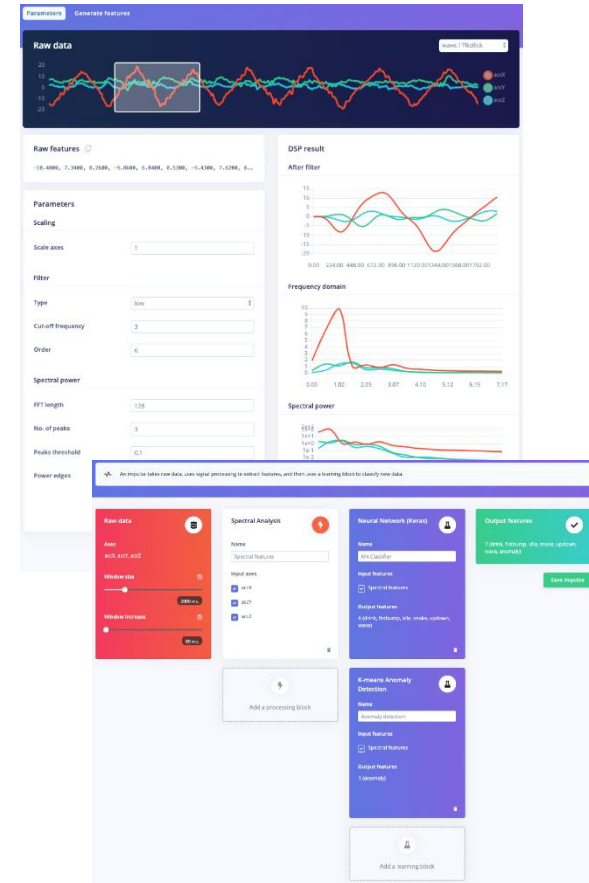
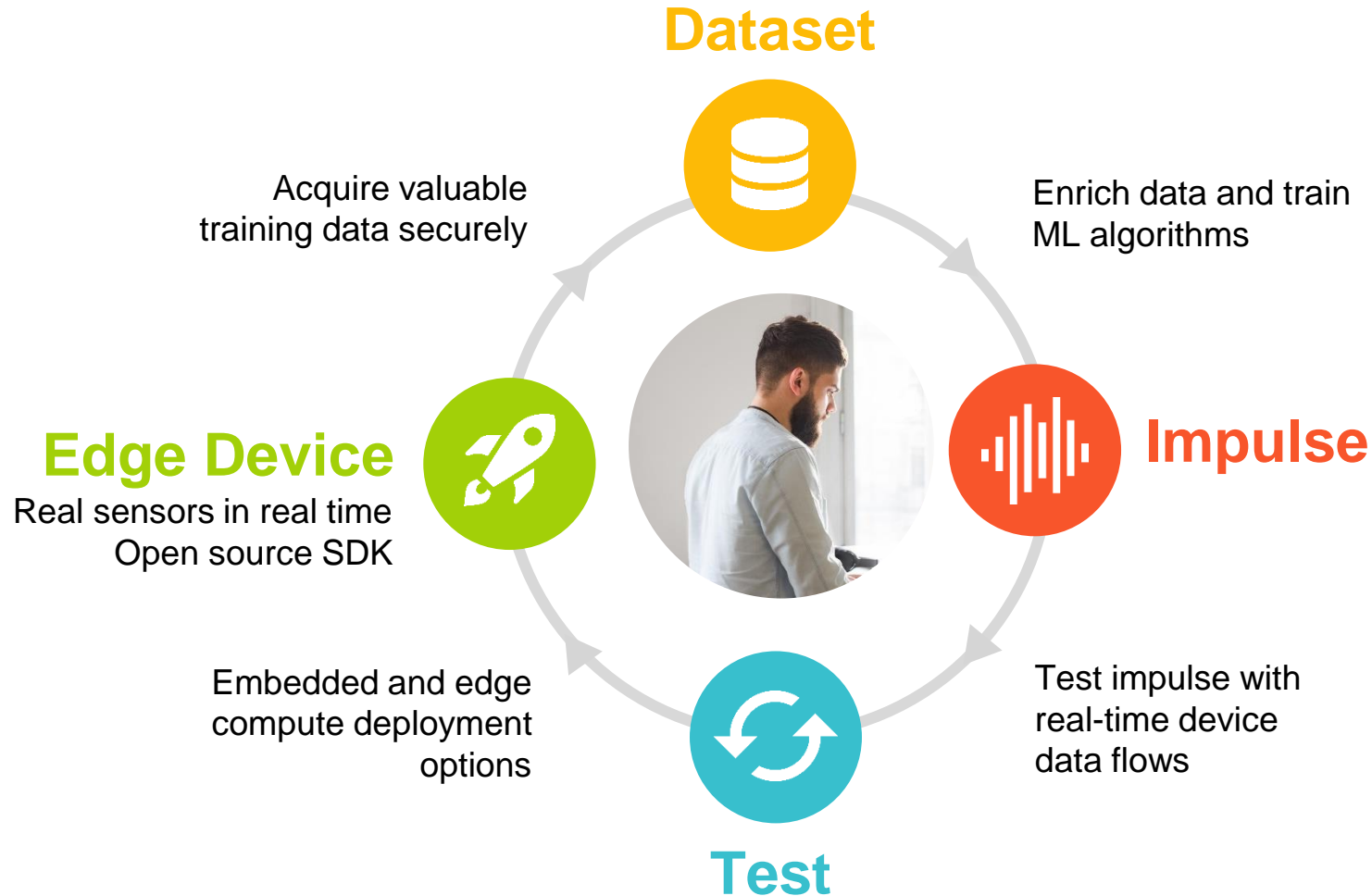
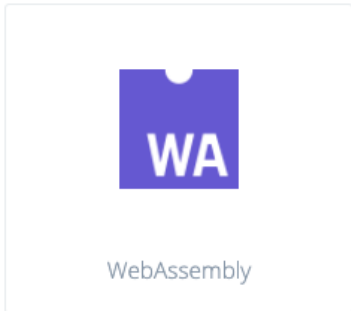
BECOME BETA USER [bit.ly/testdeeplite](https://bit.ly/testdeeplite)

