

tinyML[®] Talks

Enabling Ultra-low Power Machine Learning at the Edge

“AI at the Edge: Enabling Vision for low-power devices”

Anna Petrovicheva - OpenCV.AI

November 25, 2021



www.tinyML.org



tinyML Talks Strategic Partners

AONdevices

arm DeepLite

EDGE IMPULSE

emza
visual sense

GREENWAVES
TECHNOLOGIES

Grovety Inc.

HOTC

imagimob

LatentAI
Adaptive AI for a Smarter Edge

maxim
integrated™

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DEVICES

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The IoT Hardware Enabler

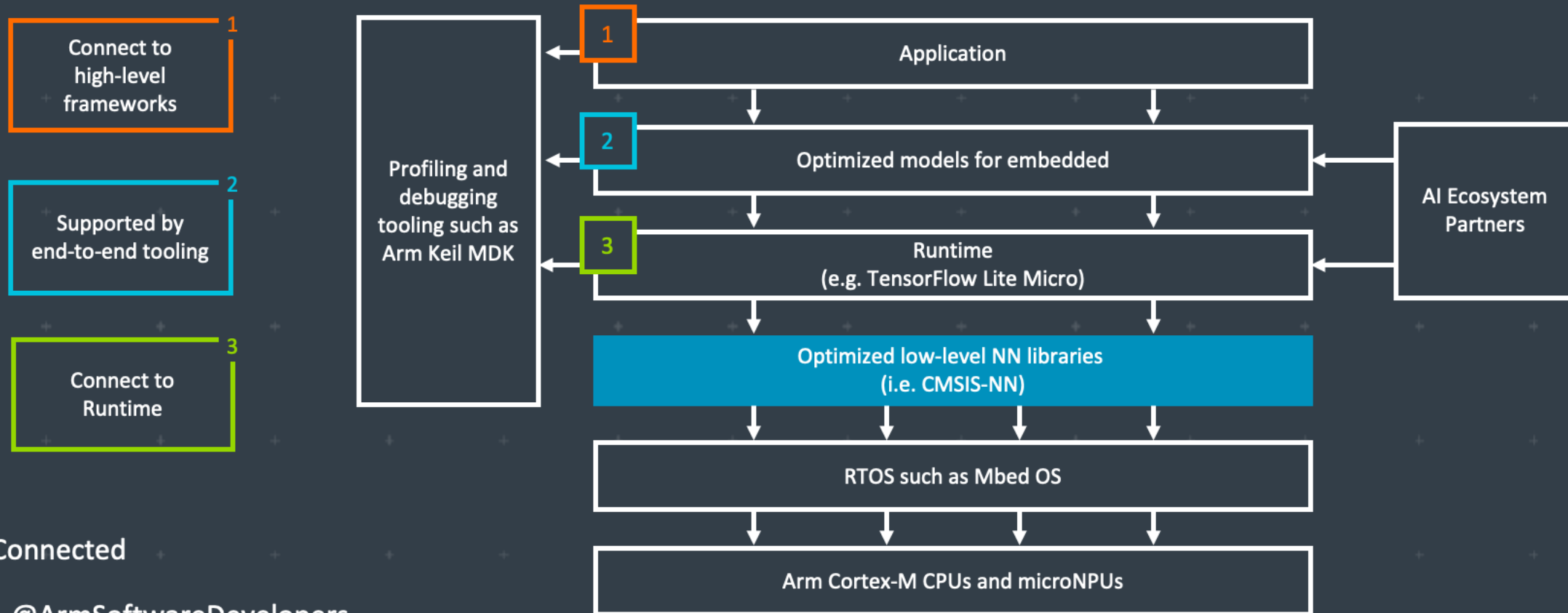
SensiML™

SynSense

SYNTIANT

Additional Sponsorships available – contact Olga@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



