

XIAO\_ESP32S3

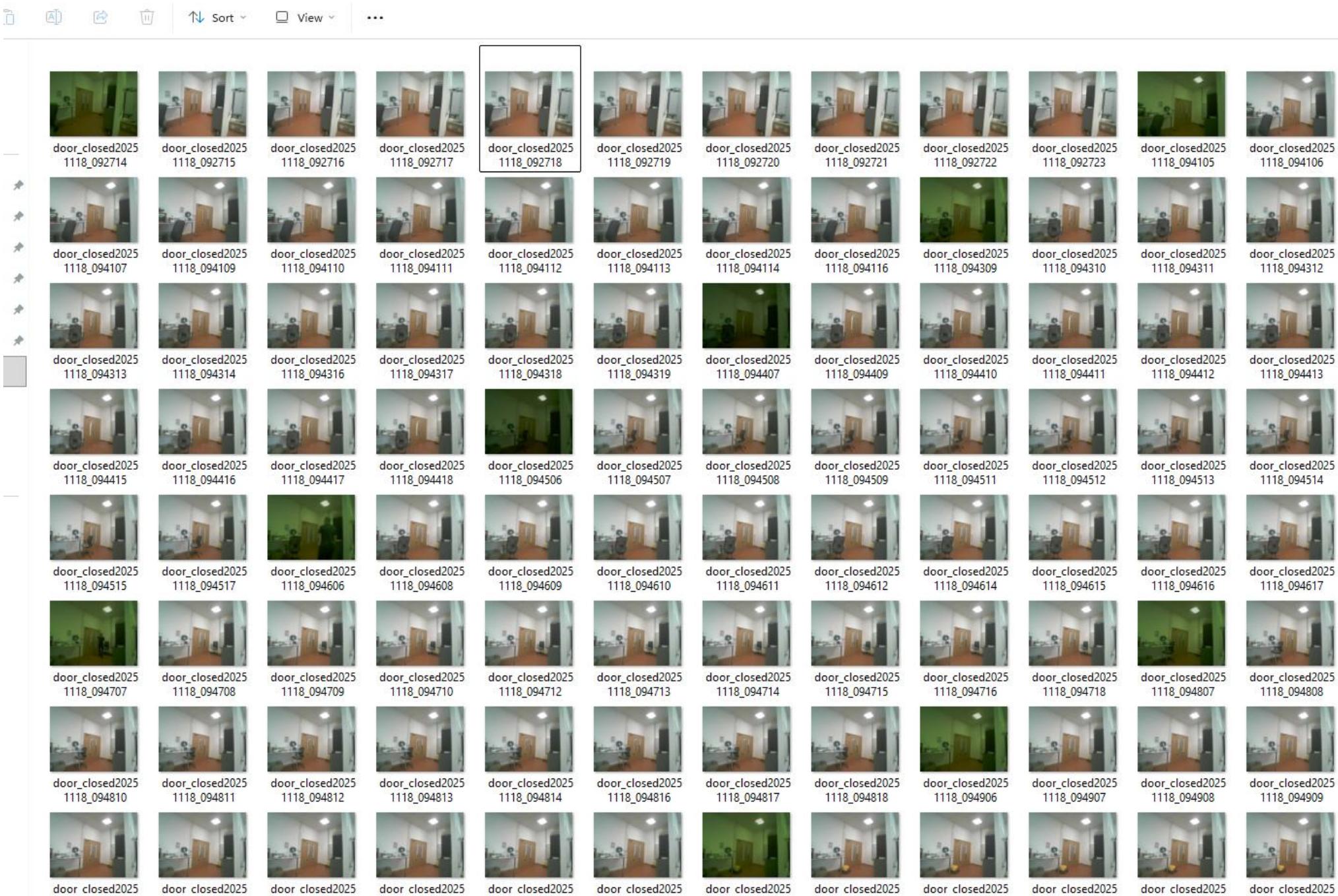
## XIAO\_Image\_Capture\_JPEG.ino

```
1  /***************************************************************************  
2   * XIAO ESP32-S3 Image Capture for CNN Dataset (96x96x3)  
3   *  
4   * This sketch captures images from the OV2640 camera attached to the Seeed XIAO ESP32-S3,  
5   * resizes them to 96x96 RGB, and saves them as JPEG files to the SPI SD card.  
6   *  
7   * FEATURES:  
8   * 1. Prompts the user via Serial Monitor to enter the current date/time at startup.  
9   * - Format: YYYY/MM/DD HH:MM:SS  
10  * - Used to timestamp the filenames.  
11  * 2. Prompts the user to enter a label for each batch of images.  
12  * - The label is included in each file name: <label>_YYYYMMDD_HHMMSS.jpg  
13  * 3. Captures images in batches (IMAGE_COUNT), applying a 1-second delay between captures.  
14  * 4. Resizes each captured frame to 96x96 RGB before saving to SD card.  
15  * 5. Uses the working SPI SD card configuration:  
16  * - CS = 21, SCK = 7, MISO = 8, MOSI = 9  
17  * 6. Uses the official Seeed XIAO ESP32-S3 OV2640 pinout for camera stability.  
18  * 7. JPEG quality adjustable via JPEG_QUALITY.  
19  *  
20  * REQUIREMENTS:  
21  * - SD card formatted as FAT32.  
22  * - Libraries:  
23  * - SD.h
```

