Crop identification with Edge Impulse

Lab Workbook

Objective

"Develop a ML system which can be deployed on Sony Spresense which can identify crops"

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About this Workbook

The contents of this workbook are created by Adiuvo Engineering & Training, Ltd.

If you have any questions about the contents, or need assistance, please contact Adam Taylor at adam@adiuvoengineering.com.

Pre-LabWorkshop Pre-requisites

Required Hardware

This lab requires a <u>Sony Spresense</u> development board with the Extension board and Camera module.

Boards can be purchased from the link below.

Development Board

Camera Module

Extension Board



Downloads and Installations

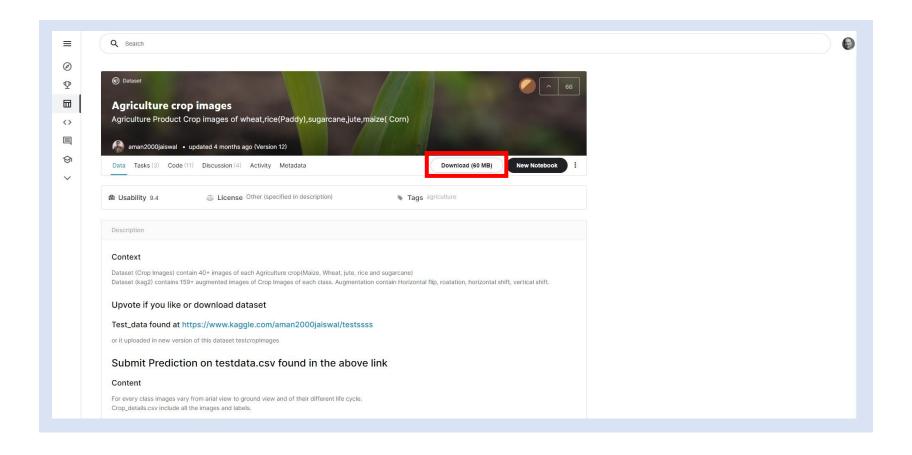
Step 1 – Download and install the following at least one day prior to the workshop. This may take a significant amount of time and drive space.

Edge Impulse Account	Register
Edge Impulse Daemon	Install
GNU Make	Download
GNU ARM Embedded Toolchain 8-2018-q4-major	Download
Git	Download
Text Editor e.g Notepad++ / Vs Code etc	

Lab Get the Data Set

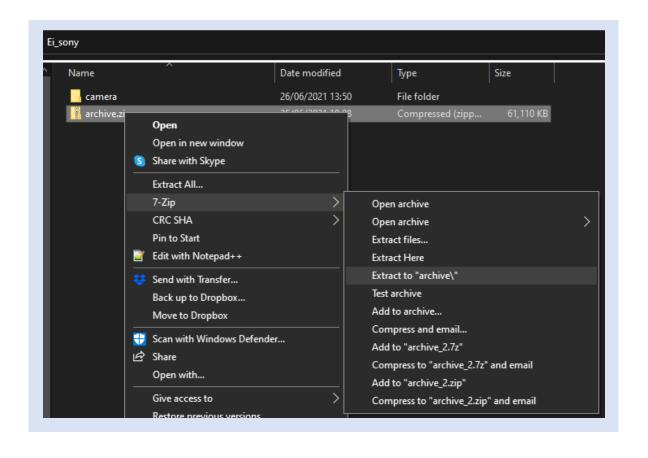
Edge Impulse: Get the Data Set

Step 1 – Log into Kaggle and download the data set to a location https://www.kaggle.com/aman2000jaiswal/agriculture-crop-images



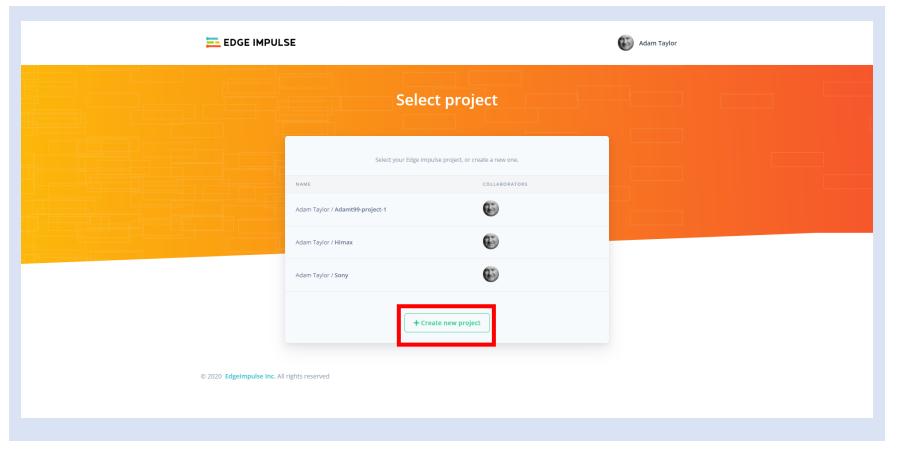
Edge Impulse: Get the Data Set

Step 2 – Extract the Compressed Zip file

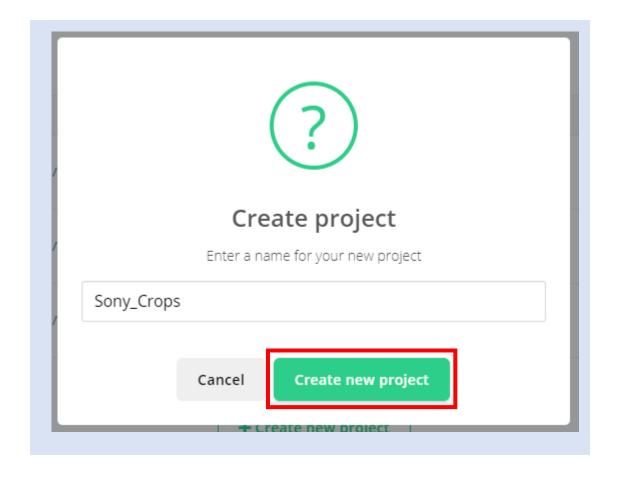


Lab Creating The Impulse

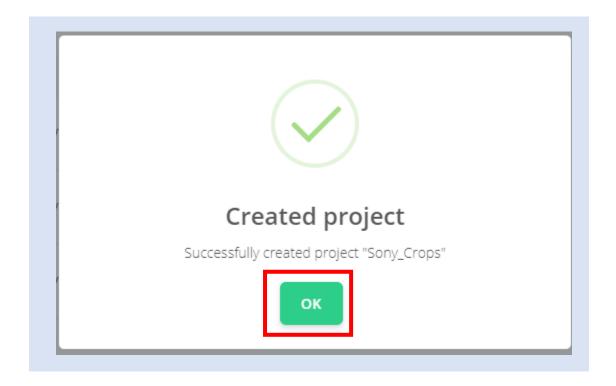
Step 1 – Log Into Edge Impulse Studio via www.edgeimpulse.com In edge impulse studio select create project