mobilityXlab

arm



# TinyML for all developers





## Maxim Integrated: Enabling Edge Intelligence

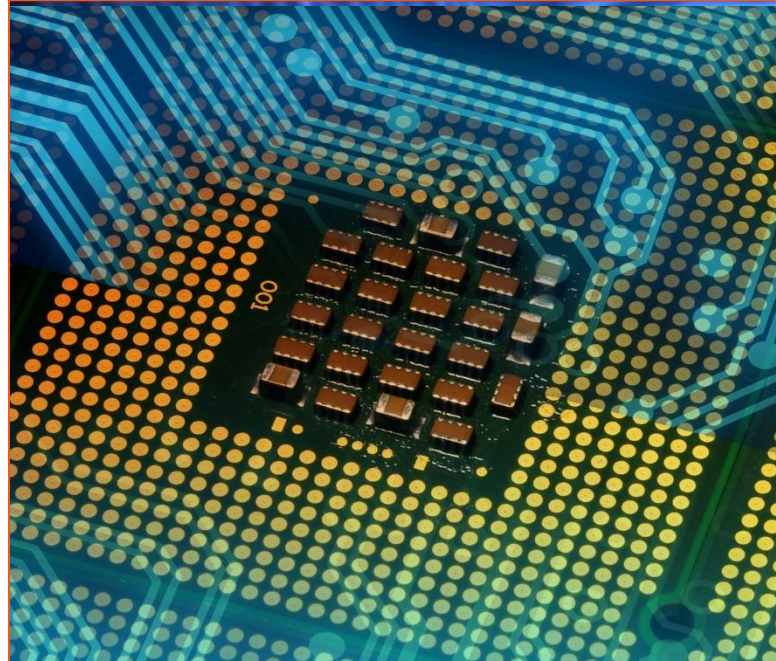
[www.maximintegrated.com/ai](http://www.maximintegrated.com/ai)

