Preview of TinyML Applications

Acoustic Sensors Ultrasonic, <u>Microphones</u>, Geophones, Vibrometers

> Image Sensors Thermal, Image

Motion Sensors Gyroscope, Radar, Accelerometer





TinyML Application Areas



TinyML Application Areas



Keyword Spotting

























• How do we **capture** the data to feed into the neural network?



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- How do you make sure there is no bias in the dataset?



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- How do you make sure there is no **bias** in the dataset?
- How do you **deploy** this on the microcontroller?

TinyML Application Areas





















ML Model Evolution

- MobileNet (2015)
 - O MobileNetv1
 - 70.6% accuracy
 - 16.9MB in size



Source: S. Bianco, R. Cadene, L. Celona, and P. Napoletano, "Benchmark analysis of representative deep neural network architectures," *IEEE Access*, vol. 6, pp. 64 270–64 277, 2018

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Problem

Our board (in your kit for Course 3) only has 256KB of RAM (memory) yet *MobileNetv1* needs 16.9MB!



How do we engineer a TinyML vision network?

Think:

• Compute operations



How do we engineer a TinyML vision network?

Think:

• Compute operations

Operator numerics

How do we engineer a TinyML vision network?



Think:

- Compute **operations**
- Operator numerics
- Compression

methods (e.g.,

pruning, quantization)

What is the **end-to-end** workflow?











- How do we capture the data to feed into the neural network?
- How do you **design** the neural network to take in the image?
- What **dataset** does the neural network need to be trained?
- How do we pre-process the data for neural network inference?
- How do you post-process the neural network output?
- How do you make sure there is no **bias** in the dataset?
- How do you deploy this on the microcontroller?





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- How do you **design** the neural network to take in the image?
- What dataset does the neural network need to be trained?
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- How do you post-process the neural network output?
- How do you make sure there is no bias in the dataset?
- How do you deploy this on the microcontroller?
- How do we ensure that the neural network is resilient?





- How do we capture the data to feed into the neural network?
- How do you **design** the neural network to take in the image?
- What dataset does the neural network need to be trained?
- How do we pre-process the data for neural network inference?
- How do you **post-process** the neural network output?
- How do you make sure there is no bias in the dataset?
- How do you **deploy** this on the microcontroller?
- How do we ensure that the neural network is resilient?
- How do we get the neural network to train faster?

TinyML Application Areas















































Autoencoder







- How do we capture the time-series data to feed into the neural network?
- How do we **pre-process** the data for neural network inference?
- How do you design the autoencoder neural network?
- What dataset does the neural network need to be trained?
- How do you post-process the neural network output?
- How do you make sure there is no **bias** in the dataset?
- How do you **deploy** this on the microcontroller?

Fullscreen Show Presenter