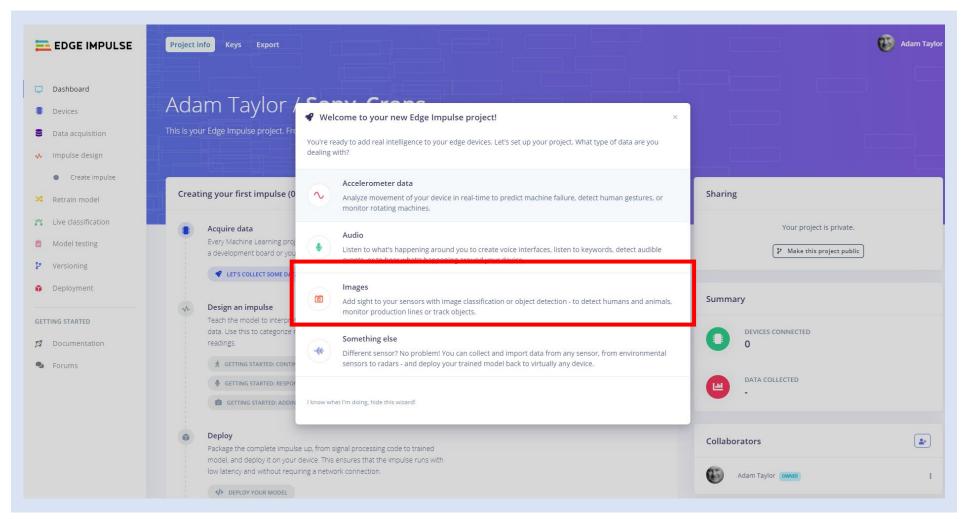
Step 2 – Name the Project Sony_Crops – Click on Create New Project



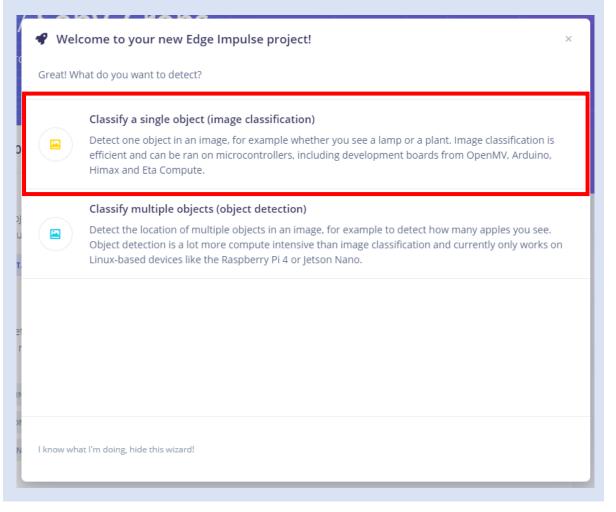
Step 3 – Click OK



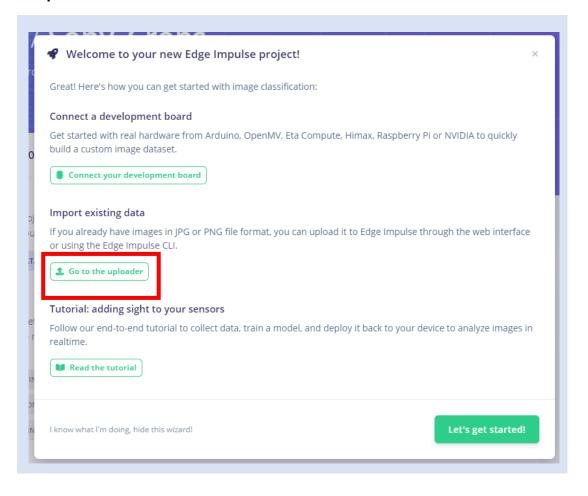
Step 4 – Select the Images Option in the new project



Step 5 – Select Classify a single object (image classification)

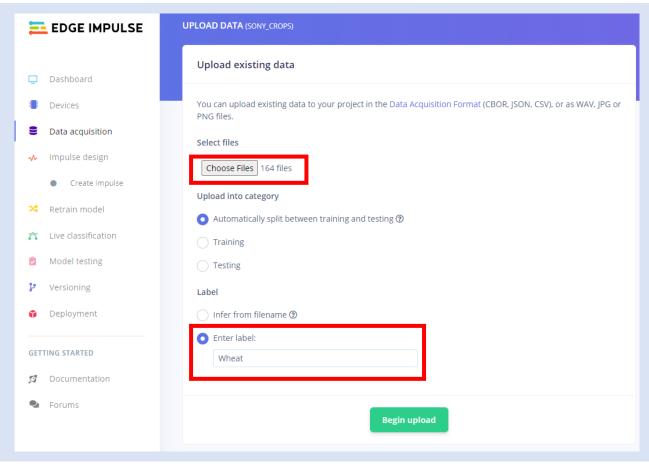


Step 6 – Select Go to the Uploader

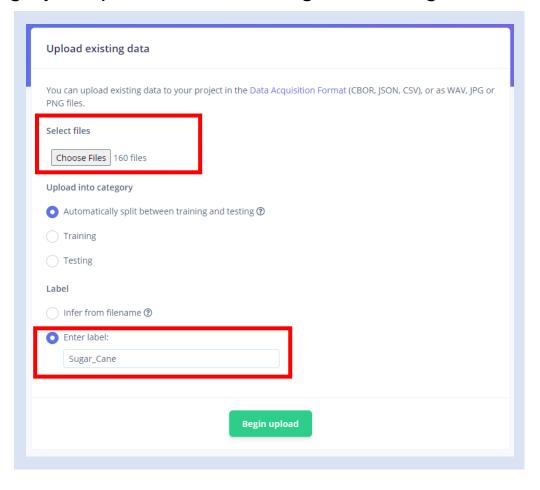


Step 7 – In the uploader, choose the all the wheat pictures from directory archive\kag2\wheat from the Kaggle data set. Leave the upload category to split between training and testing, enter the label

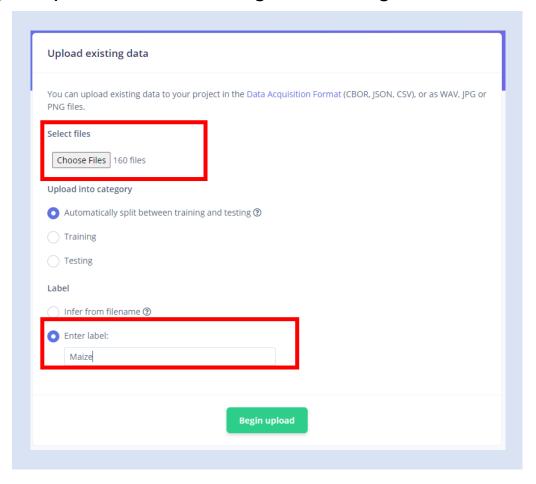
wheat.