### Sensors and Signal Conditioning



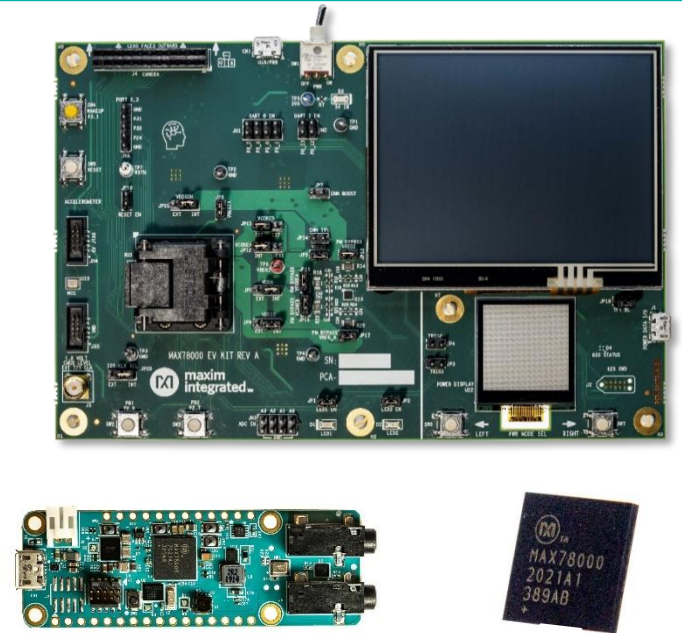
Health sensors measure PPG and ECG signals critical to understanding vital signs. Signal chain products enable measuring even the most sensitive signals.

### Low Power Cortex M4 Micros



The biggest (3MB flash and 1MB SRAM) and the smallest (256KB flash and 96KB SRAM) Cortex M4 microcontrollers enable algorithms and neural networks to run at wearable power levels

### Advanced AI Acceleration



The new MAX78000 implements AI inferences at over 100x lower energy than other embedded options. Now the edge can see and hear like never before.

# Qeexo AutoML for Embedded AI

Automated Machine Learning Platform that builds tinyML solutions for the Edge using sensor data



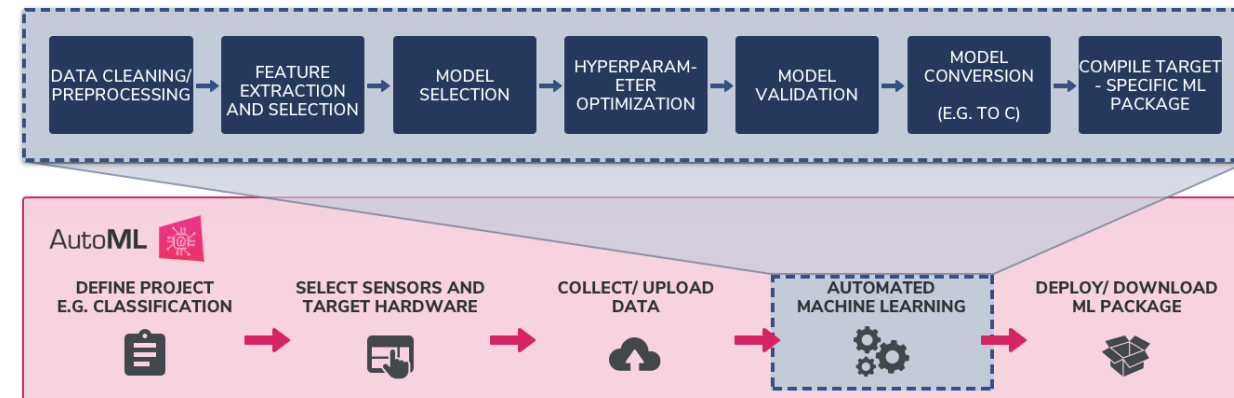
## Key Features

- Wide range of ML methods: GBM, XGBoost, Random Forest, Logistic Regression, Decision Tree, SVM, CNN, RNN, CRNN, ANN, Local Outlier Factor, and Isolation Forest
- Easy-to-use interface for labeling, recording, validating, and visualizing time-series sensor data
- On-device inference optimized for low latency, low power consumption, and a small memory footprint
- Supports Arm® Cortex™- M0 to M4 class MCUs
- Automates complex and labor-intensive processes of a typical ML workflow – no coding or ML expertise required!