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

TinyML for all developers



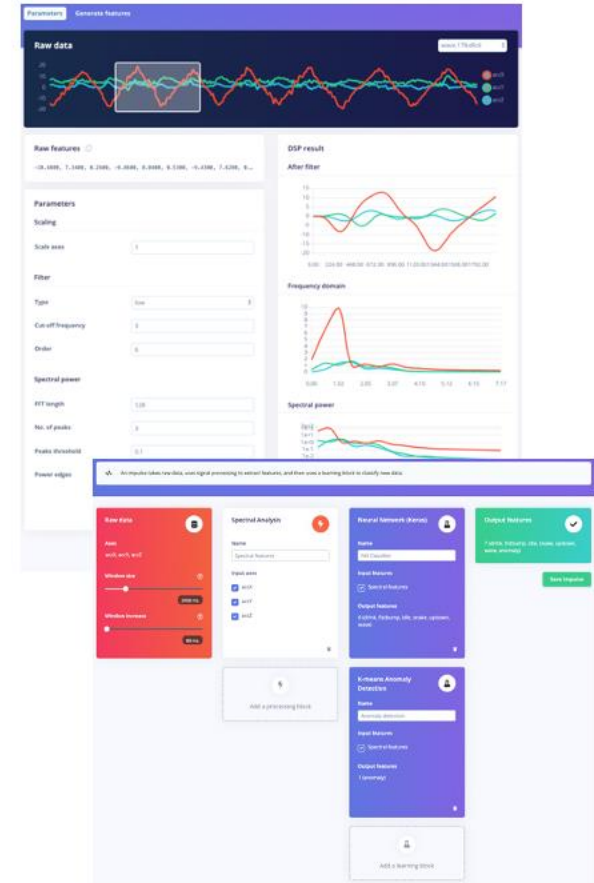
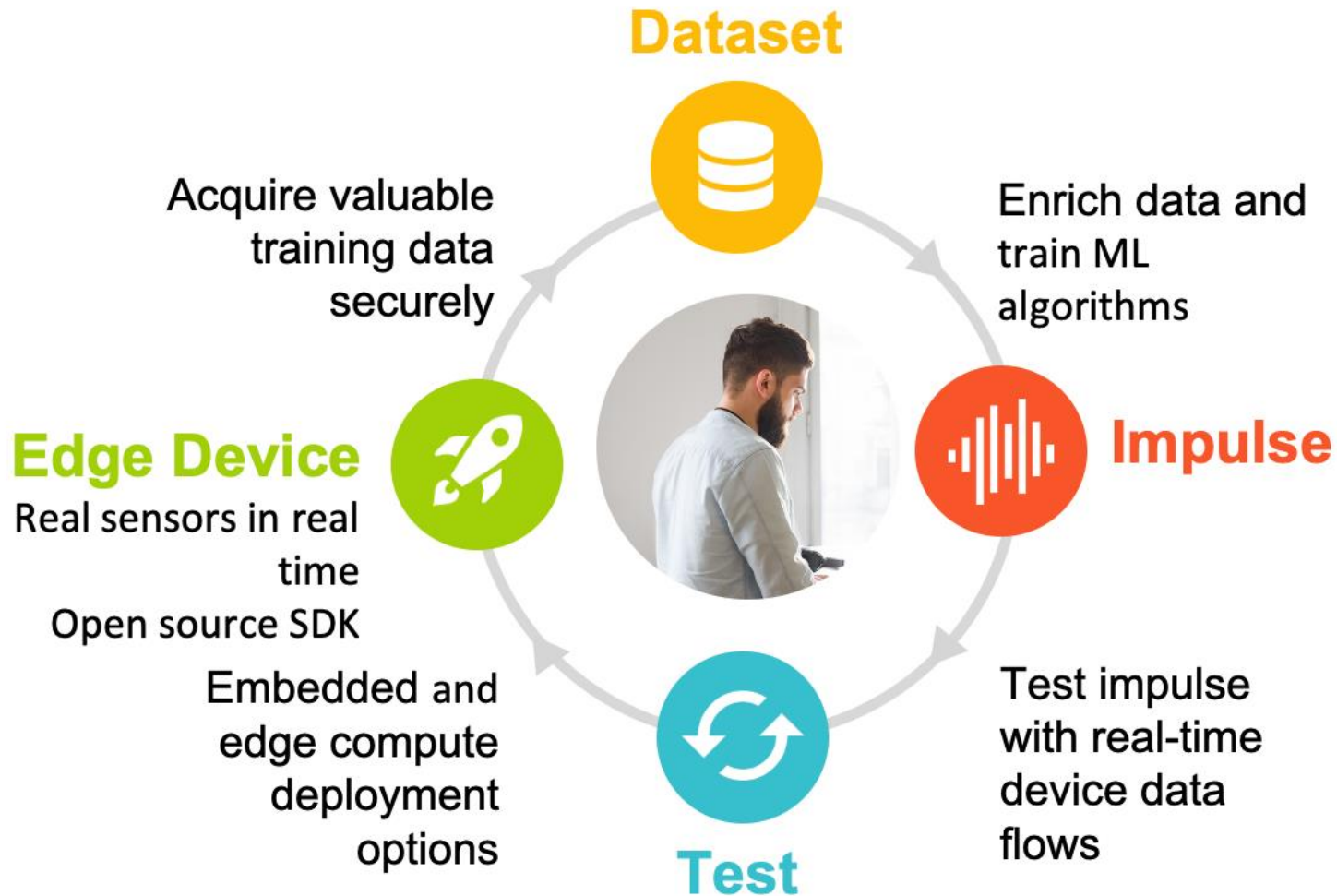
C++ library