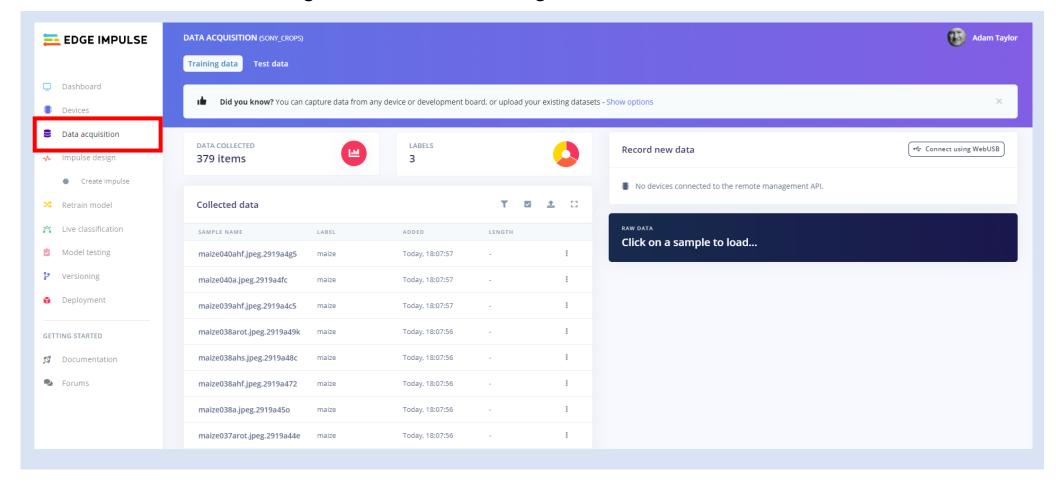
Step 8 – Upload the Sugar Cane images from directory archive\kag2\sugarcane from the Kaggle data set. Leave the upload category to split between training and testing, enter the label wheat.



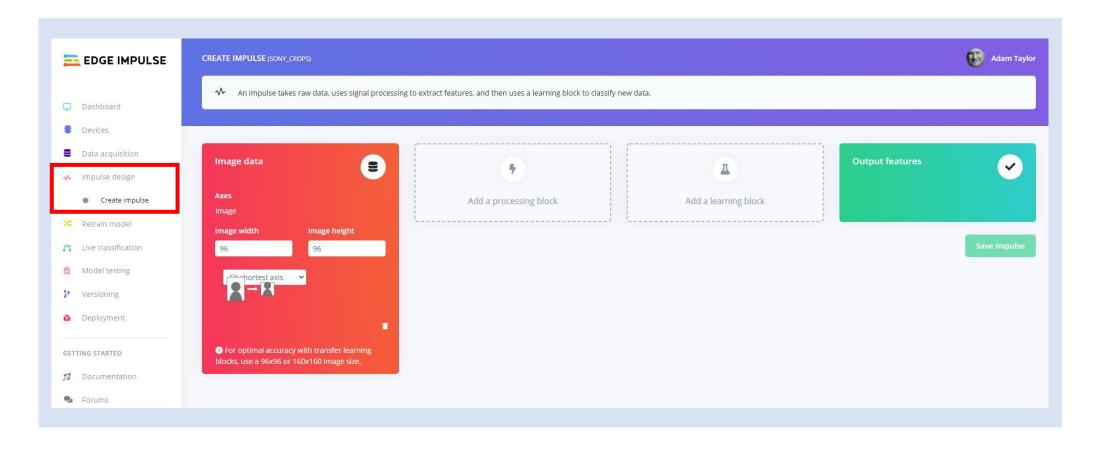
Step 9 – Upload the Sugar Cane images from directory archive\kag2\maize from the Kaggle data set. Leave the upload category to split between training and testing, enter the label wheat.



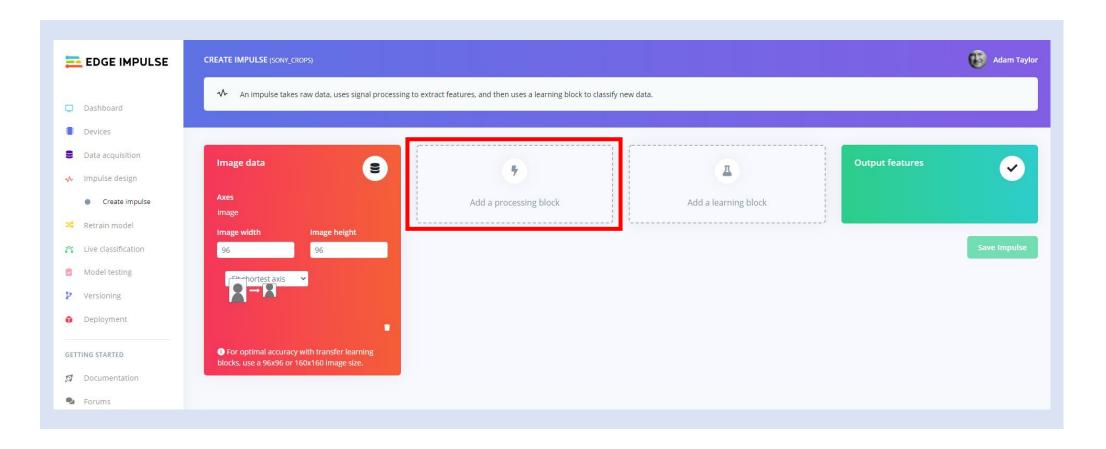
Step 10 – Click on Data acquisition and note the number of data elements, you should have three labels and there should be images under both training and test data



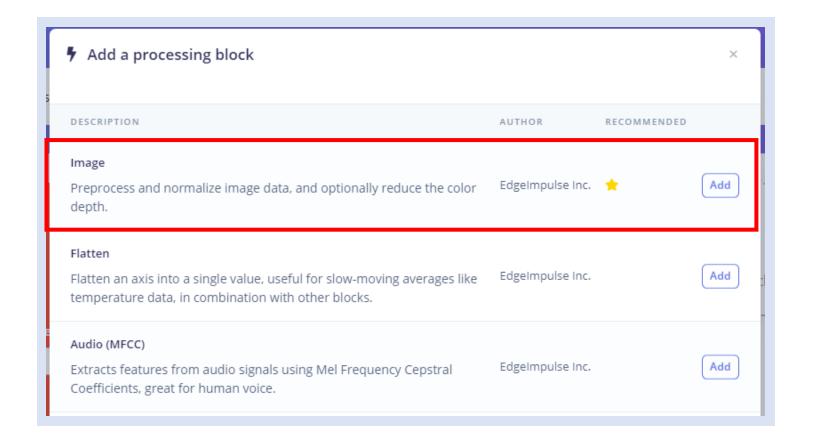
Step 11 – Click on Impulse Design – Notice the Image data processing is already added into the