## Target Markets/Applications

- Industrial Predictive Maintenance
- Smart Home
- Wearables
- Automotive
- Mobile
- IoT

## QEEEXO AUTOML: END-TO-END MACHINE LEARNING PLATFORM



For a limited time, sign up to use Qeexo AutoML at [automl.qeexo.com](https://automl.qeexo.com) for FREE to bring intelligence to your devices!



is for  
building products

<https://reality.ai>



[info@reality.ai](mailto:info@reality.ai)



@SensorAI



Reality AI

## Reality AI Tools<sup>®</sup> software

Automated Feature  
Exploration and Model  
Generation

Bill-of-Materials  
Optimization

Automated Data  
Assessment

Edge AI / TinyML  
code for the smallest  
MCUs

## Reality AI solutions

Automotive sound recognition & localization

Indoor/outdoor sound event recognition

RealityCheck<sup>™</sup> voice anti-spoofing

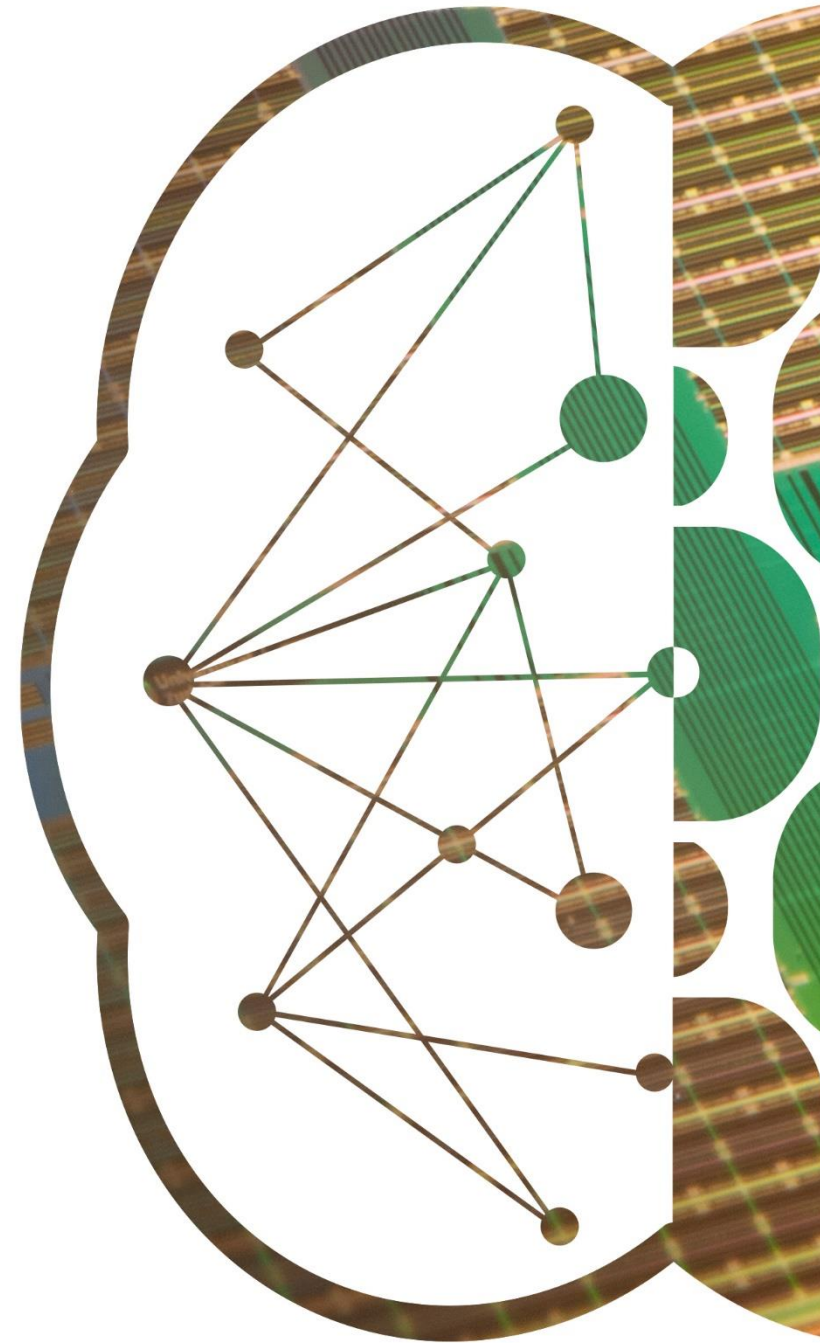




# SynSense

**SynSense** builds **ultra-low-power** (sub-mW) **sensing and inference** hardware for **embedded, mobile and edge** devices. We design systems for **real-time always-on smart sensing**, for audio, vision, IMUs, bio-signals and more.