Output Serial Monitor

Not connected. Select a board and a port to connect automatically.

```
22:15:53.752 ->  
22:15:53.752 -> --- Ready for image capture ---  
22:15:53.752 -> Enter the image label for this batch and press Enter:  
22:16:03.942 ->  
22:16:03.942 -> *** Starting capture batch for label: door ***  
22:16:03.942 -> Capturing image 1/10... Saved.  
22:16:03.983 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:04.979 -> Capturing image 2/10... Saved.  
22:16:05.021 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:05.989 -> Capturing image 3/10... Saved.  
22:16:06.024 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:07.024 -> Capturing image 4/10... Saved.  
22:16:07.071 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:08.065 -> Capturing image 5/10... Saved.  
22:16:08.105 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:09.087 -> Capturing image 6/10... Saved.  
22:16:09.162 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:10.135 -> Capturing image 7/10... Saved.  
22:16:10.178 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:11.198 -> Capturing image 8/10... Saved.  
22:16:11.239 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:12.223 -> Capturing image 9/10... Saved.  
22:16:12.266 -> Pausing for 1 second(s). Move camera/change lighting now.  
22:16:13.260 -> Capturing image 10/10... Saved.  
22:16:13.301 ->  
22:16:13.301 -> *** Batch Complete: 10 images saved under label door ***  
22:16:13.301 -> Enter the image label for the next batch and press Enter:
```



```
visualizing representative images...
Loaded 'door_closed' image: /content/door_closed20251118_094517.jpg
Loaded 'door_open' image: /content/door_open20251118_093312.jpg
```

Door Closed Example



Door Open Example



Representative images displayed successfully.

CNN Model Summary:  
Model: "sequential\_4"

| Layer (type)                   | Output Shape       | Param #   |
|--------------------------------|--------------------|-----------|
| conv2d_8 (Conv2D)              | (None, 94, 94, 32) | 896       |
| max_pooling2d_8 (MaxPooling2D) | (None, 47, 47, 32) | 0         |
| conv2d_9 (Conv2D)              | (None, 45, 45, 64) | 18,496    |
| max_pooling2d_9 (MaxPooling2D) | (None, 22, 22, 64) | 0         |
| flatten_4 (Flatten)            | (None, 30976)      | 0         |
| dense_8 (Dense)                | (None, 128)        | 3,965,056 |
| dense_9 (Dense)                | (None, 1)          | 129       |

Total params: 3,984,577 (15.20 MB)

Trainable params: 3,984,577 (15.20 MB)

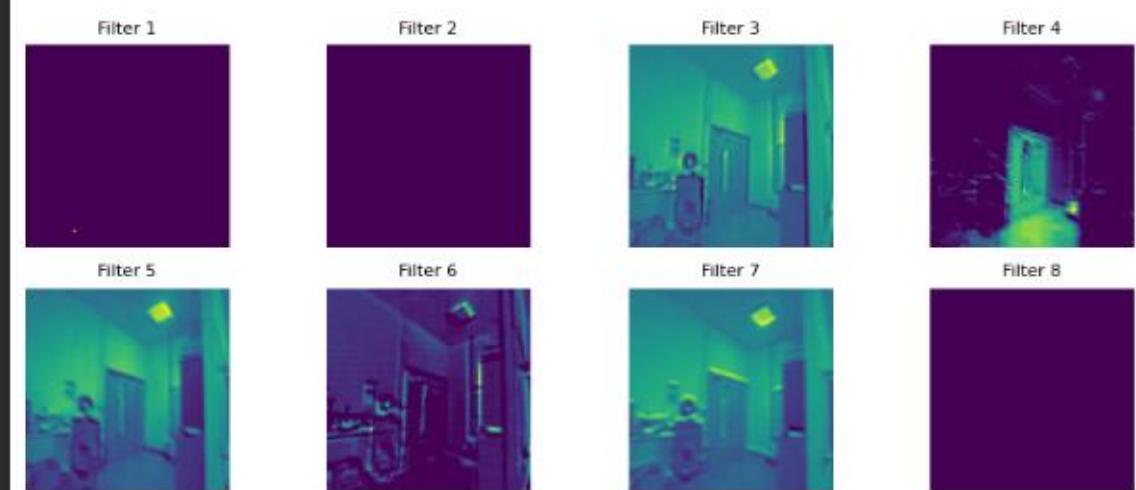
Non-trainable params: 0 (0.00 B)

CNN model defined and summary printed successfully.

```
visualizing convolutions for a sample 'door_closed' image...
1/1 ━━━━━━ 0s 144ms/step
```

