# tinyML. EMEA

Enabling Ultra-low Power Machine Learning at the Edge

tinyML EMEA Technical Forum 2021 Proceedings

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## TOD: Transprecise Object Detection to Maximise Real-Time Accuracy on the Edge

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**DiPET Website**: <a href="https://dipet.eeecs.qub.ac.uk">https://dipet.eeecs.qub.ac.uk</a>

June 10, 2021







Edge for Real-Time Video Analytics (RTVA)

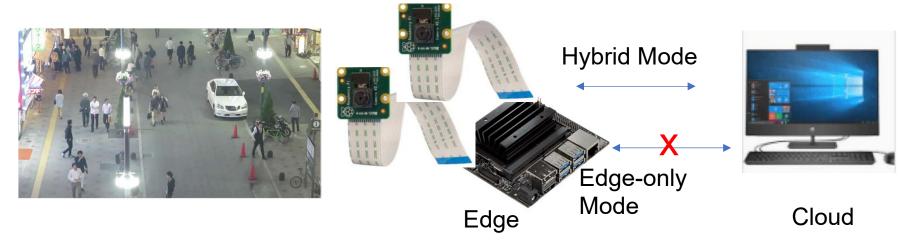


Figure Source: Multi Object Tracking 17 Dataset ( <a href="https://motchallenge.net">https://motchallenge.net</a> )

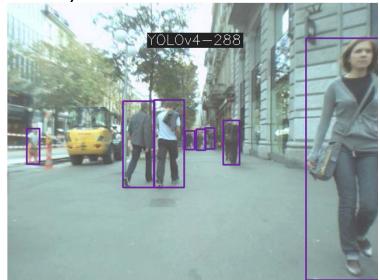
Challenges in RTVA on the Edge: Limited Computational Power → Longer Inference
 Latency from Deep Neural Network (DNN) → More Dropped Frames → Limited Object
 Detection Accuracy



#### **TOD: Transprecise Object Detection (to maximise RTVA accuracy on the Edge)**

- Initialization: Preloading 4 different YOLOv4 detectors into GPU RAM
- Runtime Scheduler (RS) Selects a DNN on the Fly according to Dynamic Object Sizes
  Detected.

 TOD Demonstration when objects are fading away from camera (i.e., objects are getting smaller.)



A DNN is switched to a heavier DNN

YOLOv4-288 → YOLOv4-416

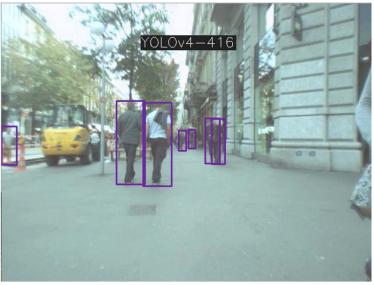
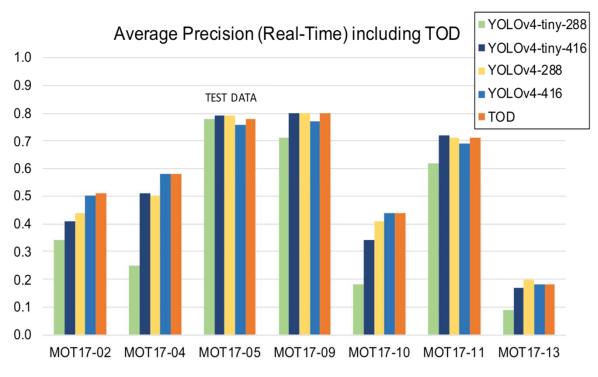
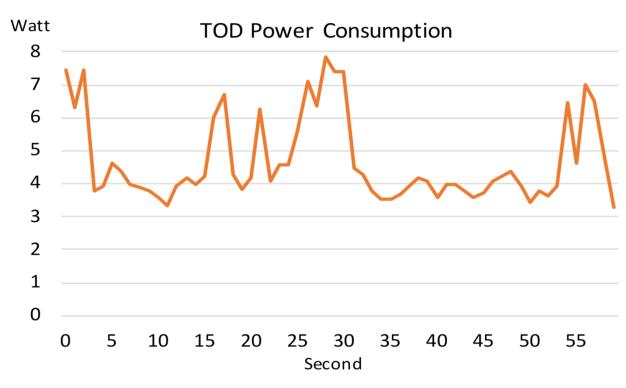


Figure Source: Multi Object Tracking 17 Dataset ( <a href="https://motchallenge.net">https://motchallenge.net</a> )



#### **Experimental Evaluation with a NVidia Jetson Nano Board with MAX power mode**





#### Best (or equivalently good) accuracy for all cases

- 35% gain over YOLOv4-tiny-288.