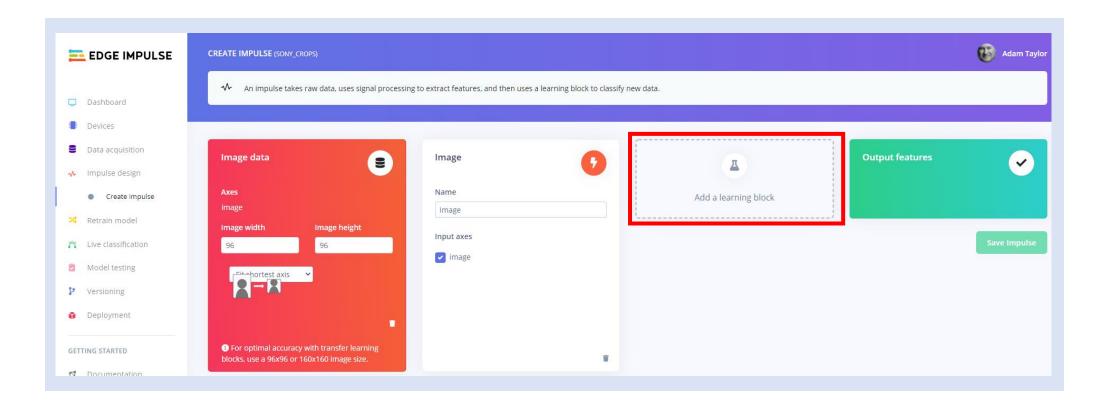
Step 12 – Click on Add a processing block



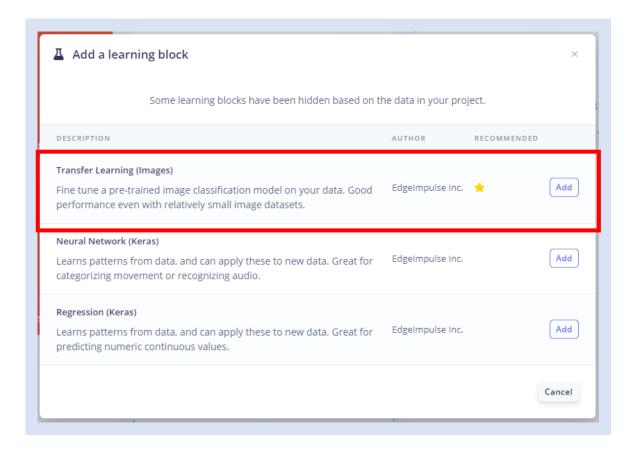
Step 13 – Select Image as the processing block



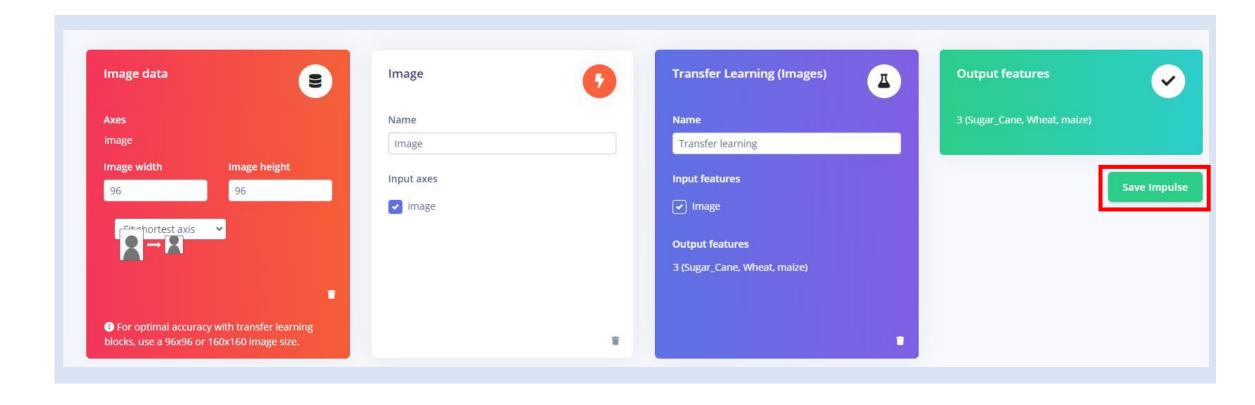
Step 14 – Click on Add a learning block



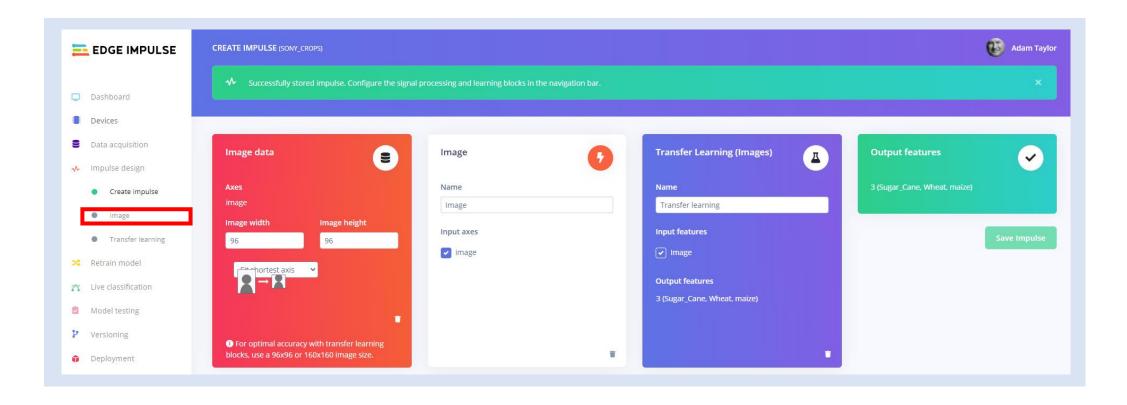
Step 15 – Select Transfer Learning (Images)