Arduino library



WebAssembly

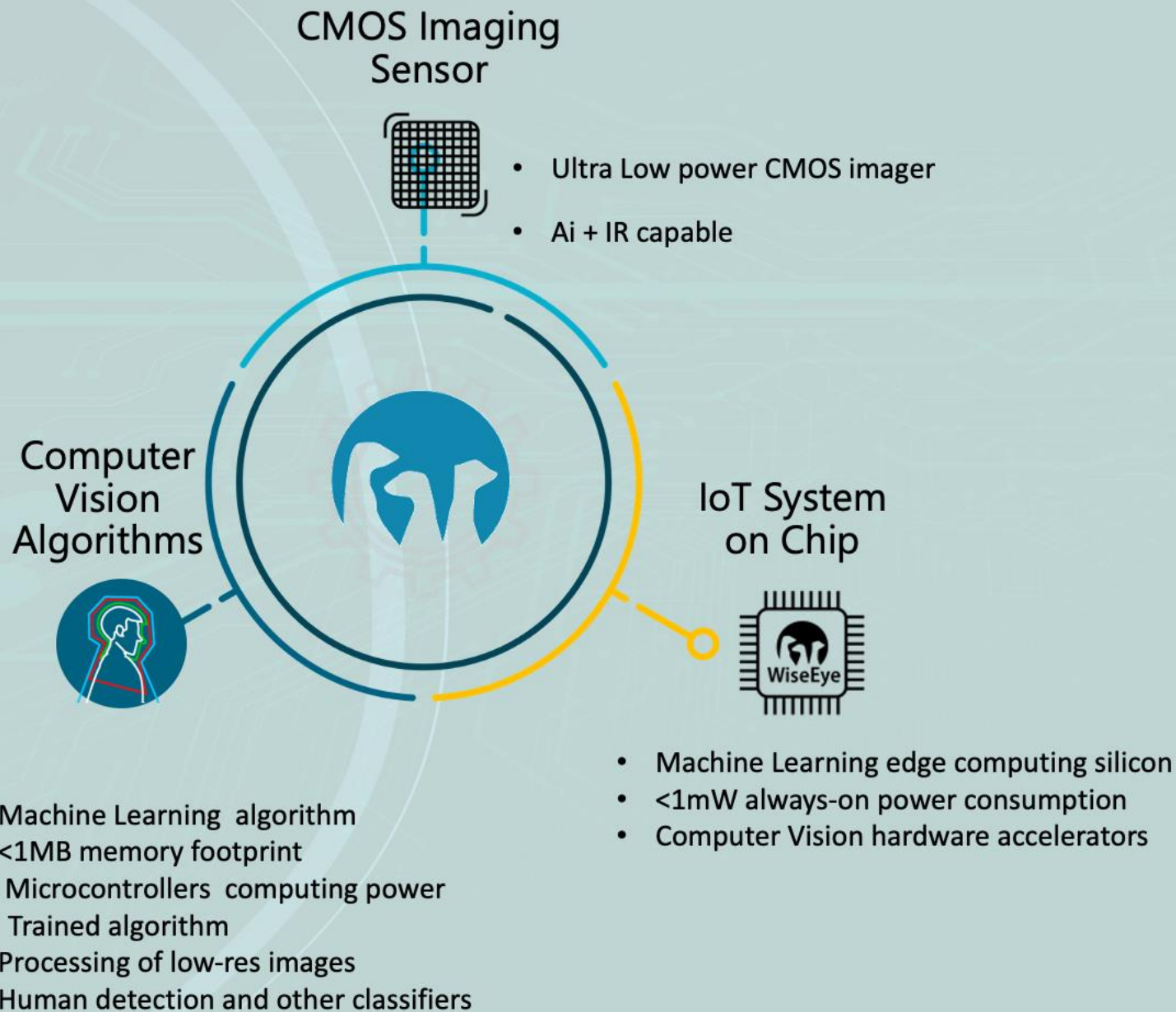


www.edgeimpulse.com



The Eye in IoT

Edge AI Visual Sensors



info@emza-vs.com



Enabling the next generation of **Sensor and Hearable products** to process rich data with energy efficiency

Visible Image



Sound



IR Image



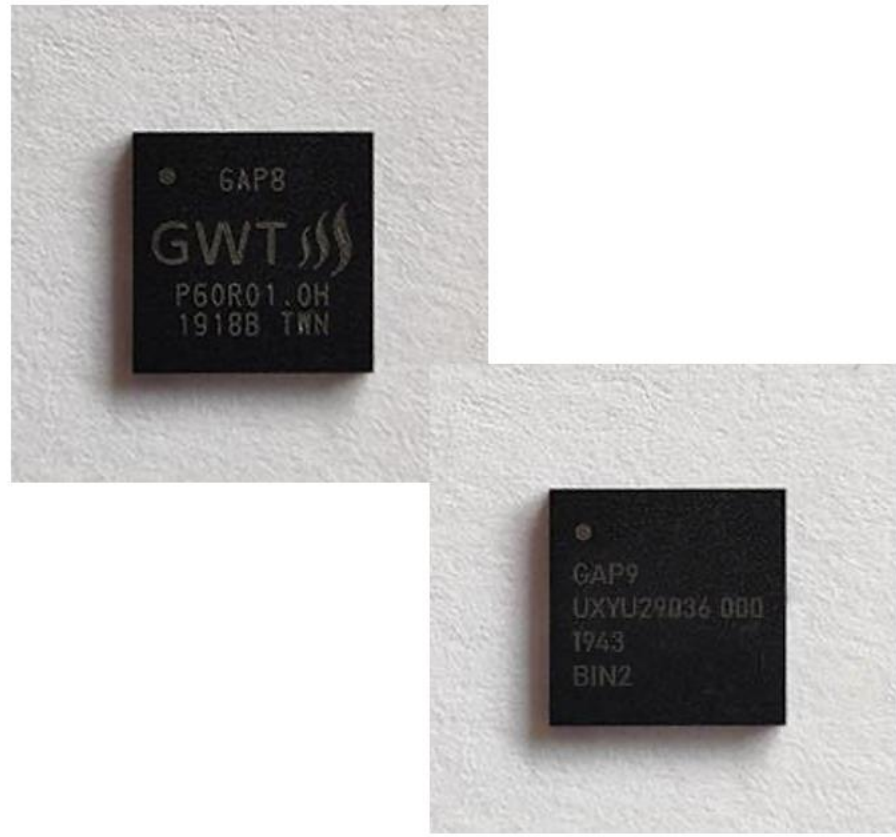
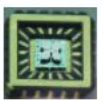
Radar



Bio-sensor



Gyro/Accel



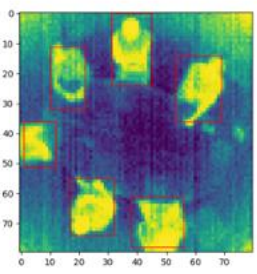
Wearables / Hearables



Battery-powered consumer electronics



IoT Sensors



⚡ Grovety Inc.

SOFTWARE DEVELOPMENT SERVICES FOR TINYML SOLUTIONS

1

Development tools

SDK, IDE, compilers, leveraging on TVM, uTVM & LLVM

2

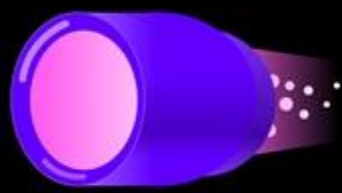
Firmware

Drivers, BSP, protocols, etc.

arm

AI PARTNER

Distributed infrastructure for TinyML apps



Develop at warp speed



Automate deployments



Device orchestration

HOTG is building the distributed infrastructure to pave the way for AI enabled edge applications