With MOT17-05 data, TOD requires 63% of the power without losing accuracy compared to YOLOv4-416. (TOD: 5.7W, YOLOv4-416: 7.5W)



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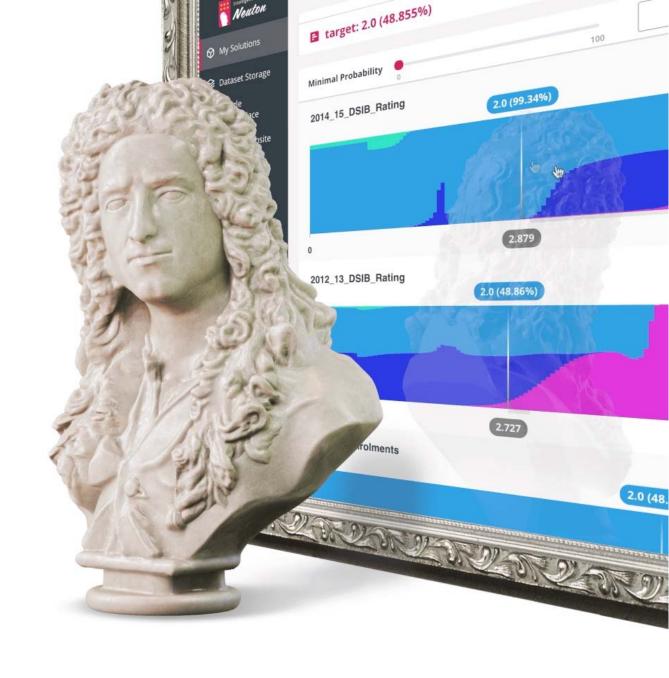
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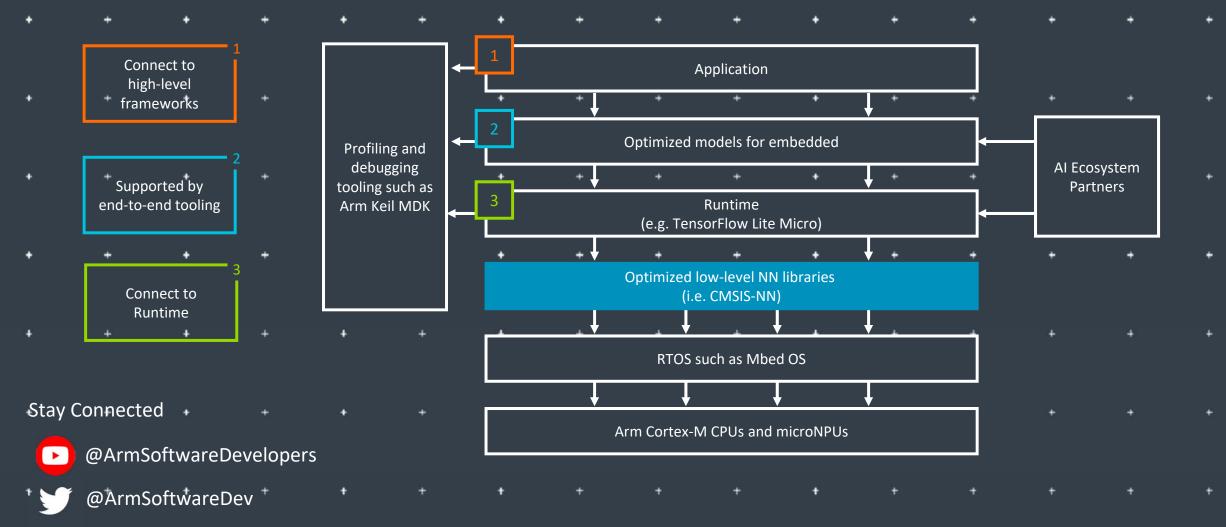
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## Arm: The Software and Hardware Foundation for tinyML