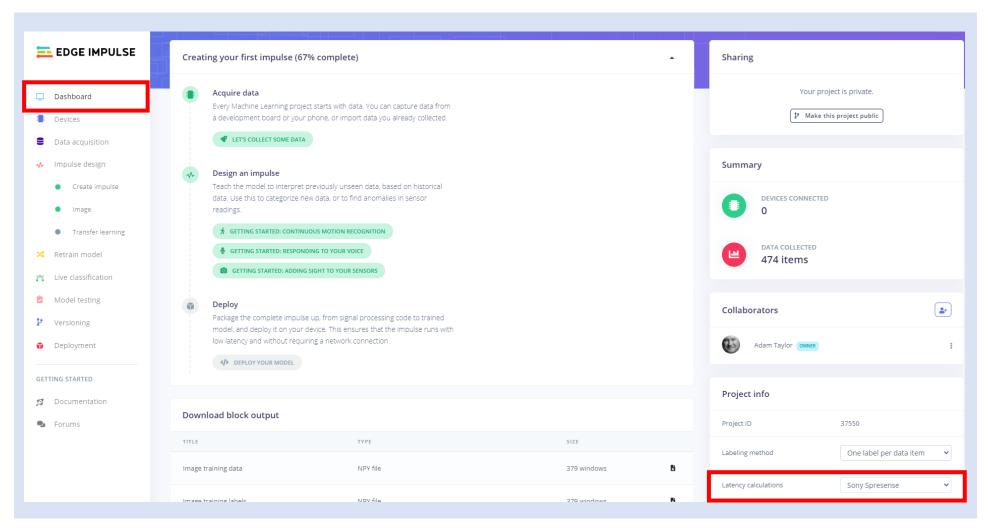
Step 16 – Click on Save Impulse



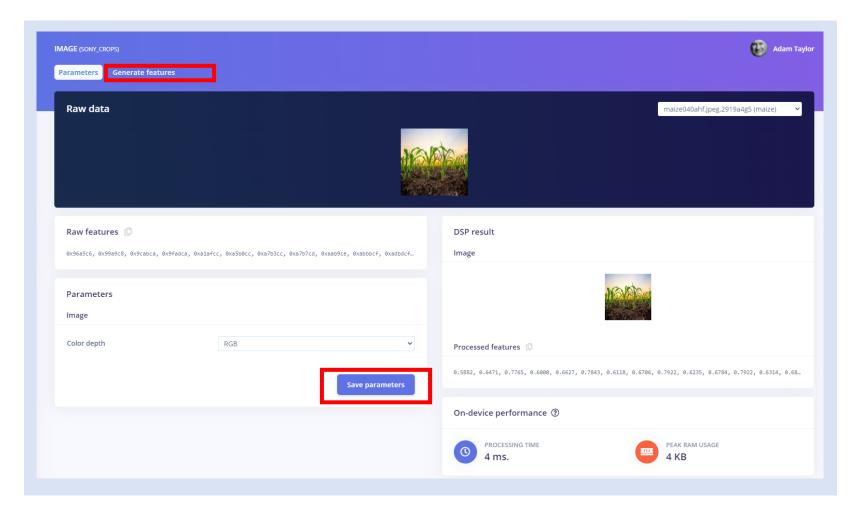
Step 17 – Click on Save Impulse



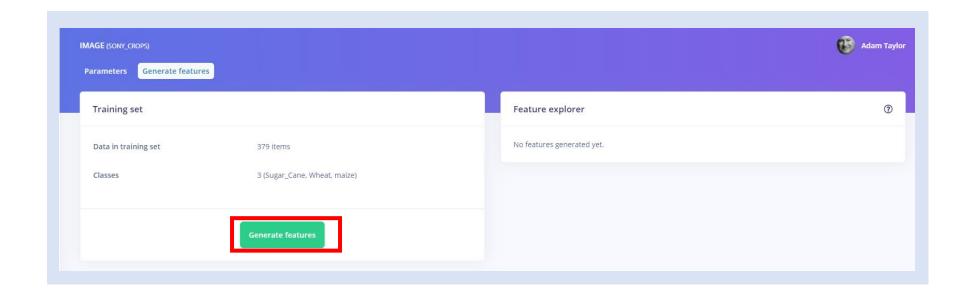
Step 18 - Select Dashboard and then change the latency calculation to Sony Spresense



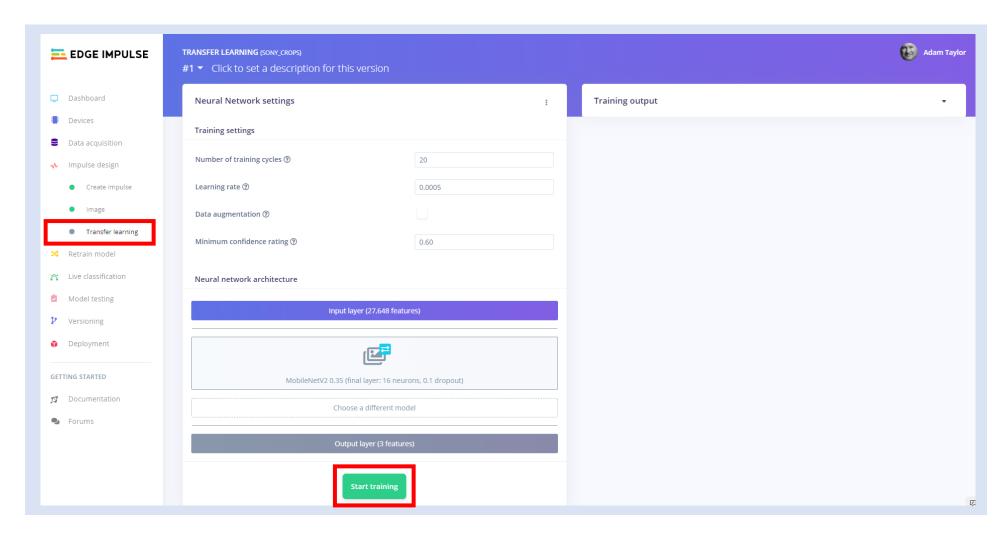
Step 19 – Click save parameters and then select Generate features



Step 20 – Click Generate features

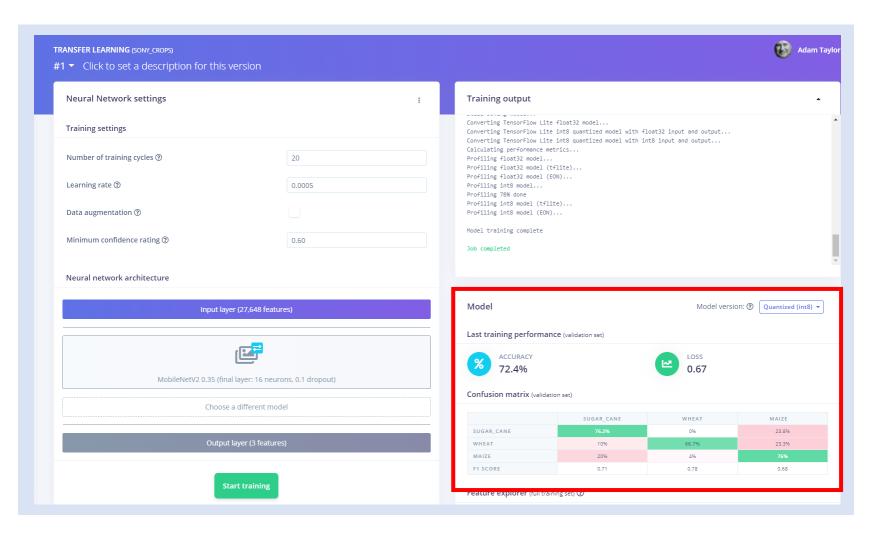


Step 21 - Click on Transfer learning and then Start training

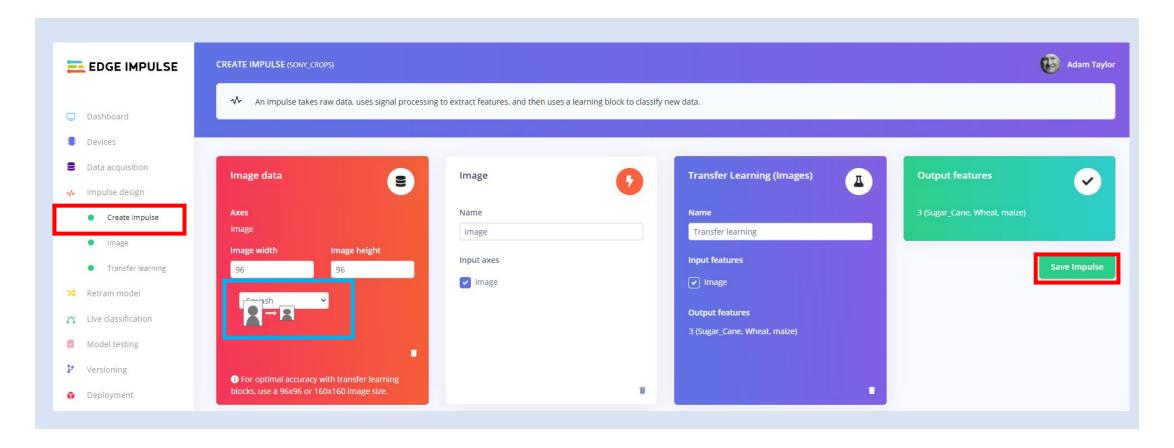


Step 22 - Note the 72% accuracy - This is not acceptable so now we will need to optimize the