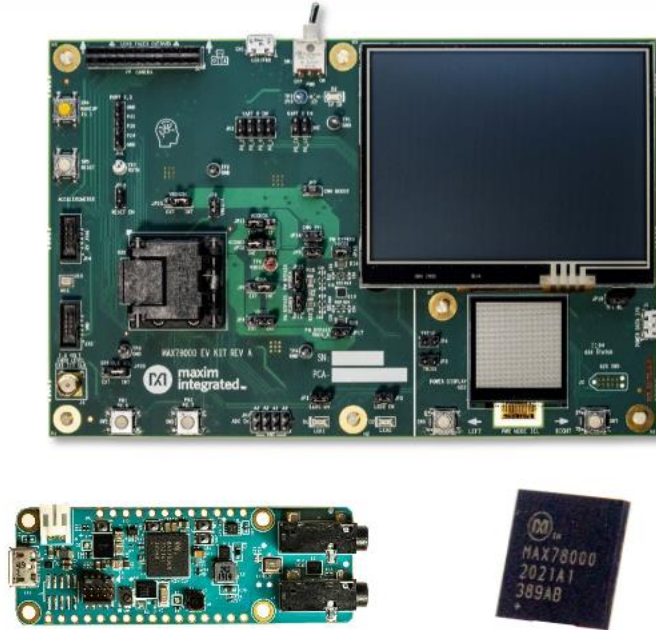
Latent AI

Adaptive AI for the Intelligent Edge

latent.ai

Maxim Integrated: Enabling Edge Intelligence

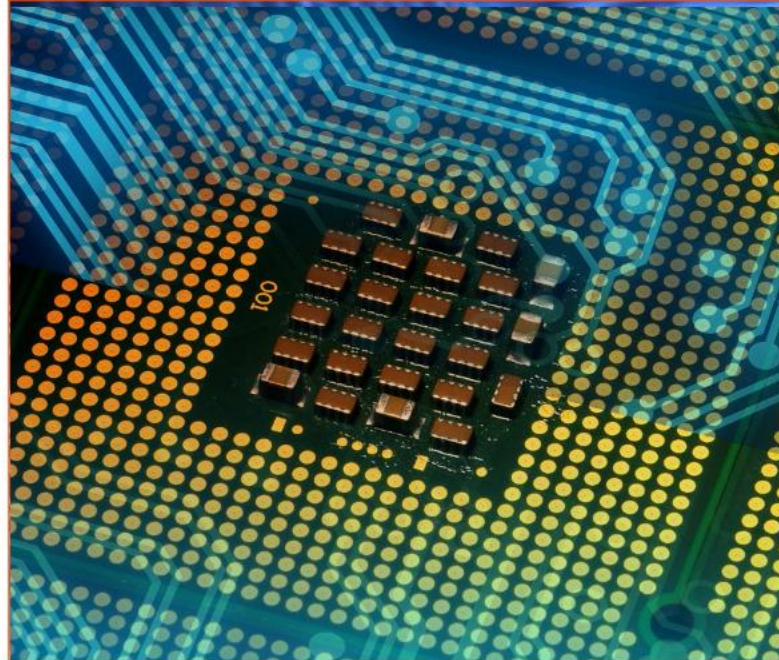
Advanced AI Acceleration IC



The new MAX78000 implements AI inferences at low energy levels, enabling complex audio and video inferencing to run on small batteries. Now the edge can see and hear like never before.

www.maximintegrated.com/MAX78000

Low Power Cortex M4 Micros



Large (3MB flash + 1MB SRAM) and small (256KB flash + 96KB SRAM, 1.6mm x 1.6mm) Cortex M4 microcontrollers enable algorithms and neural networks to run at wearable power levels.

www.maximintegrated.com/microcontrollers

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.

www.maximintegrated.com/sensors

Qeexo AutoML

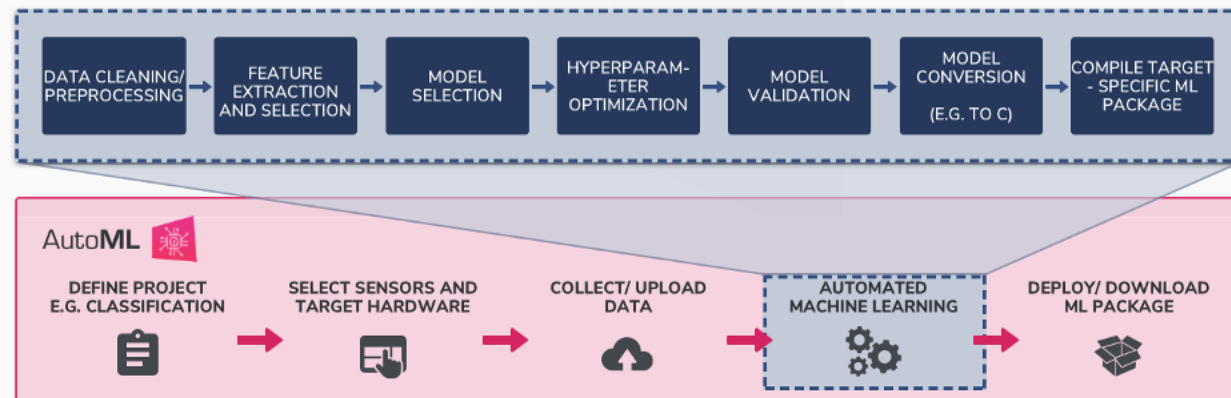


Automated Machine Learning Platform that builds tinyML solutions for the Edge using sensor data

Key Features

- Supports 17 ML methods:
 - Multi-class algorithms: GBM, XGBoost, Random Forest, Logistic Regression, Gaussian Naive Bayes, Decision Tree, Polynomial SVM, RBF SVM, SVM, CNN, RNN, CRNN, ANN
 - Single-class algorithms: Local Outlier Factor, One Class SVM, One Class Random Forest, Isolation Forest
- Labels, records, validates, and visualizes time-series sensor data
- On-device inference optimized for low latency, low power consumption, and small memory footprint applications
- Supports Arm® Cortex™ - M0 to M4 class MCUs

End-to-End Machine Learning Platform



For more information, visit: www.qeexo.com

Target Markets/Applications

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

Qualcomm
AI research

Advancing AI research to make efficient AI ubiquitous

Power efficiency

Model design, compression, quantization, algorithms, efficient hardware, software tool

Personalization

Continuous learning, contextual, always-on, privacy-preserved, distributed learning

Efficient learning

Robust learning through minimal data, unsupervised learning, on-device learning

A platform to scale AI across the industry



Perception

Object detection, speech recognition, contextual fusion



Reasoning

Scene understanding, language understanding, behavior prediction



Action

Reinforcement learning for decision making



Edge cloud



Cloud



IoT/IloT



Automotive



Mobile



Reality AI[®]

Add Advanced Sensing to your Product with Edge AI / TinyML

<https://reality.ai>



info@reality.ai



[@SensorAI](https://twitter.com/SensorAI)



[Reality AI](https://www.linkedin.com/company/reality-ai)

Pre-built Edge AI sensing modules, plus tools to build your own

Reality AI solutions

Prebuilt sound recognition models for
indoor and outdoor use cases

Solution for industrial anomaly detection

Pre-built automotive solution that lets cars
“see with sound”

Reality AI Tools[®] software

Build prototypes, then turn them into
real products

Explain ML models and relate the function
to the physics

Optimize the hardware, including
sensor selection and placement



Build Smart IoT Sensor Devices From Data

SensiML pioneered TinyML software tools that auto generate AI code for the intelligent edge.