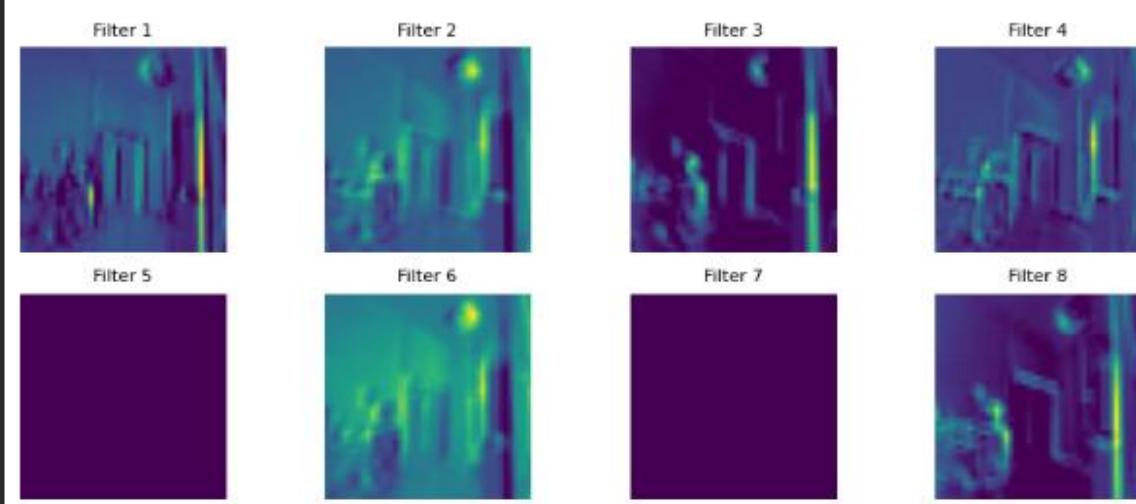
visualizing feature maps for layer: conv2d\_8

Feature Maps for conv2d\_8

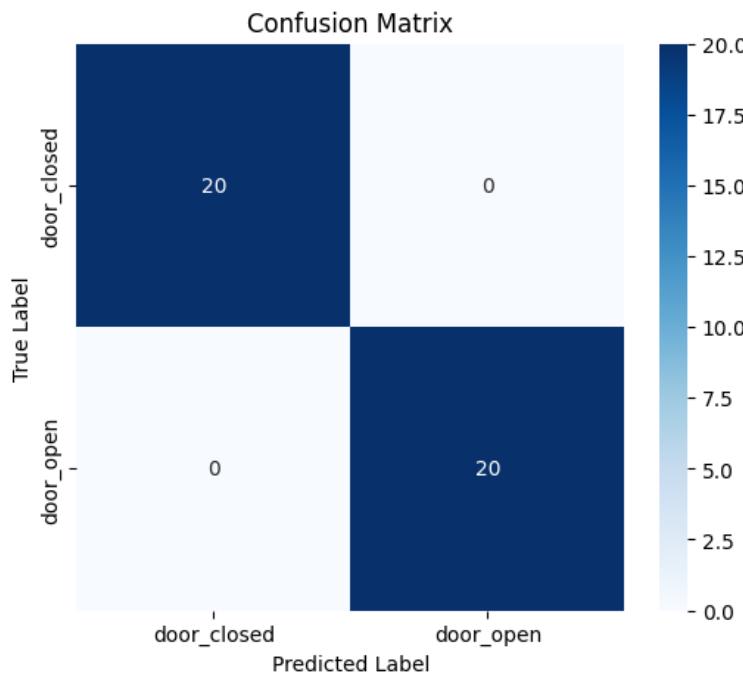
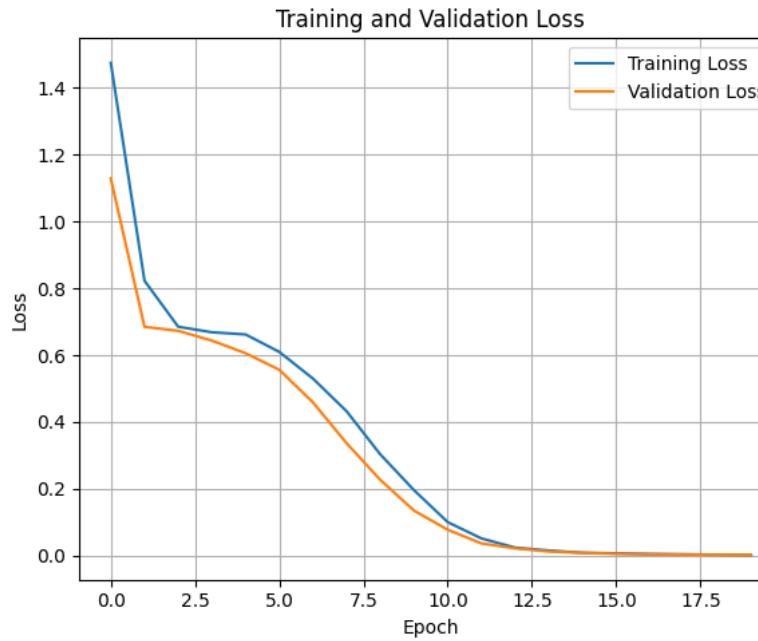
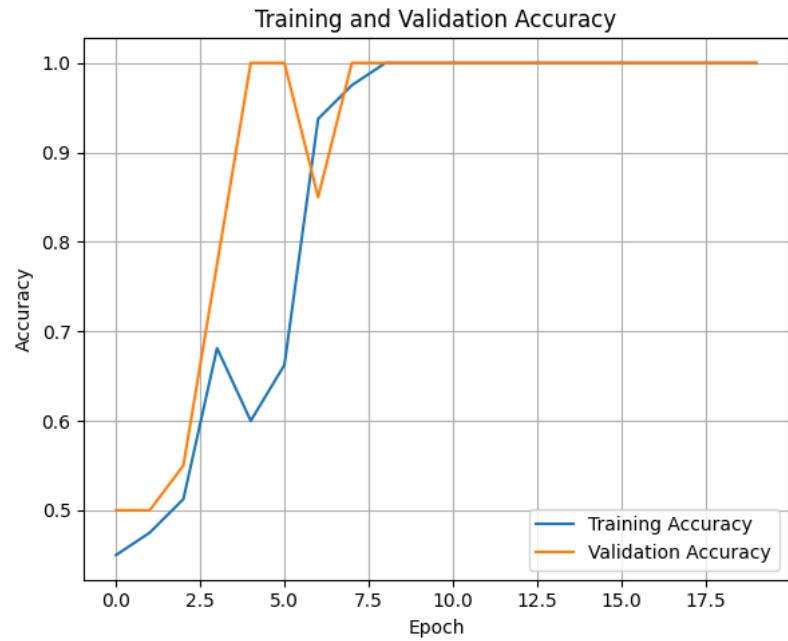