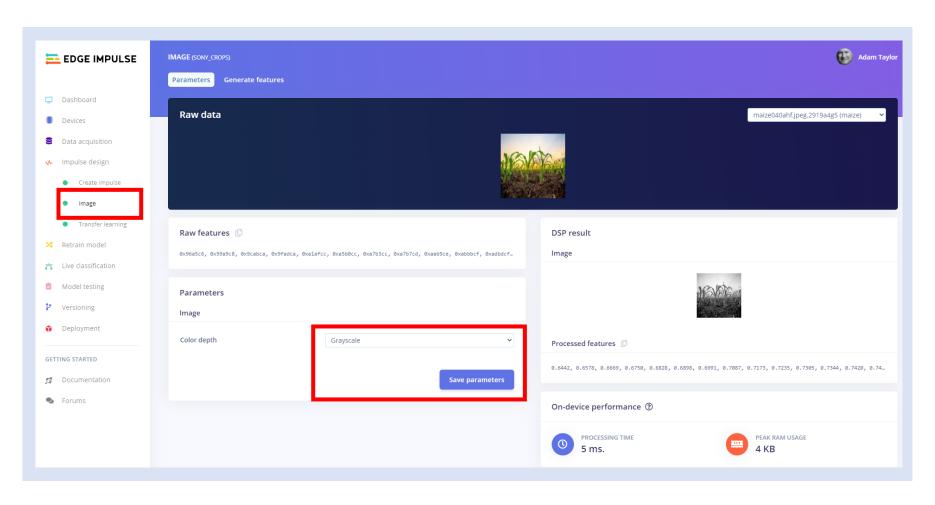
solution



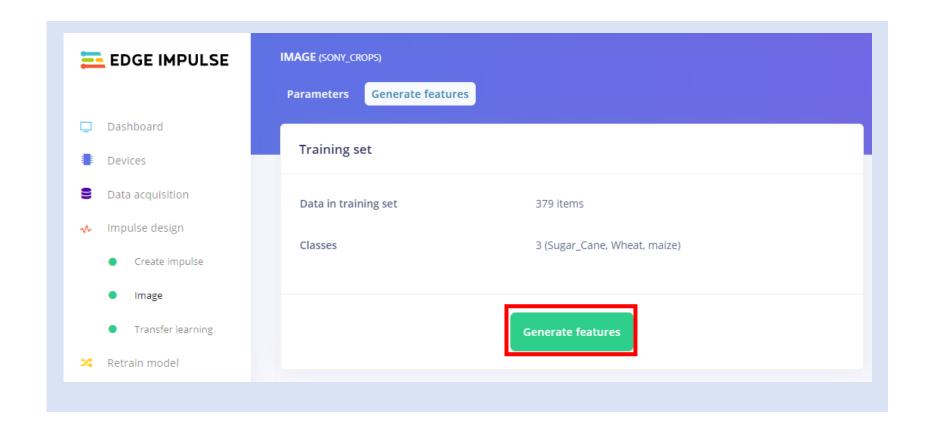
Step 23 – Click on Create impulse and then change the image data from fit shortest axis to squash, save the impulse



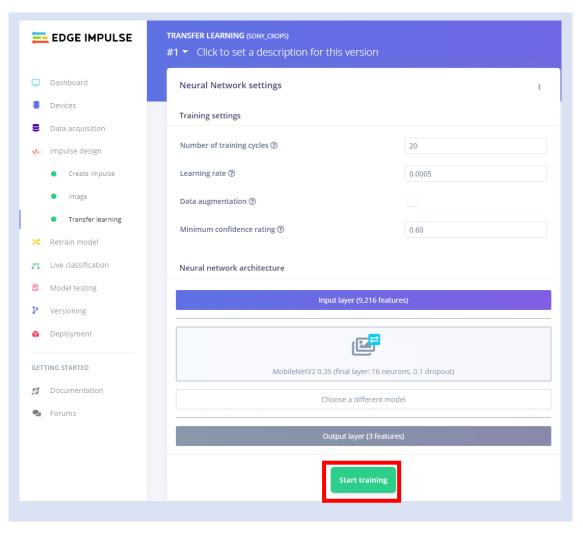
Step 24 – Click on Image and change the color depth from RGB to GreyScale, save parameters