- End-to-end AI workflow
- Multi-user auto-labeling of time-series data
- Code transparency and customization at each step in the pipeline

We enable the creation of production-grade smart sensor devices.



sensiml.com



SynSense

SynSense builds **sensing and inference** hardware for **ultra-low-power** (sub-mW) **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>



SYNTIANT

End-to-End
Deep Learning
Solutions
for
TinyML & Edge AI



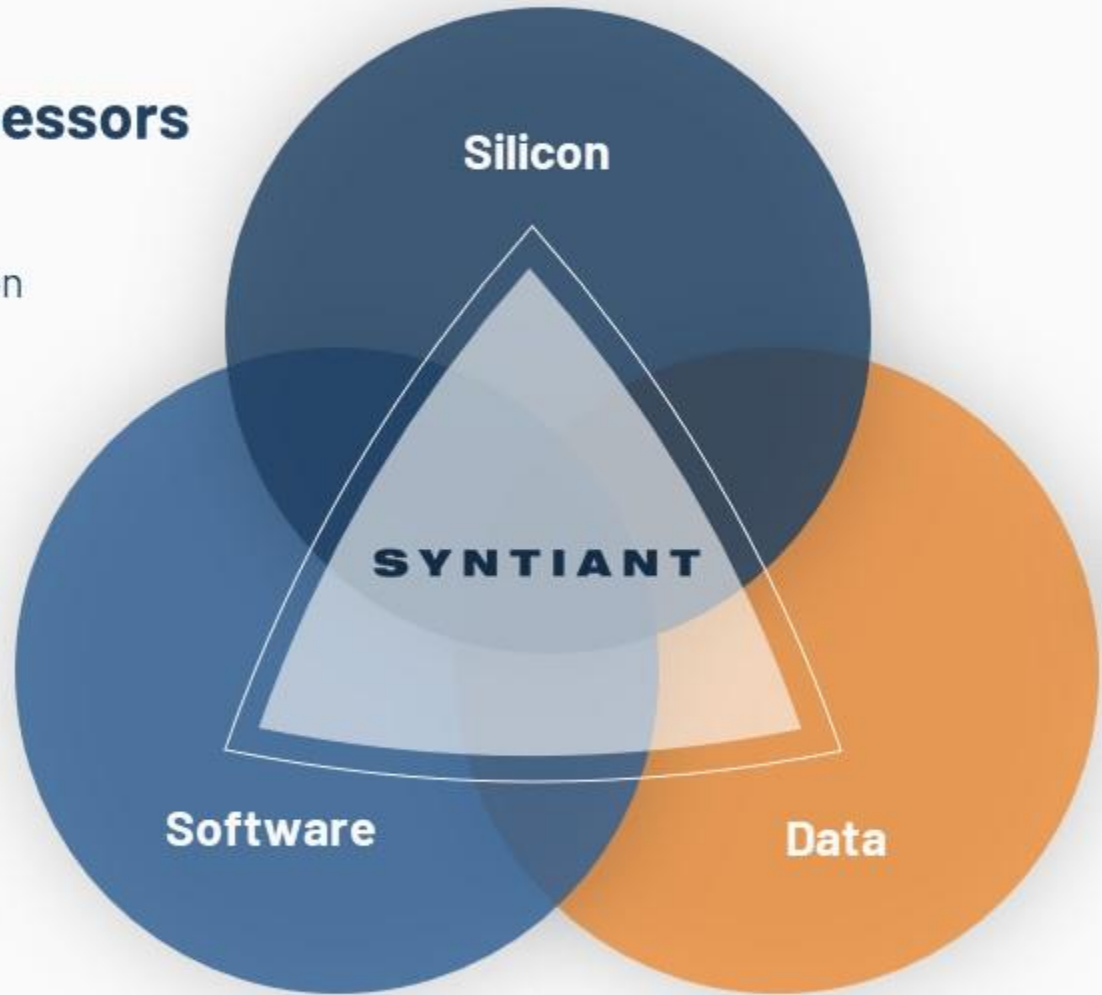
Neural Decision Processors

- At-Memory Compute
- Sustained High MAC Utilization
- Native Neural Network Processing



ML Training Pipeline

- Enables Production Quality Deep Learning Deployments



Data Platform

- Reduces Data Collection Time and Cost
- Increases Model Performance

tinyML for Good – Workshop, November 17th (7 am PDT)

STEM



Healthcare

T I N Y



For
Good



Earth
Climate
Conservation

Contact: 4good@tinyML.org



LIVE ONLINE November 2-5, 2021

(9-11:30 am China Standard time)

<https://www.tinyml.org/event/asia-2021/>

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Eric PAN
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makerspace



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Shouyi YIN 尹首



Yu WANG

Register today!