Resources: developer.arm.com/solutions/machine-learning-on-arm

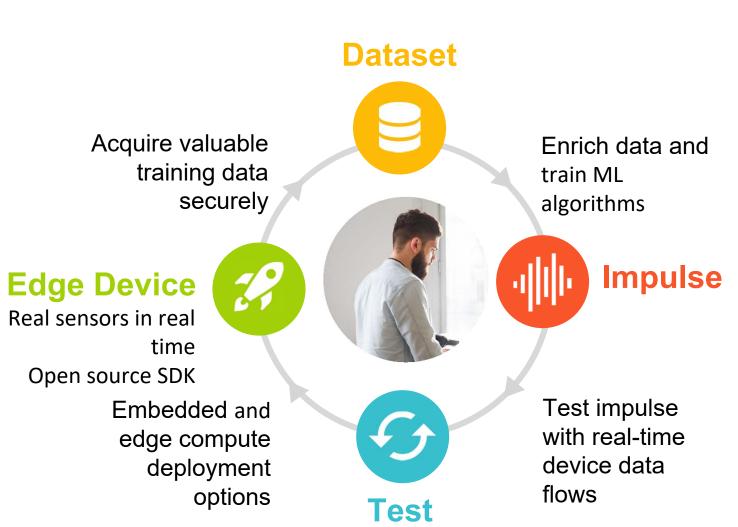


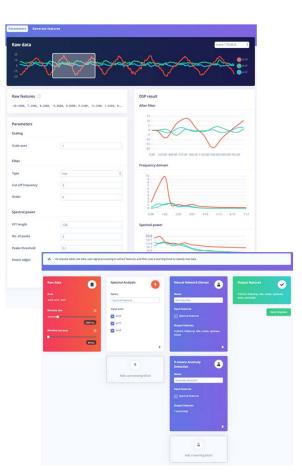
## TinyML for all developers











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### Advancing Al 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

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A platform to scale Al across the industry



#### Perception

Object detection, speech recognition, contextual fusion

Reasoning

**Action** 

Reinforcement learning for decision making



Edge cloud







Mobile

IoT/IIoT







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Founded in 2017 and headquartered in Irvine, California, the company is backed by Amazon, Applied Materials, Atlantic Bridge Capital, Bosch, Intel Capital, Microsoft, Motorola, and others. Syntiant was recently named a <a href="Maintenance-ES">CES® 2021 Best of Innovation Awards Honoree</a>, <a href="maintenance-shipped-over-10M">shipped over 10M</a> <a href="maintenance-units-worldwide">units worldwide</a>, and <a href="maintenance-units-units-worldwide">unveiled the NDP120</a> part of the NDP10x family of inference engines for low-power applications.

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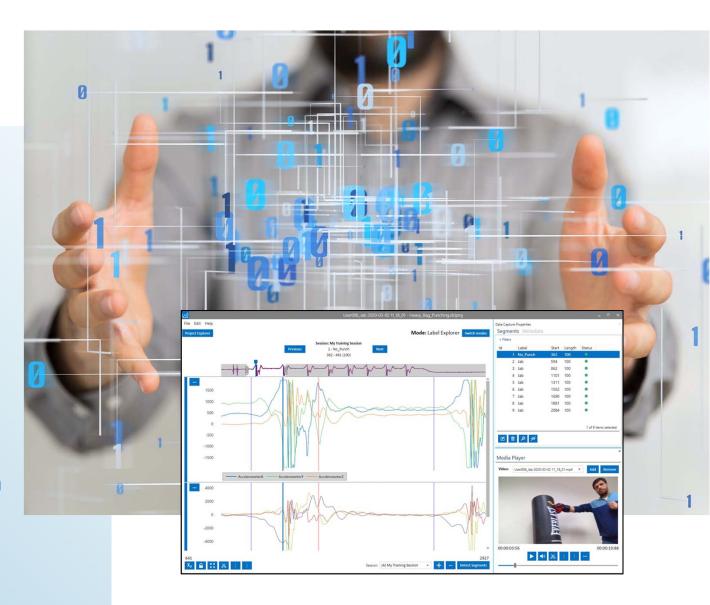


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