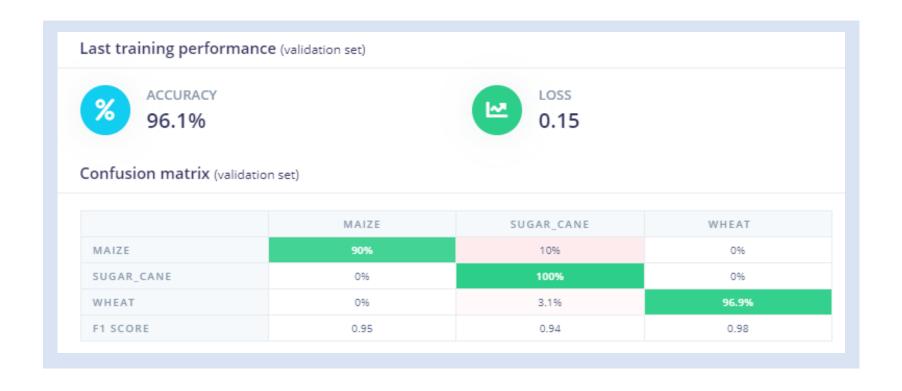
Step 25 – Click on Generate features



Step 26 - Rerun the training of the Transfer Learning, click on Start training



Step 27 - Rerun the training of the Transfer Learning, click on Start training



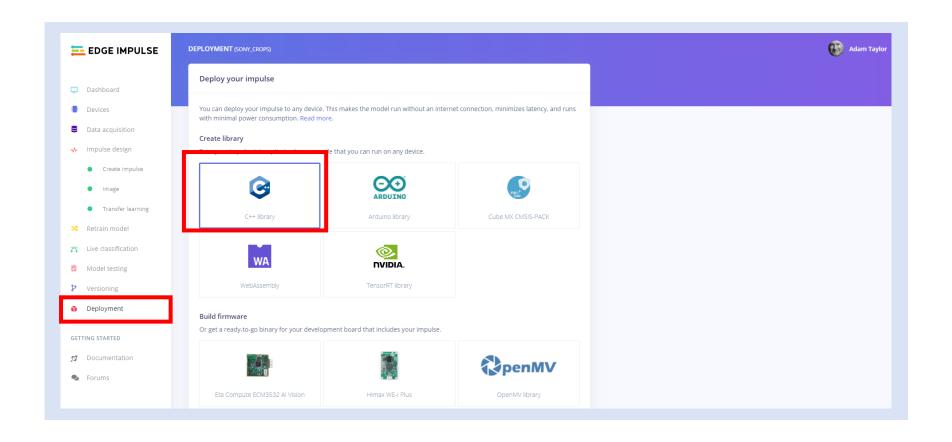
Lab Testing on the board

Step 1 – Clone the repository at

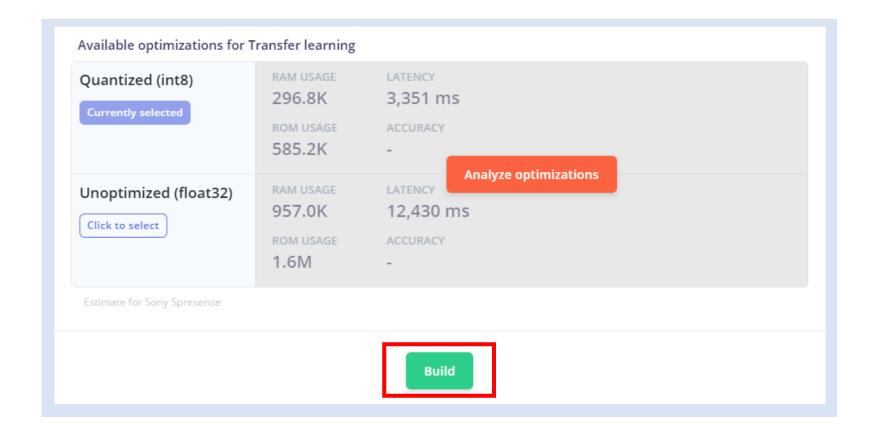
https://github.com/edgeimpulse/example-standalone-inferencing-spresense

```
MINGW64:/c/Users/aptay/Documents/Ei_sony
aptay@DESKTOP-L30MJC1 MINGW64 ~/Documents/Ei_sony
$ git clone https://github.com/edgeimpulse/example-standalone-inferencing-spresense
Cloning into 'example-standalone-inferencing-spresense'...
remote: Enumerating objects: 2647, done.
remote: Counting objects: 100% (2647/2647), done.
remote: Compressing objects: 100% (1554/1554), done.
remote: Total 2647 (delta 1147), reused 2506 (delta 1017), pack-reused 0
Receiving objects: 100% (2647/2647), 8.36 MiB | 4.16 MiB/s, done.
Resolving deltas: 100% (1147/1147), done.
aptay@DESKTOP-L30MJC1 MINGW64 ~/Documents/Ei_sony
```

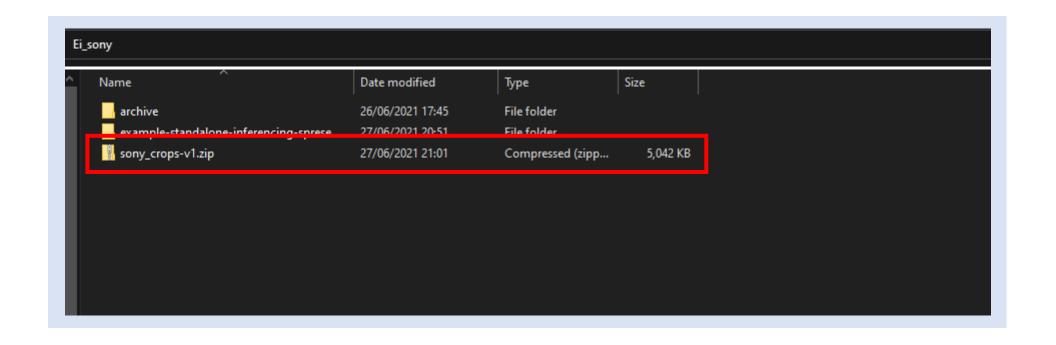
Step 2 - Click on the Deployment menu and select C++ library



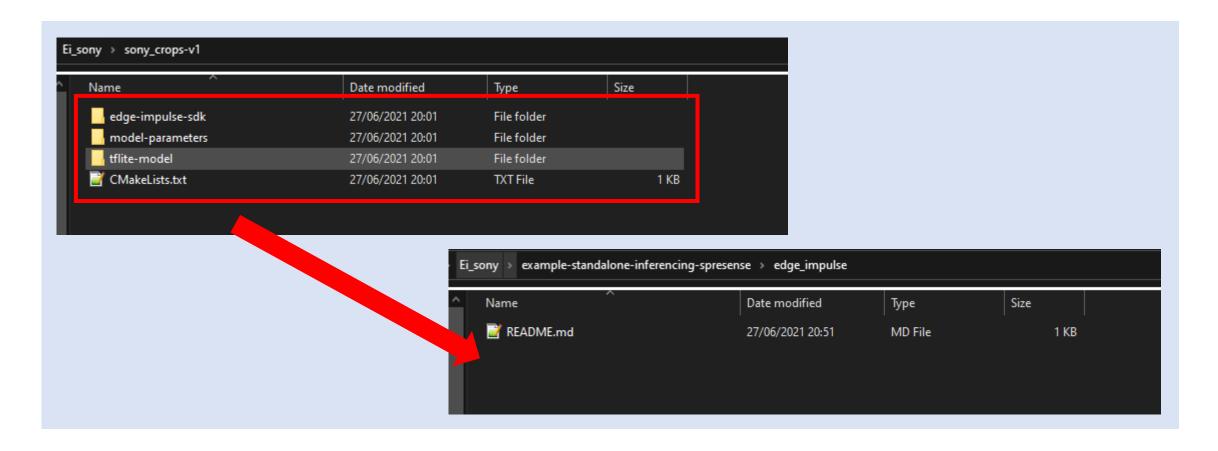
Step 3 – Click on build and save the zip file in the same directory as the recently cloned repository



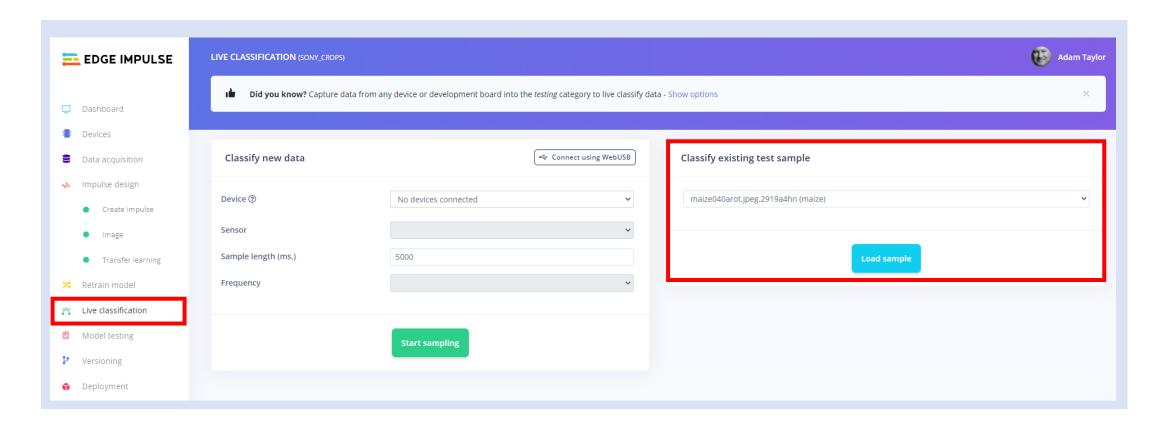
Step 4 – Unzip the compressed file just downloaded