<https://SynSense.ai>





# Next tinyML Talks

Date	Presenter	Topic / Title
Tuesday, January 19	<b>Lukas Geiger</b> Deep Learning Researcher, Plumerai	Running Binarized Neural Networks on Microcontrollers

Webcast start time is 8 am Pacific time

Please contact [talks@tinymml.org](mailto:talks@tinymml.org) if you are interested in presenting

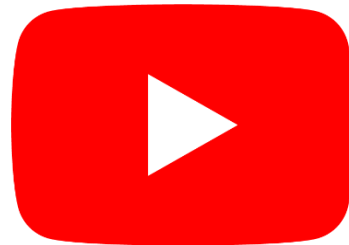


# Reminders

Slides & Videos will be posted tomorrow

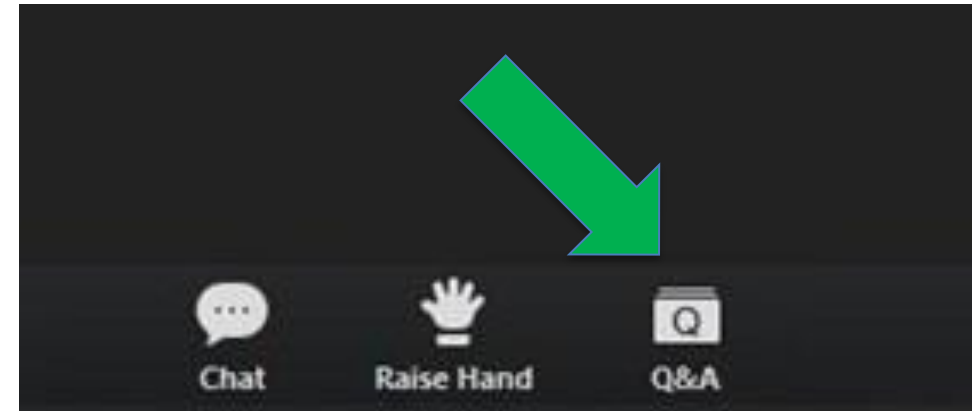


[tinyml.org/forums](https://tinyml.org/forums)



[youtube.com/tinyml](https://youtube.com/tinyml)

Please use the Q&A window for your questions





# Andrew Baker



Andrew Baker joined Maxim Integrated in 2009. He has 25 years of experience in the electronics industry in roles ranging from development engineering to sales as well as business/product management. In his current role, he is responsible for leading Maxim's wearable solutions initiatives for sensors and power management, as well as multiple other product lines. Andrew holds a Bachelor's degree with honors in electronic engineering from the University of Portsmouth, UK.



