

# Embedded Machine Learning for Edge Computing

# ML Pipeline, Model Evaluation and Deployment

Sahan Hemachandra



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#### About me

- Graduated from Department of Electronic and Telecommunications Engineering in 2021, specializing in computer vision.
- Authored papers several papers in computer vision conferences and a journal.
- Previously worked as a Senior Software Engineer at WSO2
- Currently working as a Research Assistant at Mohamed bin Zayed University of Artificial Intelligence, Abu Dhabi





### What will you Learn?



#### 1. How can we deploy Embedded AI solutions (Theory)?

- A. Required devices
- B. Training process for a model
- C. How to optimize models for embedded devices
- D. Porting and running models



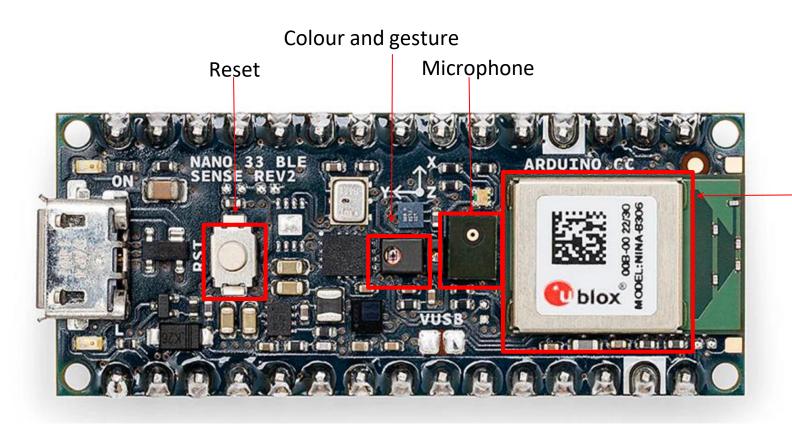


# **RECAP**



### Arduino Nano BLE





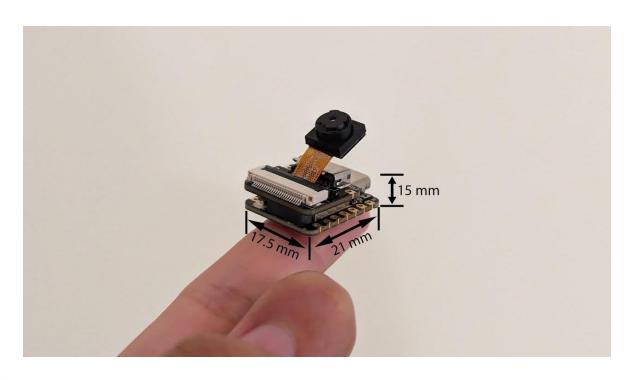
BLE and Processor



# XIAO ESP32S3









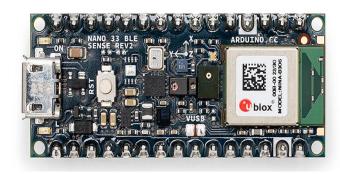
### Required Devices



- A resource rich device for training
- An embedded system for inference



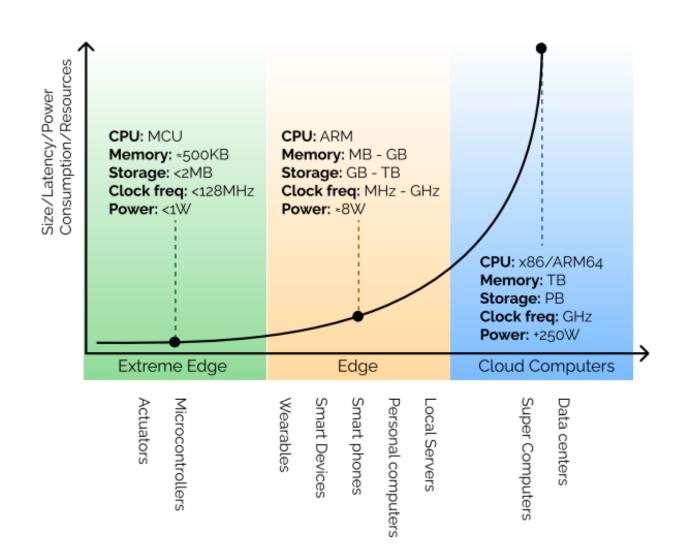






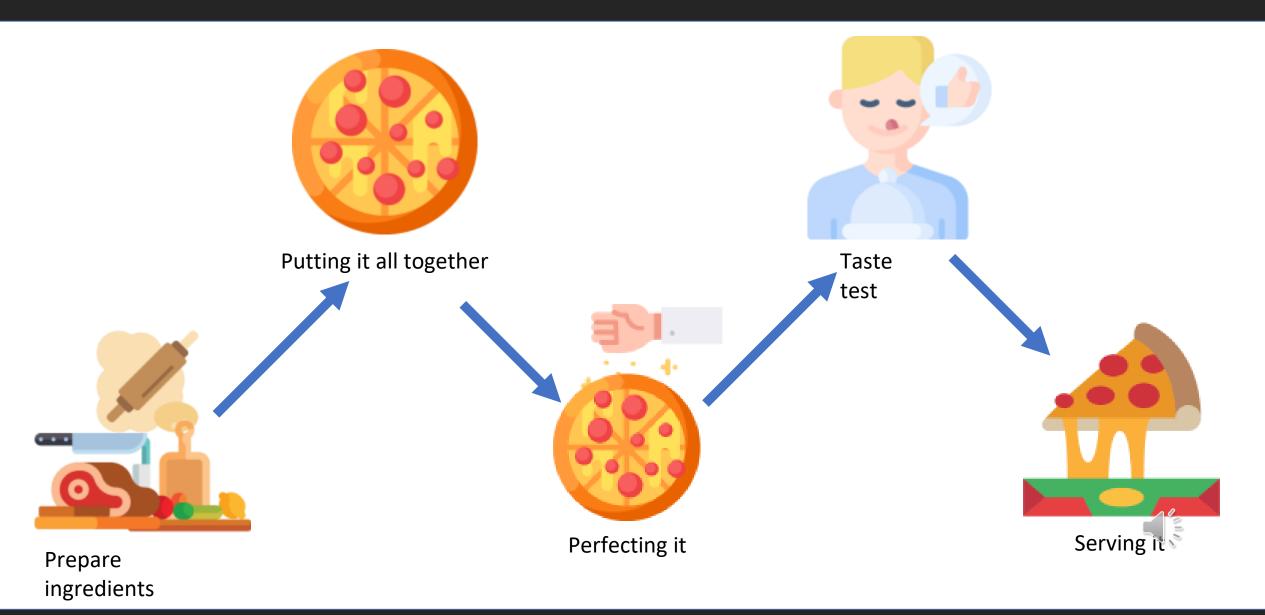
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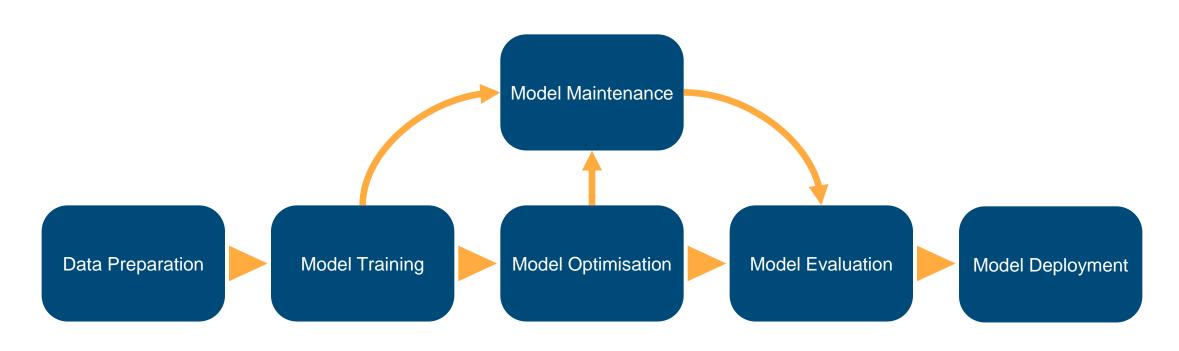