Free event courtesy of our sponsors and strategic partners



More sponsorships are available: sponsorships@tinyML.org

THE 2021 WINNERS ARE



Team Sol



RANKED WINNERS: 1ST PLACE

TinyML Aerial Forest Fire Detection



TheBlue Phoenix

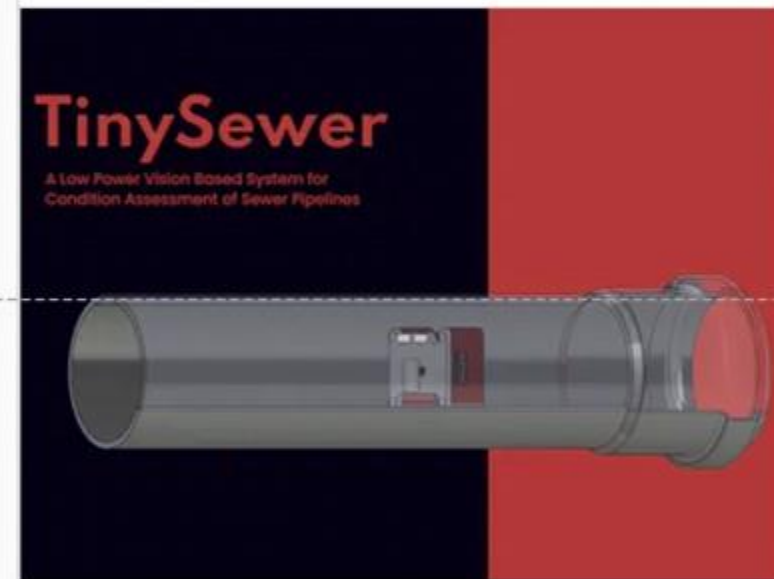


RANKED WINNERS: 2ND PLACE

WorkSafe: Computer Vision based multiparameter monitor with



Huy Mai



RANKED WINNERS: 3RD PLACE

TinySewer - Low Power Sewer Faults Detection System

Honorable mention prize winners:

[Flat Tire Detection Using Machine Vision](#) by [Bob Hammell](#)

[Smart Bird Feeder](#) by Ariela, Anna, Audrey, Nathan, Tianlang, Haoming, Eric, Edward and Tera Guided by: [Chen Feng](#)

More details: tinymml.org/news/tinymml-vision-challenge-winners



Next tinyML Talks

Date	Presenter	Topic / Title
Wednesday, December 1	Pierre Gembaczka, Program manager, Fraunhofer IMS	AlfES - an open-source standalone AI framework for almost any hardware

Webcast start time is 9:30 am Pacific time

Please contact talks@tinymml.org if you are interested in presenting



Reminders

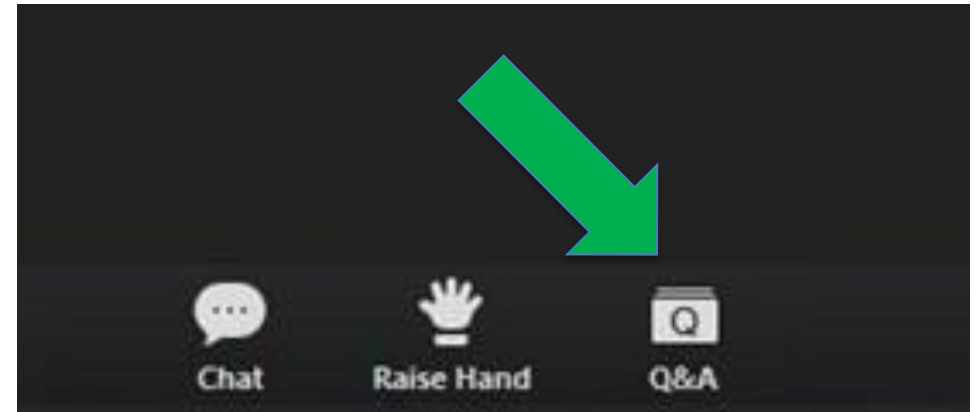
Slides & Videos will be posted tomorrow

Please use the Q&A window for your questions



tinyml.org/forums

youtube.com/tinyml





Anna Petrovicheva



Anna has been in the Computer Vision industry for 11 years now: first as an engineer, then as a technical lead. Her team works on solutions for a wide range of applications: from medicine and diagnostics to sports and education. The projects she lead were highlighted at Apple Event, in CNBC, and Wall Street Journal. Anna is a member of the OpenCV Foundation.



AI ON EDGE DEVICES

Anna Petrovicheva
CEO, Xperience.AI
Board Member, OpenCV.org



ANNA PETROVICHEVA

intel

itseez 
— Vision that works!