Visualizing feature maps for layer: conv2d\_9

Feature Maps for conv2d\_9



Feature map visualization complete.



Edge\_AI\_Door\_Detect.ipynb

File Edit View Insert Runtime Tools Help

Commands + Code + Text Run all

Files

- ..
- door\_open20251118\_093713.jpg
- door\_open20251118\_093714.jpg
- door\_open20251118\_093716.jpg
- door\_open20251118\_093717.jpg
- door\_open20251118\_093718.jpg
- door\_open20251118\_093806.jpg
- door\_open20251118\_093807.jpg
- door\_open20251118\_093809.jpg
- door\_open20251118\_093810.jpg
- door\_open20251118\_093811.jpg
- door\_open20251118\_093812.jpg
- door\_open20251118\_093813.jpg
- door\_open20251118\_093814.jpg
- door\_open20251118\_093816.jpg
- door\_open20251118\_093817.jpg
- door\_open20251118\_093907.jpg
- door\_open20251118\_093908.jpg
- door\_open20251118\_093909.jpg
- door\_open20251118\_093910.jpg
- door\_open20251118\_093911.jpg
- door\_open20251118\_093912.jpg
- door\_open20251118\_093914.jpg
- door\_open20251118\_093915.jpg
- door\_open20251118\_093916.jpg
- model\_quantized.tflite

```
[11] ✓ 6s
# 5. Save the tflite_model to a file
quantized_model_path = 'model_quantized.tflite'
with tf.io.gfile.GFile(quantized_model_path, 'wb') as f:
    f.write(tflite_model)
print(f"Quantized TFLite model saved to: {quantized_model_path}")

# 6. Calculate the size of the original Keras model
# Save the original model temporarily to get its size
original_model_path = 'original_keras_model.h5'
model.save(original_model_path)
original_model_size = os.path.getsize(original_model_path) / 1024 # in KB
print(f"Original Keras model size: {original_model_size:.2f} KB")

# 7. Calculate the size of the converted TFLite model
quantized_model_size = os.path.getsize(quantized_model_path) / 1024 # in KB
print(f"Quantized TFLite model size: {quantized_model_size:.2f} KB")

# Clean up the temporarily saved original model
os.remove(original_model_path)

print("TensorFlow Lite model conversion and size comparison complete.")

...
Starting TensorFlow Lite model conversion (INT8 quantized)...
Converting model to TFLite INT8...
Saved artifact at '/tmp/tmptsfbu9ox'. The following endpoints are available:
* Endpoint 'serve'
  args_0 (POSITIONAL_ONLY): TensorSpec(shape=(None, 96, 96, 3), dtype=tf.float32, name='keras_tensor')
  Output Type:
    TensorSpec(shape=(None, 1), dtype=tf.float32, name=None)
  Captures:
    132992285878864: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285880016: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285878672: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285877328: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285879448: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285879056: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285880400: TensorSpec(shape=(), dtype=tf.resource, name=None)
    132992285879632: TensorSpec(shape=(), dtype=tf.resource, name=None)
/usr/local/lib/python3.12/dist-packages/tensorflow/lite/python/convert.py:854: UserWarning: Statistics for quantization.
warnings.warn(
WARNING:absl:You are saving your model as an HDF5 file via `model.save()` or `keras.saving.save_model(model)`.
Model converted successfully.
Quantized TFLite model saved to: model_quantized.tflite
Original Keras model size: 46732.59 KB
Quantized TFLite model size: 3900.88 KB
TensorFlow Lite model conversion and size comparison complete.
```