# The Future of Personalized Connected Healthcare

Andrew Baker, Managing Director of Industrial & Healthcare Business Unit



# Transitioning to a New Model for Healthcare Delivery

Global healthcare costs growing – Currently ~\$9T or 10% of global GDP

Remote monitoring  
with analytics



Preventive  
monitoring

Chronic  
disease management

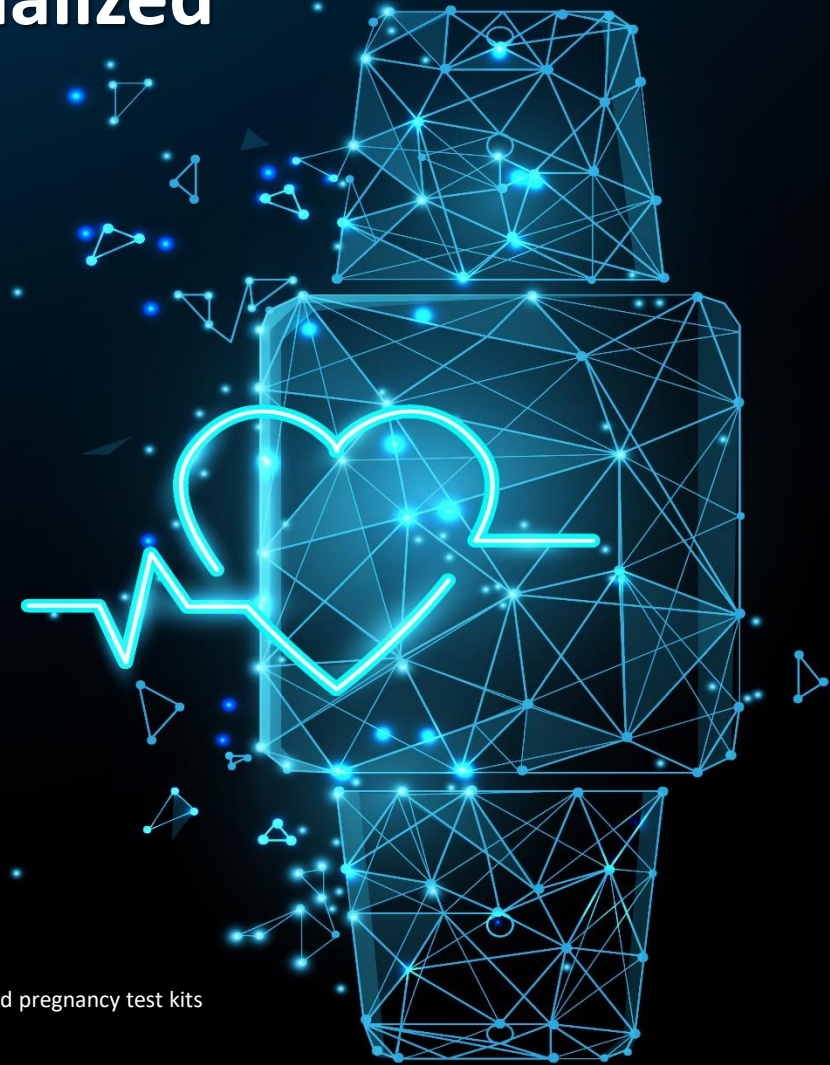


# Healthcare is Becoming More Personalized

- Medical/healthcare wearable devices totaled 640M in 2019
- Total device shipments forecasted to top 1B in 2023
- Target device types\* set to grow at 22% CAGR (2019 to 2023)

Source: Omdia Healthcare Equipment Database, December 2019

\*Select wearables include smartwatches, activity & fitness monitors, hearing aids, HRMs, disposable CGMs, infusion pumps and pregnancy test kits  
Results are not an endorsement of Maxim Integrated. Any reliance on these results is at the third-party's own risk.