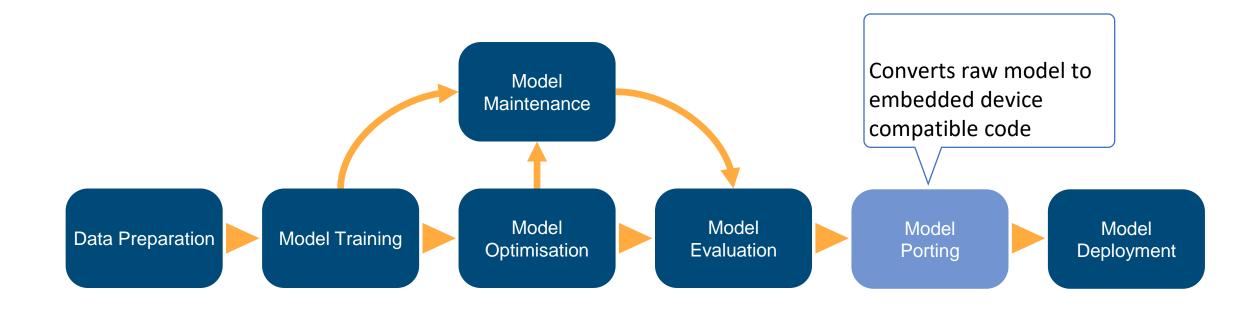






## Pipeline: Embedded ML



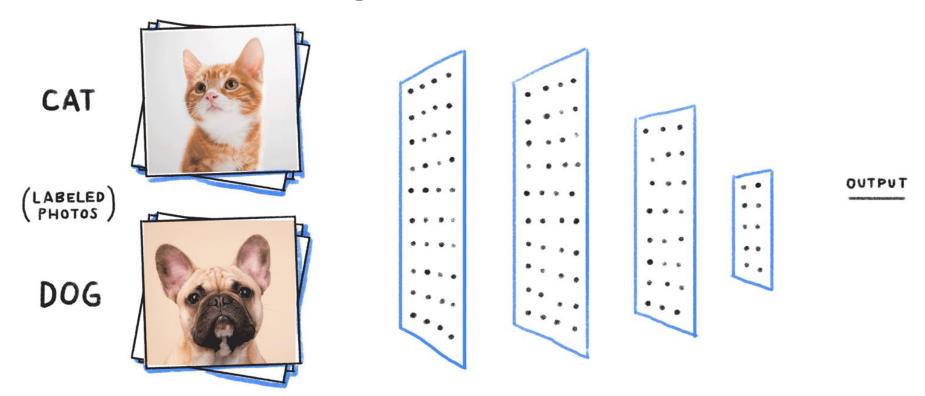




# Running Example

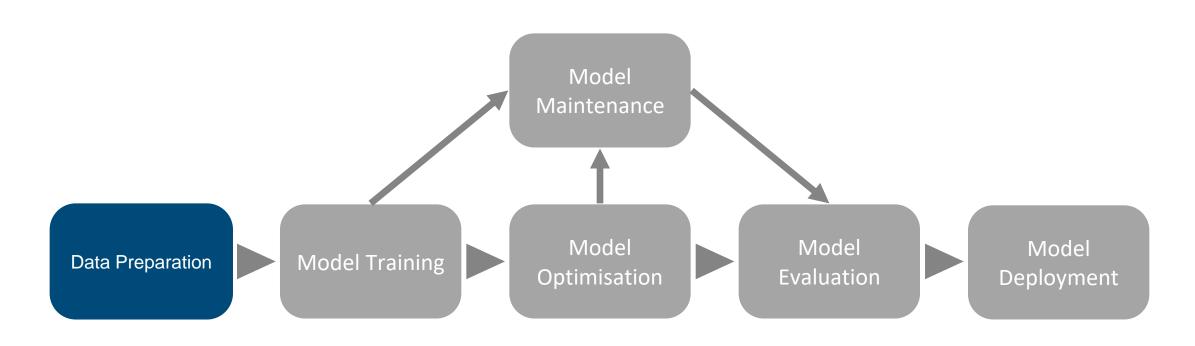


#### **Cat-Dog detection model**











## Capturing the data

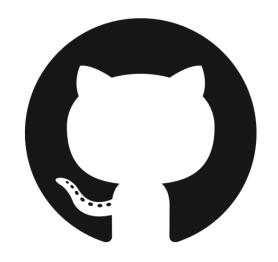






Better data = Better model





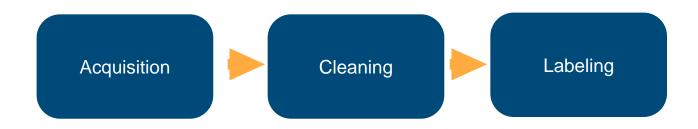


# Capturing the data - Creating a dataset PNTE



Process of creating your own dataset

- 1. Data **Acquisition**
- 2. Data Cleaning
- 3. Data Labeling





### Capturing the data - Creating a dataset



#### **Data Acquisition**

#### 1. Generate the data

- Used when no dataset for the use case exists
- Can be done via **crowdsourcing** or **synthesizing** data

#### 2. Augment the data

- Uses an existing dataset by "modifying" the existing
  - Cropping
  - Flipping
  - Rotating
  - Adjusting contrast and/or brightness