Left-click->download

```
tflite_to_h.py
```

```
File Edit View
```

```
import argparse

# Define the expected array name in the Arduino sketch
ARRAY_NAME = "door_status_model"

def generate_header(tflite_path, header_path, array_name):
    with open(tflite_path, 'rb') as f:
        tflite_model = f.read()

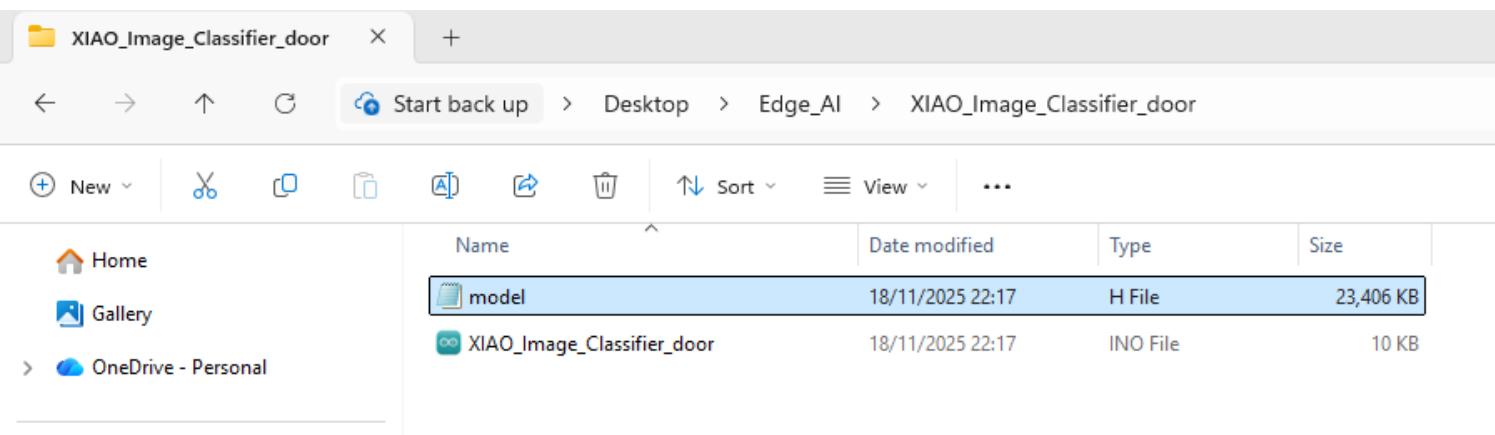
    # Format the model data as a C array
    hex_data = ', '.join([f'0x{byte:02x}' for byte in tflite_model])

    # Write the C header file
    with open(header_path, 'w') as f:
        f.write(f'#ifndef MODEL_H\n')
        f.write(f'#define MODEL_H\n\n')
        f.write(f'// Model size: {len(tflite_model)} bytes\n')
        f.write(f'const unsigned char {array_name}[] = {{\n')
        f.write(f'{hex_data}\n')
        f.write(f'}}};\n\n')
        f.write(f'const int {array_name}_len = {len(tflite_model)};\n\n')
        f.write(f'#endif // MODEL_H\n')

    print(f"Successfully generated {header_path} ({len(tflite_model)} bytes) with array name '{array_name}'.")

# Define the names of your files
input_file = "model_quantized.tflite" Make sure input file name matches file that
output_file = "model.h" was downloaded in previous step

# NOTE: The Arduino sketch expects the variable name 'person_model',
# even if your input file is 'door_status_model.tflite'.
generate_header(input_file, output_file, ARRAY_NAME)
```