# Remote Patient Monitoring Use Cases – Virus Pandemic Model



## Predictive Screening

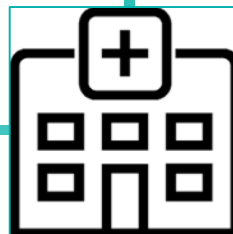
Temp & SpO<sub>2</sub>

## Onset Monitoring (Hi Risk)

Temp, SpO<sub>2</sub>, HR/ECG & Respiration

Periodic Telemetry

FDA



## Post Hospital Monitoring

Temp, SpO<sub>2</sub>, Heart Rate/ECG, Respiration

24/7 Telemetry

FDA

## Deteriorating Condition

Body Temperature, SpO<sub>2</sub>, Heart Rate/ECG, Respiration

24/7 Telemetry

FDA





# Preventive Monitoring - AFib Detection

Atrial fibrillation (AFib) increases risk of stroke by 5x

## Common symptoms of AFib

Source: American Heart Association



Racing heart, fluttering or palpitations  
Shortness of breath  
Lightheadedness

Or no noticeable symptoms at all



People with no symptoms may be diagnosed by an exam and an ECG

# Chronic Disease Management - Continuous SpO<sub>2</sub> Monitoring

Identify onset of critical conditions to mitigate risk of hospitalization

**251  
million**

COPD cases globally;  
5% of global deaths



Source: World Health Organization

**936  
million**

30-69yrs adults with  
Obstructive Sleep  
Apnea



Source: THE LANCET

**300  
million**

Affected by  
Asthma globally



Source: PubMed.gov



\$\$\$

**48  
million**

Infected with  
COVID-19 globally

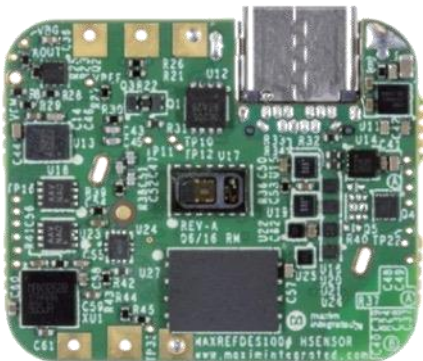


Source: BBC News



# Proven Track Record of Accelerating Time to Market for Customers

Integrating several sensors for new functionality



Health Sensor Platform 2.0 (HSP 2.0)  
MAXREFDES101#



2016

2018

2020

Health Sensor Platform  
MAXREFDES100#  
System Board



Health Sensor Platform 3.0 (HSP 3.0)  
MAXREFDES104#

# Health Sensor Platform 3.0 (HSP 3.0)

MAXREFDES104#: A wrist form-factor reference design

## Faster time to market

Saves at least six months in development time

## Clinical-grade

Accuracy meets regulatory requirements for SpO<sub>2</sub> & ambulatory ECG (IEC 60601-2-47)

## Complete reference design

Source code and design files to accelerate designs

## Covers key vital signs

Addresses needs of advanced health wearables with SpO<sub>2</sub>, ECG, HR, HRV, RR, body temp & motion