xperience/ai





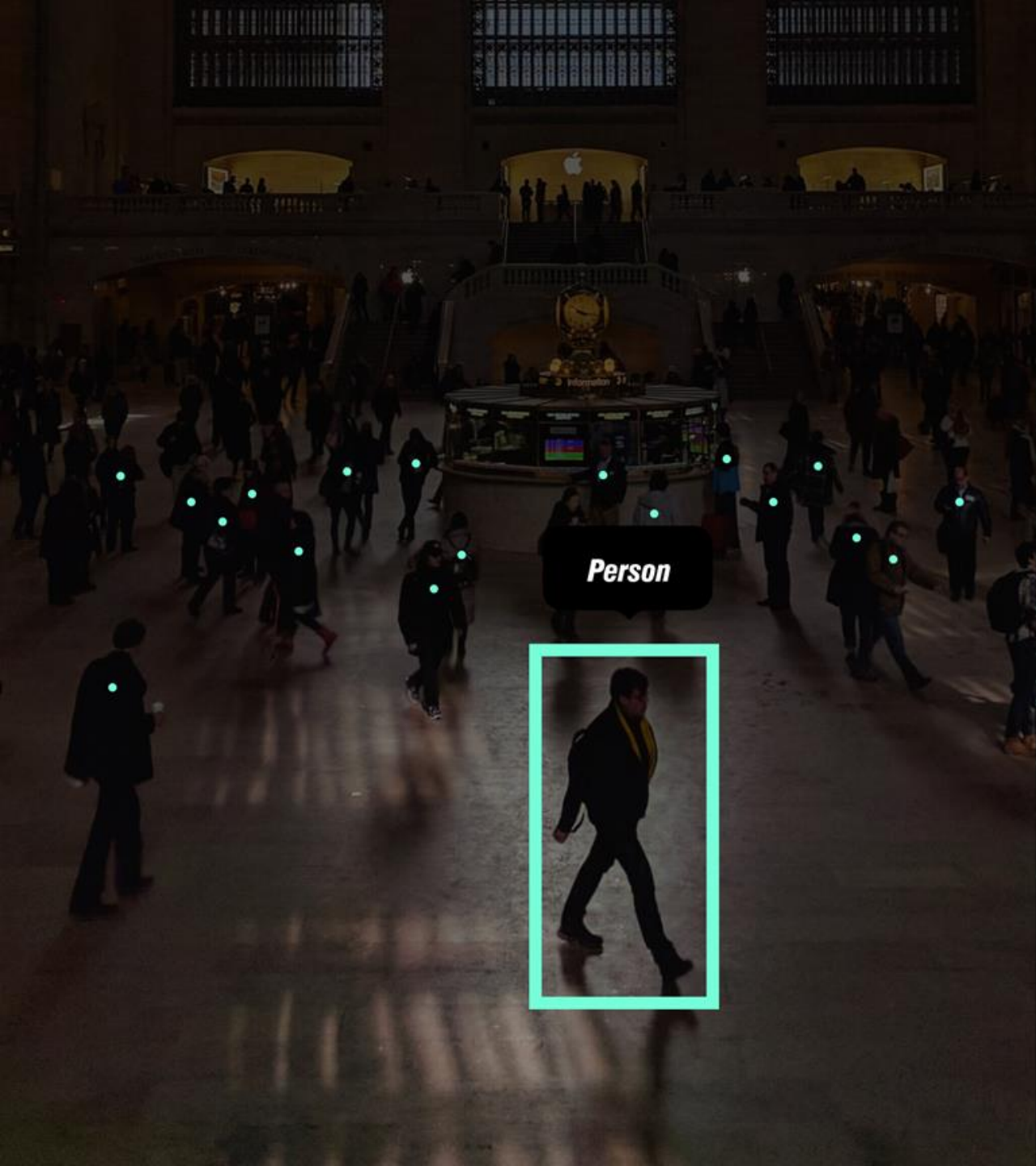
AI IS MOVING TO THE EDGE



INTERNET TRAFFIC



SERVER COSTS



Person



SECURITY & PRIVACY



THE LOOP OF THE INDUSTRY

2010 - 2014: Classic CV on the edge

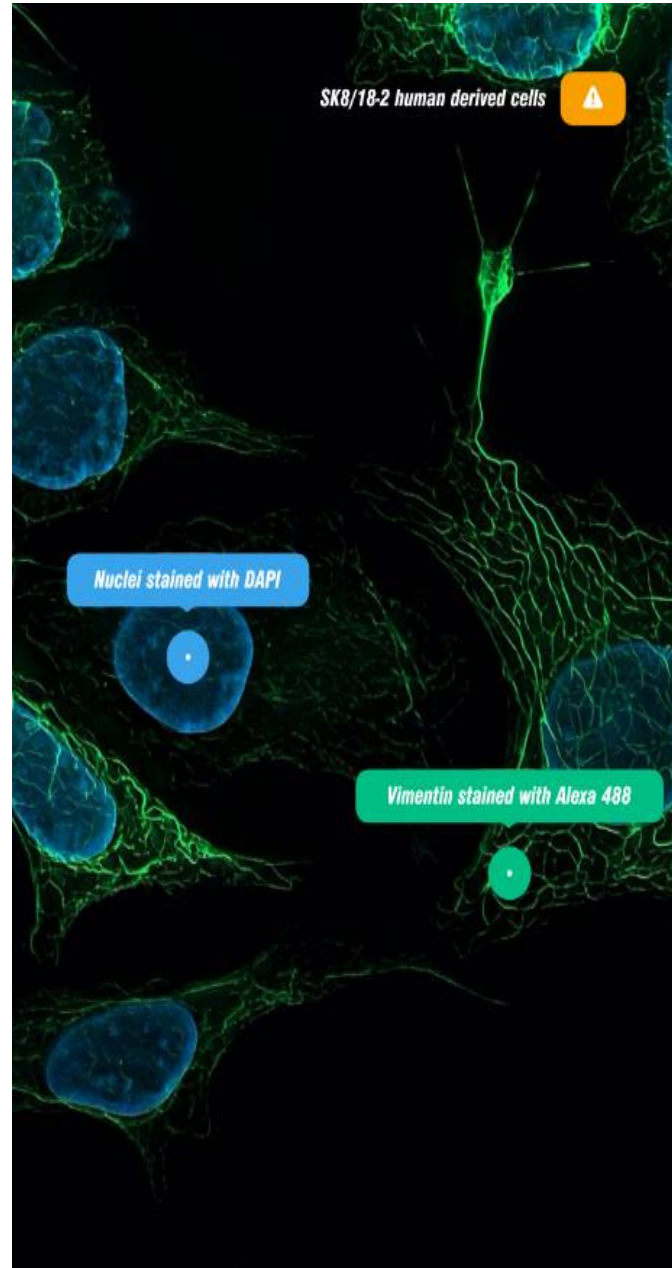
2014 - 2016: DL on the servers

2017 - now: back to the edge devices

Future: robotics, AR/VR; transformers



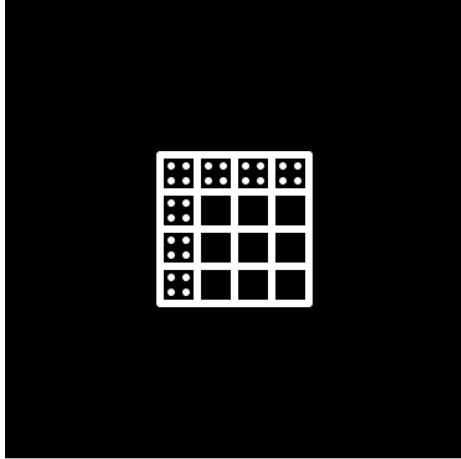
HOW TO SOLVE A PROBLEM



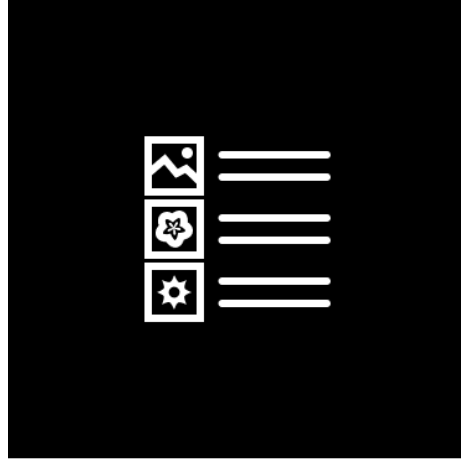


A DATA-BOUND PROBLEM

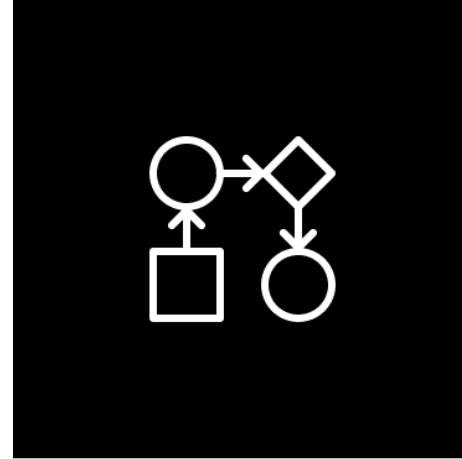




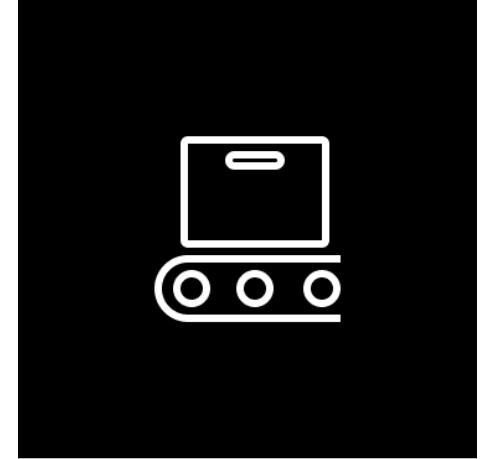
**COLLECT
THE DATA**



**ANNOTATE
THE DATA**