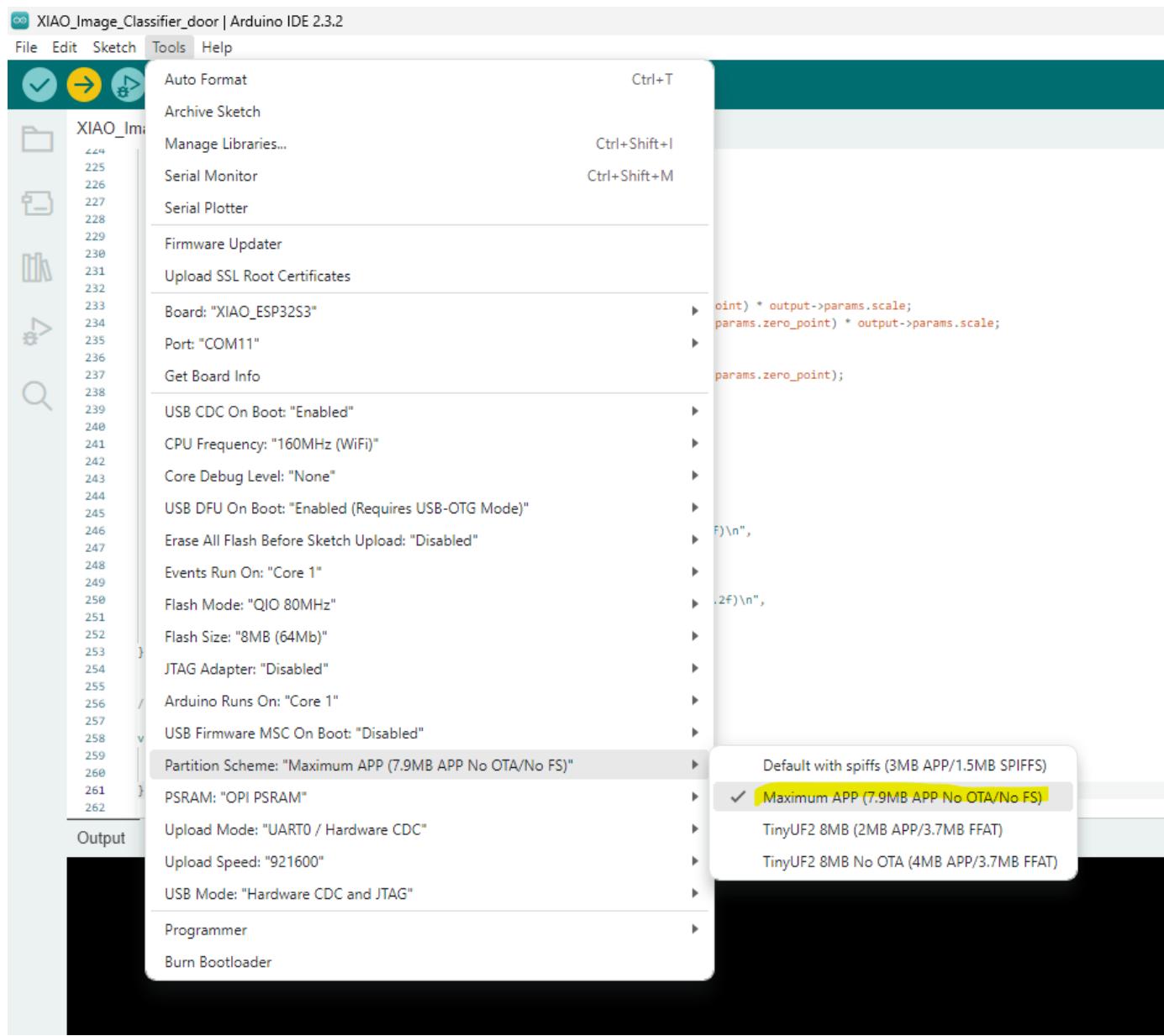


```
Windows PowerShell
```

```
PS C:\Users\Kris\Desktop\Edge_AI> python tflite_to_h.py
Successfully generated model.h (3994504 bytes) with array name 'door_status_model'.
PS C:\Users\Kris\Desktop\Edge_AI>
```



Note: The model is quantised int8 to ensure it is small enough for the Seeed XIAO!



The screenshot shows the Arduino IDE interface with the title bar "XIAO\_Image\_Classifier\_door | Arduino IDE 2.3.2". The "Sketch" menu is open, showing the sketch name "XIAO\_ESP32S3" and the "Upload" option. The main workspace shows the code for "XIAO\_Image\_Classifier\_door.ino" and "model.h". The "Output" window displays the upload progress, showing multiple writes to memory locations starting from 0x00400f940, with percentages ranging from 95.5% to 100.0%. The message "Hash of data verified." is also present at the bottom of the output window.