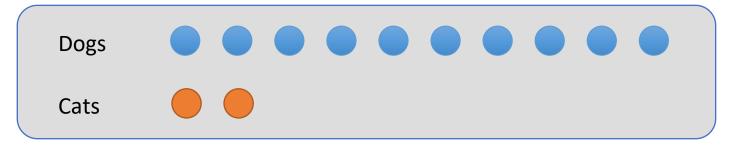


### Capturing the data - Creating a dataset



#### **Data Cleaning**

- Cleaning out rogue data (duplicates, noisy, etc.)
- Cleaning out formatting issues (e.g., String to data-time formatting)
- Removing bias' in the data diversify



**Dataset** 

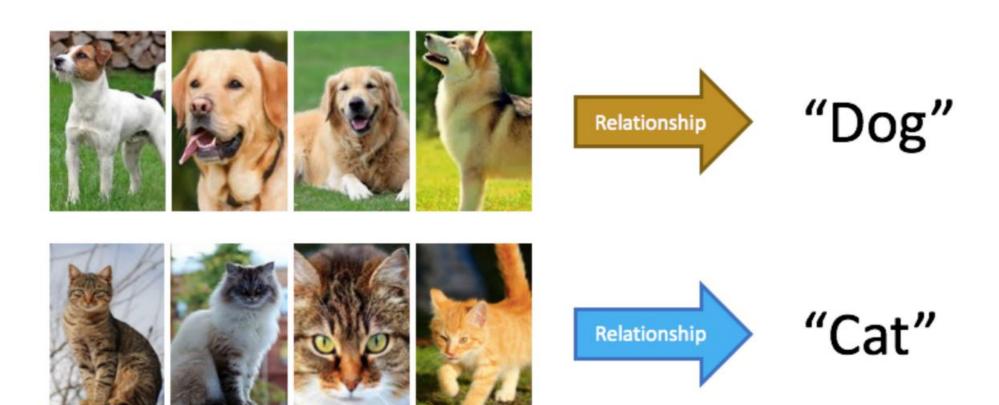


### Capturing the data - Creating a dataset

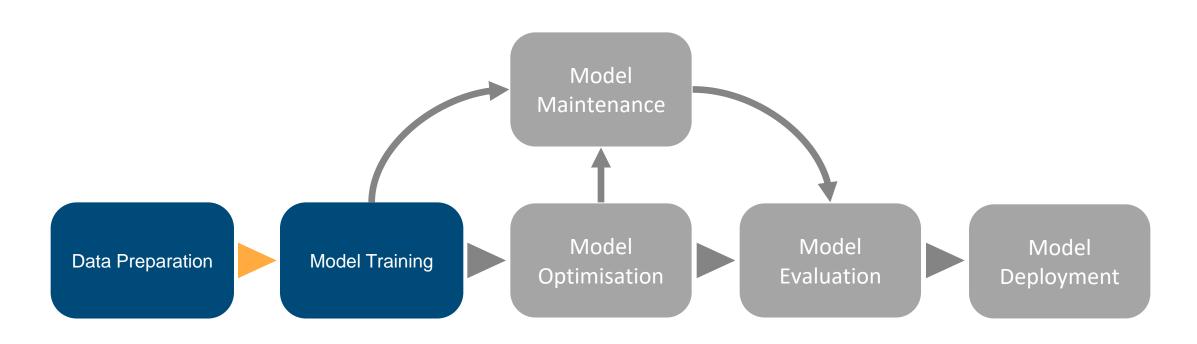


#### **Data Labeling**

- Give more contextual meaning to the data
  - e.g., An image of a dog should be labelled as "Dog"