**TRAIN
A MODEL**



**DEPLOY
TO TARGET ENV**



SOFTWARE + HARDWARE



HARDWARE

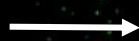


SOFTWARE: TOOLS and ALGORITHMS



TOOLS

PyTorch
TensorFlow



ONNX



TFLite
CoreML
OpenVINO
TensorRT
PyTorch Mobile

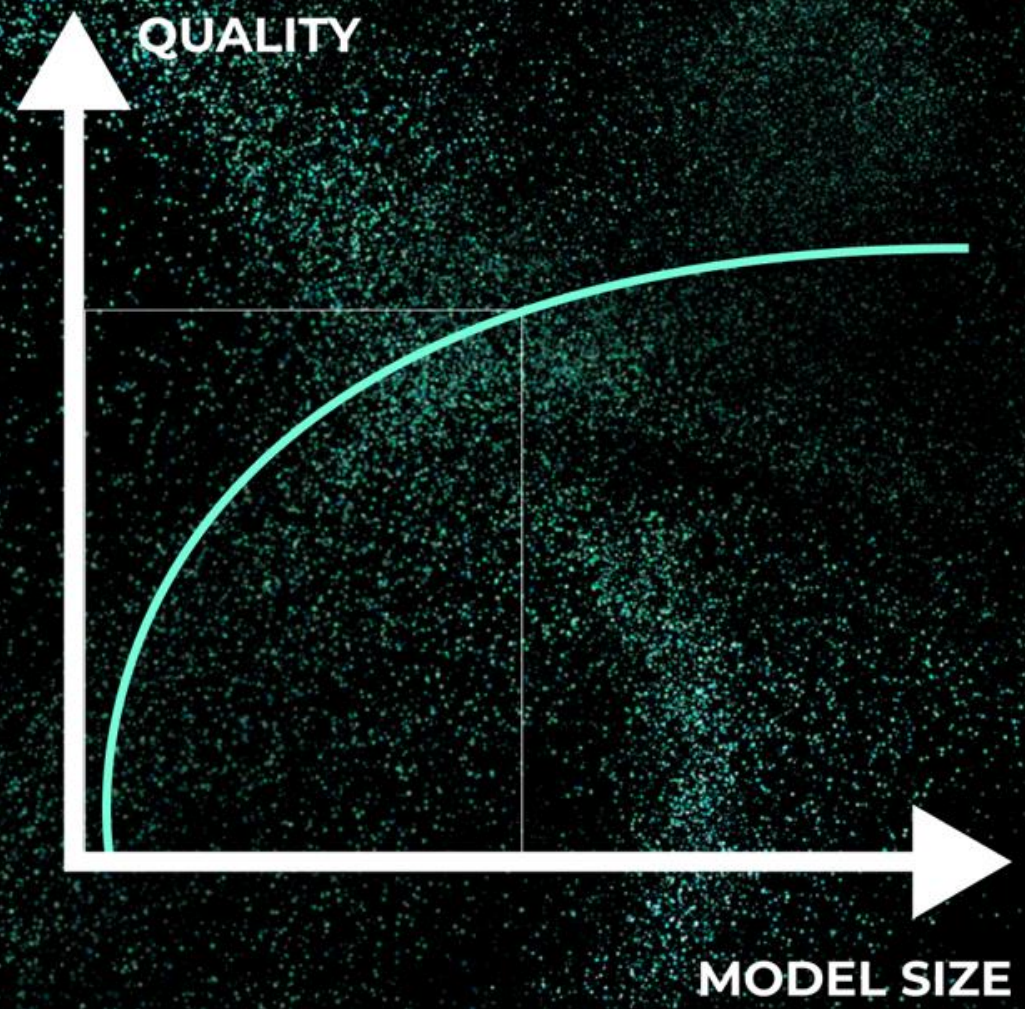


ALGORITHMS



AI MODELS ARE HEAVY

- Size: up to 1 Gb
- RAM needed: up to 4 Gb
- Computations: hundreds of TFLOPs



AI MODELS ARE HIGHLY REDUNDANT

- Smaller models as baselines
- Quantization
- Pruning

50Mb -> 600Kb

PEOPLE DETECTION MODEL FOR FPGA



SUMMARY

anna@xperience.ai



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