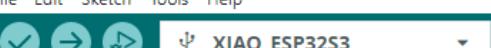
```
/*
 * @file XIAO_Image_Classifier_Door.ino
 * @brief FINAL SKETCH: Corrected to use 3-channel (RGB565) input, detection threshold lowered,
 * and the classification logic is updated from Person/No-Person to **Door Closed/Door Open**.
 *
 * --- UPDATES APPLIED ---
 * 1. Logic Change: Classification updated to **DOOR_CLOSED** and **DOOR_OPEN**.
 * 2. Constants Updated: PERSON/NO_PERSON indices changed to DOOR_CLOSED/DOOR_OPEN indices.
 * 3. Comments/Prints: Updated throughout the code to reflect the new task.
 */

#include <Arduino.h>
#include <esp_heap_caps.h>
#include <tensorflow/lite/micro/micro_mutable_op_resolver.h>
#include <tensorflow/lite/micro/micro_interpreter.h>
#include <tensorflow/lite/micro/micro_log.h>
#include <tensorflow/lite/micro/system_setup.h>
#include <tensorflow/lite/schema/schema_generated.h>
#include "tensorflow/lite/micro/micro_utils.h"
#include "esp_camera.h"
#include "esp_log.h"
// You must ensure 'model.h' containing 'door_status_model' is in your project directory
#include "model.h"

// --- CONSTANTS AND CONFIGURATION ---
const int kTensorArenaSize = 384 * 1024;
// ASSUMPTION: DOOR_CLOSED is index 0 and DOOR_OPEN is index 1 in the model's output.
#define DOOR_OPEN_INDEX 1
#define DOOR_CLOSED_INDEX 0
#define DETECTION_THRESHOLD 0.70 // Sensitivity for positive detection (DOOR OPEN)
#define MODEL_INPUT_WIDTH 96
#define MODEL_INPUT_HEIGHT 96

Writing at 0x00400f940 [=====] 95.5% 3784704/3961220 bytes...
Writing at 0x00414e17 [=====] 96.0% 3801088/3961220 bytes...
Writing at 0x00419e32 [=====] 96.4% 3817472/3961220 bytes...
Writing at 0x0041f1e7 [=====] 96.8% 3833856/3961220 bytes...
Writing at 0x004256dd [=====] 97.2% 3850240/3961220 bytes...
Writing at 0x0042b49d [=====] 97.6% 3866624/3961220 bytes...
Writing at 0x00430a77 [=====] 98.0% 3883008/3961220 bytes...
Writing at 0x00437921 [=====] 98.4% 3899392/3961220 bytes...
Writing at 0x0043f2d3 [=====] 98.9% 3915776/3961220 bytes...
Writing at 0x00444ff3 [=====] 99.3% 3932160/3961220 bytes...
Writing at 0x0044ad96 [=====] 99.7% 3948544/3961220 bytes...
Writing at 0x0044f8d0 [=====] 100.0% 3961220/3961220 bytes...
Wrote 4454688 bytes (3961220 compressed) at 0x00010000 in 38.4 seconds (927.6 kbit/s).
Hash of data verified.

Hard resetting via RTS pin...
```



XIAO\_ESP32S3

camera\_usb\_viewer.ino

```

1  /**
2   * @file Camera_USB_Viewer.ino
3   * @brief Standalone sketch to stream 96x96 grayscale image data over USB serial.
4   * This is used to diagnose image brightness/quality issues (like the door-open scene being too dark).
5   */
6
7 #include <Arduino.h>
8 #include "esp_camera.h"
9 #include "esp_log.h"
10
11 #define IMAGE_WI
12 #define IMAGE_HE
13 #define FRAME_DE
14
15 // Camera config
16 static camera_config_t camera_config = {
17     .pin_pdn =,
18     .pin_reset =,
19
20     // --- CORRE
21     .pin_xclk =,
22     .pin_sccb_sd =,
23     .pin_sccb_sc =
24
25     // Data Pins (D7-D0)
26     .pin_d7 = 48, .pin_d6 = 11, .pin_d5 = 12, .pin_d4 = 14,
27     .pin_d3 = 16, .pin_d2 = 18, .pin_d1 = 17, .pin_d0 = 15,
28
29     // Sync Pins
30     .pin_vsync = 38, .pin_href = 47, .pin_pclk = 13,
31     .xclk_freq_hz = 20000000,
32
33     .ledc_timer = LEDC_TIMER_0,
34     .ledc_channel = LEDC_CHANNEL_0,
35     .pixel_format = PIXFORMAT_RGB565,
36     .frame_size = FRAMESIZE_96X96,
37     .jpeg_quality = 12,
38     .fb_count = 1,
39     .fb_location = CAMFRAMER_TN_PSRAM,

```

Output

```

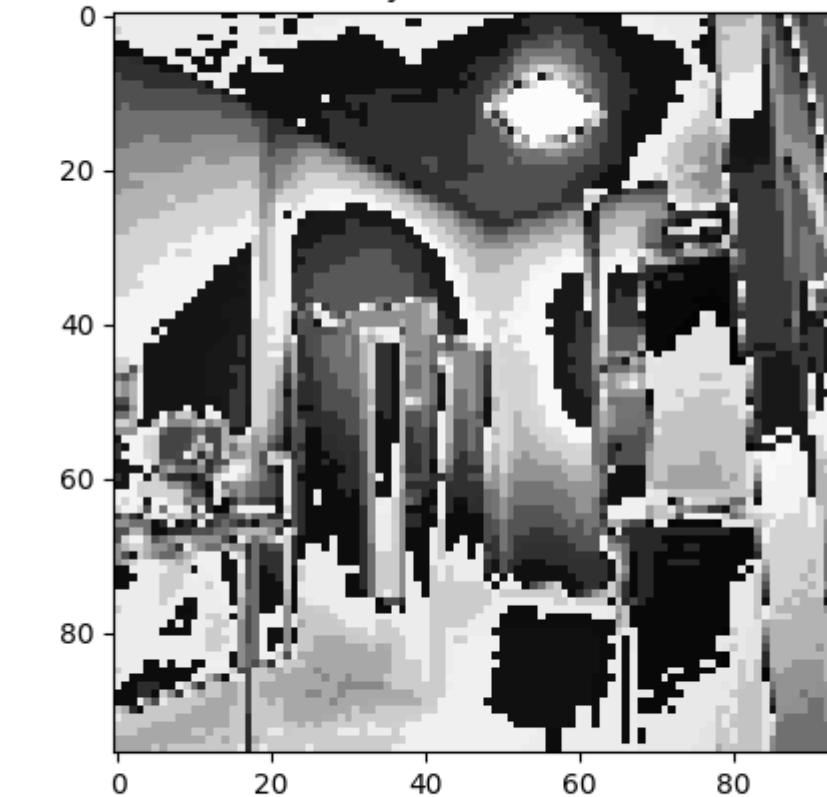
Writing at 0x0003a8b3 [=====] 41.0% 81920/199599 bytes...
Writing at 0x00040177 [=====] 49.3% 98384/199599 bytes...
Writing at 0x0004662f [=====] 57.5% 114688/199599 bytes...
Writing at 0x0004c9e7 [=====] 65.7% 131072/199599 bytes...
Writing at 0x00053017 [=====] 73.9% 147456/199599 bytes...
Writing at 0x0005b431 [=====] 82.1% 163840/199599 bytes...
Writing at 0x00060ed8 [=====] 90.3% 180224/199599 bytes...
Writing at 0x00066e24 [=====] 98.5% 196688/199599 bytes...
Writing at 0x000683f0 [=====] 100.0% 199599/199599 bytes...
Wrote 361456 bytes (199599 compressed) at 0x00010000 in 2.7 seconds (1075.9 kbit/s).
Hash of data verified.

Hard resetting via RTS pin...