### Training the model

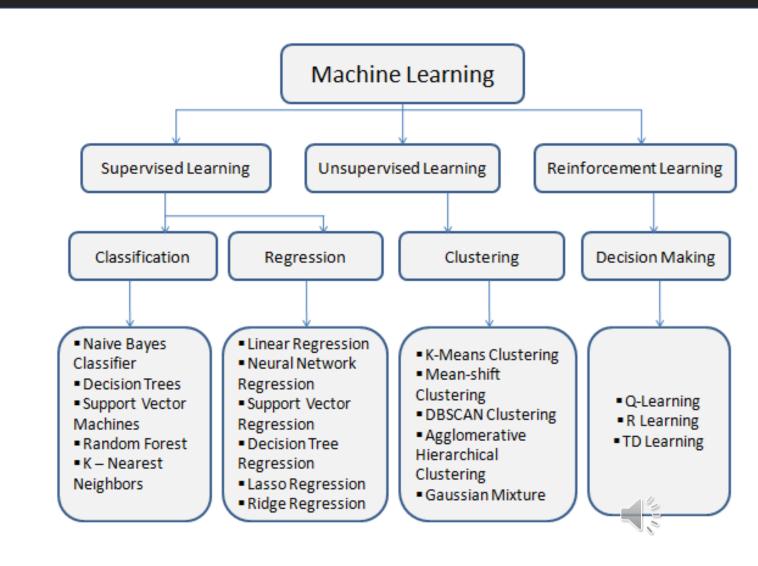


#### 1. Selecting the model for the problem

- 1. Understand the use-case
- 2. Consider the type of data

#### 2. Creating the model

- Can use popular libraries
  - 1. TensorFlow
  - 2. SciKit Learn
  - 3. Keras













# Cont. Cat-dog detection



- 1. What is the type of data we will feed into the model to get an output?
  - Text data
  - Image data
  - Numerical data
- 2. What model is most suitable for the job?
  - Convolutional Neural Networks
  - Decision trees
  - K-Nearest Neighbor
- 3. What framework should be use?
  - Keras
  - OpenCV
  - TensorFlow





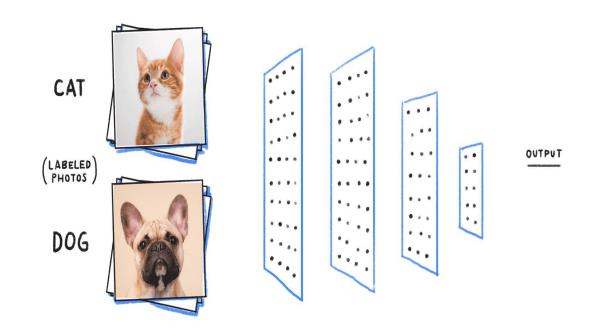
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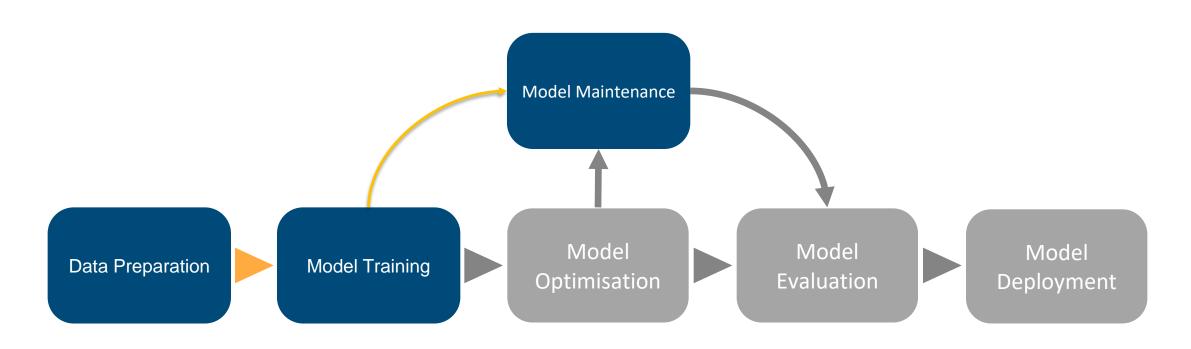


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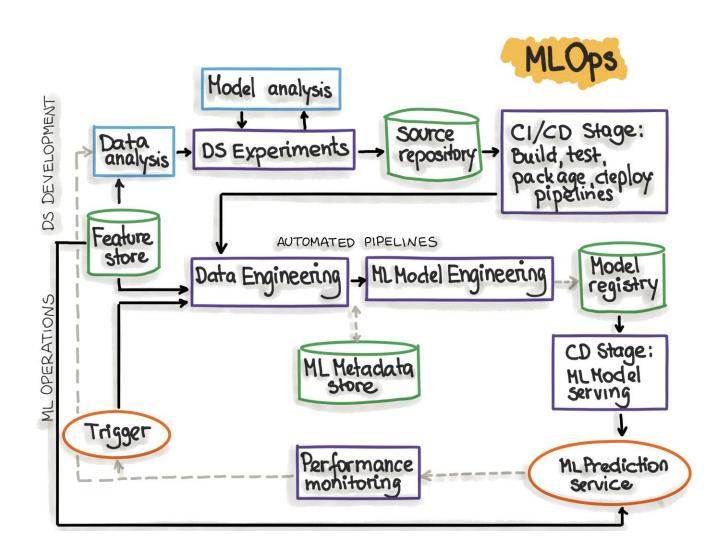






### Model Maintenance





**ML-OPS** 