# Critical Vital-Sign Measurements

## Vital Sign

## Use Cases



Temperature Trends

Detect infectious diseases, fever monitoring



SpO<sub>2</sub>

SpO<sub>2</sub>

Monitor pulmonary function, sleep disorders



Respiration Rate

Monitor respiration trends



Heart Rate

Monitor heart rate trends



ECG

AFib detection, cardiac health



# HSP 3.0 Enables Clinical-Grade Use Cases

Heart  
rate

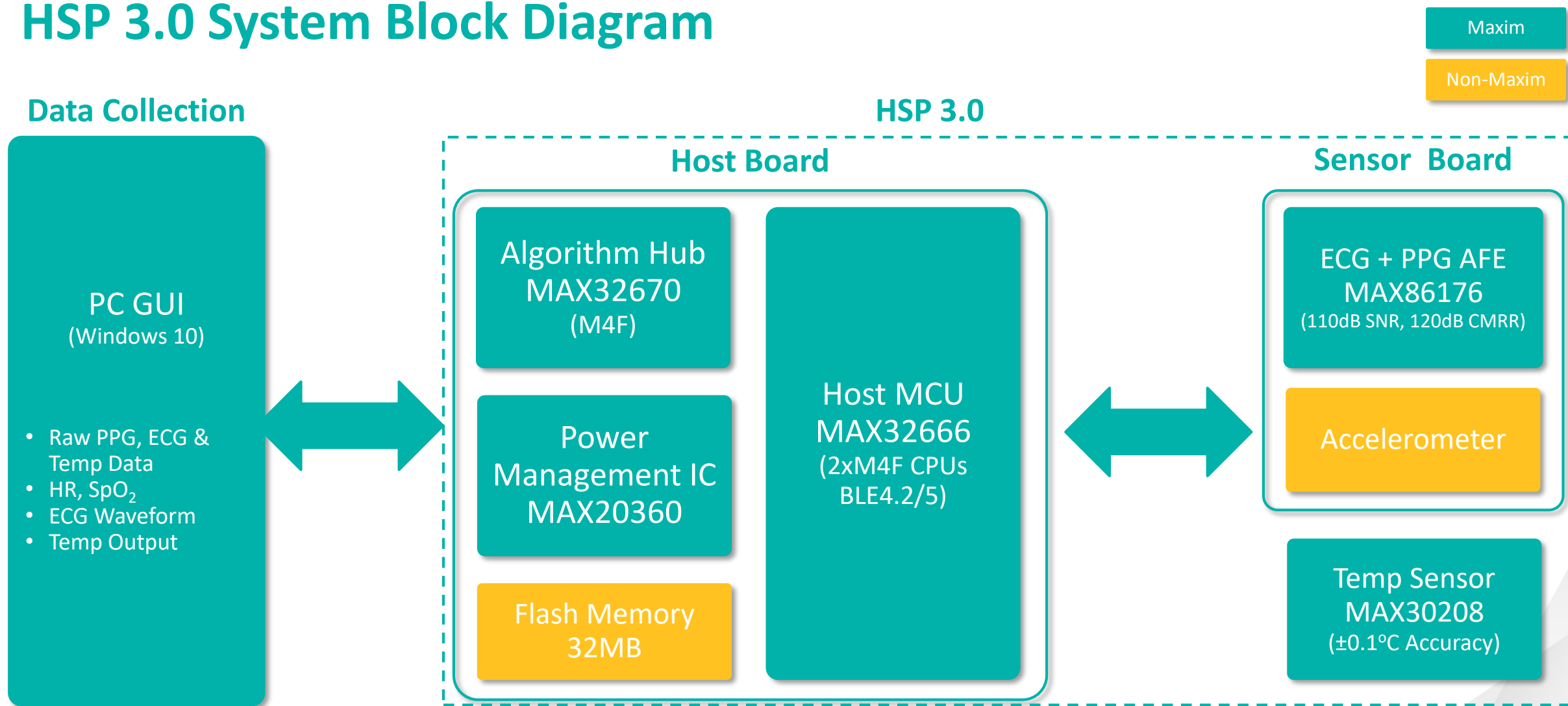
SpO<sub>2</sub> &  
respiration

Analytics  
(sleep,  
stress, etc.)

Body  
temperature  
prediction

AFib  
detection

# HSP 3.0 System Block Diagram

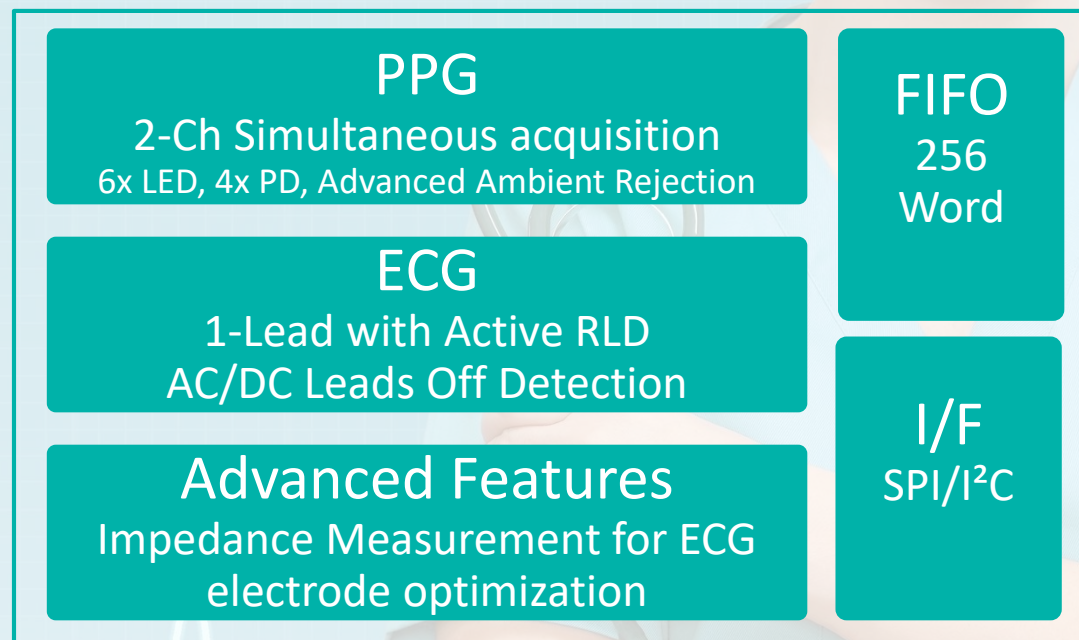




# Clinical-Grade Vital Sign Measurement Using PPG + ECG AFE

MAX86176 enables the next generation of wearable healthcare use cases

- Synchronous acquisition of PPG & ECG measurements with independent sample rates
- Active Right Leg Drive (RLD) offers >110dB CMRR\* for optimized ECG dry electrode performance
- Characterize ECG electrode material for system level optimization
- 110dB SNR\* for highest performance SpO<sub>2</sub> measurements



# The Wearable Healthcare Revolution: The Next Big Thing

Meeting Demands for Remote Patient Monitoring

Enabling Better Predictive/Preventive Healthcare & Chronic Disease Management

Maxim Enabling Personalized Healthcare





Thank You





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