```

Figure 1

## Live Grayscale Feed (96x96)



XIAO\_ESP32S3

XIAO\_Image\_Classifier\_door1.ino door\_status\_model.h

```

1  /**
2   * @file XIAO_Image_Classifier_Door.ino
3   * @brief FINAL DEFINITIVE SKETCH: All previous fixes (TFLite, memory, camera stability) are retained.
4   * Classification logic is FIXED to trigger on the reliable DROP in the "Closed" score, as the "Open"
5   * score is unstable.
6   */
7
8  #include <Arduino.h>
9  #include <esp_heap_caps.h>
10 // TFLite Includes
11 #include <tensorflow/lite/micro/micro_mutable_op_resolver.h>
```

Output Serial Monitor ×

Message (Enter to send message to 'XIAO\_ESP32S3' on 'COM12')

```

12:45:09.134 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:10.648 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:10.649 -> DEBUG: Raw Scores: Closed=-30, Open=-128
12:45:10.649 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:12.194 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:12.194 -> DEBUG: Raw Scores: Closed=-124, Open=-128
12:45:12.194 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:13.703 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:13.703 -> DEBUG: Raw Scores: Closed=-30, Open=-128
12:45:13.703 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:15.228 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:15.228 -> DEBUG: Raw Scores: Closed=51, Open=-128
12:45:15.228 -> └─ Door Closed. Highest 'Closed' Score: 0.70 ('Open' Score: 0.00)
12:45:16.743 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:16.743 -> DEBUG: Raw Scores: Closed=-57, Open=-128
12:45:16.743 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:18.213 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:18.213 -> DEBUG: Raw Scores: Closed=-69, Open=-128
12:45:18.213 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:19.726 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:19.726 -> DEBUG: Raw Scores: Closed=-104, Open=-128
12:45:19.726 -> └─ **DOOR OPENED DETECTED!** Confidence: 0.00 (Closed Score Drop: < 0.55)
12:45:21.267 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:21.267 -> DEBUG: Raw Scores: Closed=44, Open=-128
12:45:21.267 -> └─ Door Closed. Highest 'Closed' Score: 0.67 ('Open' Score: 0.00)
12:45:22.780 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:22.780 -> DEBUG: Raw Scores: Closed=15, Open=-128
12:45:22.780 -> └─ Door Closed. Highest 'Closed' Score: 0.56 ('Open' Score: 0.00)
12:45:24.289 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:24.289 -> DEBUG: Raw Scores: Closed=104, Open=-128
12:45:24.289 -> └─ Door Closed. Highest 'Closed' Score: 0.91 ('Open' Score: 0.00)
12:45:25.801 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:25.801 -> DEBUG: Raw Scores: Closed=95, Open=-128
12:45:25.801 -> └─ Door Closed. Highest 'Closed' Score: 0.87 ('Open' Score: 0.00)
12:45:27.302 -> DEBUG: Scale=0.0039, ZeroPoint=-128
12:45:27.302 -> DEBUG: Raw Scores: Closed=98, Open=-128
12:45:27.302 -> └─ Door Closed. Highest 'Closed' Score: 0.88 ('Open' Score: 0.00)
```

Door Status Condition Threshold **OPEN** ClosedScore < 0.55  
**CLOSED** DoorStatusModel.CLOSED\_SCORE\_THRESHOLD ClosedScore ≥ 0.55

The logic-reversal strategy is fully legitimate and widely used in ML systems—especially in TinyML and embedded vision.