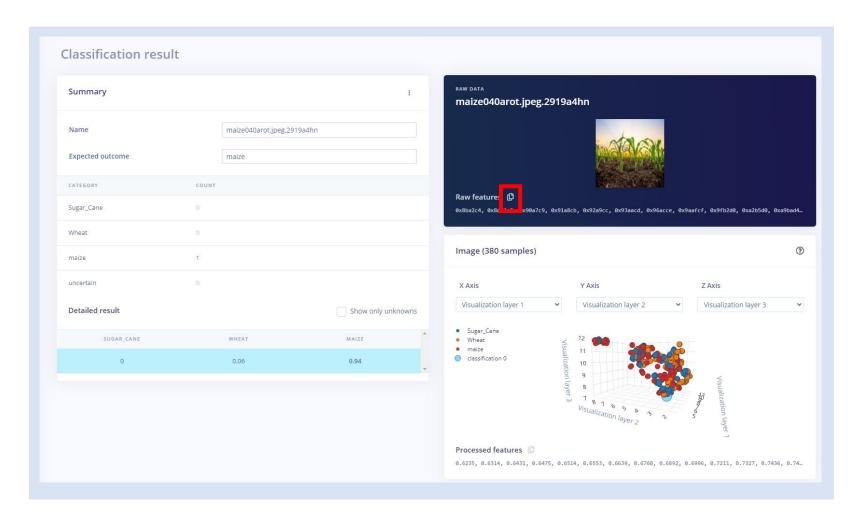
Step 5 – Copy the extracted files from sony_crops-v1 to example-standalone-inferencing-spresense\edge_impulse



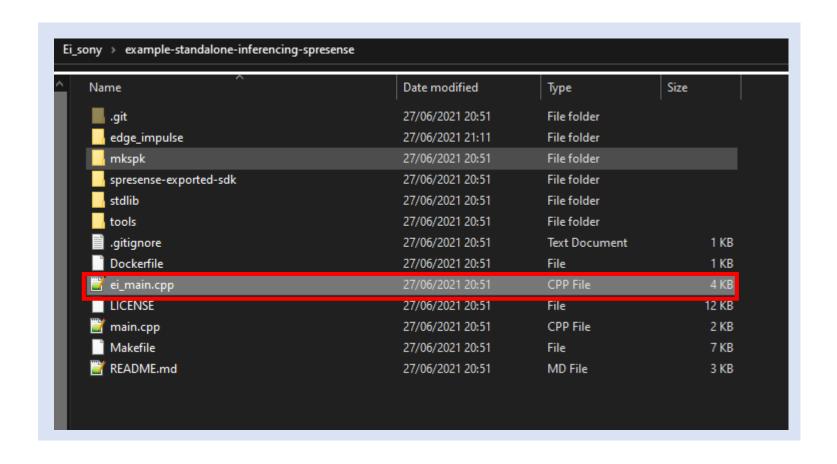
Step 6 – Click on live classification and select the sample you wish to classify – select load sample



Step 7 - Click to copy the raw features to the clipboard



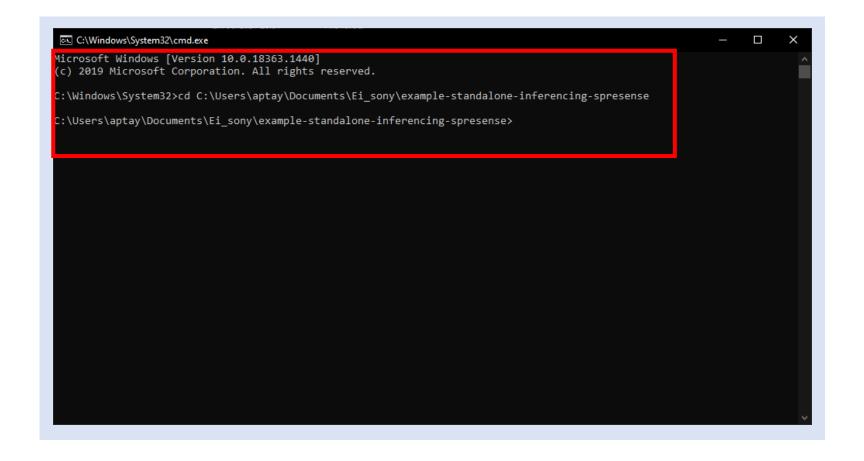
Step 8 – Open the file ei_main.cpp which is in the top level of the cloned repository



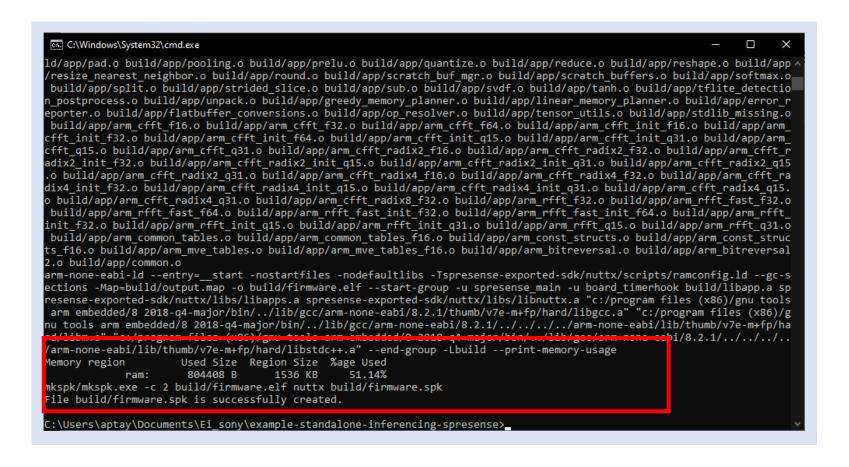
Step 9 - Copy the data in on line 21 and click save, and close the file

```
*C:\Users\aptay\Documents\Ei_sony\example-standalone-inferencing-spresense\ei_main.cpp - Notepad++
File Edit Search View Encoding Language Settings Tools Macro Run Plugins Window ?
* Copyright (c) 2021 EdgeImpulse Inc.
         * Permission is hereby granted, free of charge, to any person obtaining a copy
          * of this software and associated documentation files (the "Software"), to deal
          * in the Software without restriction, including without limitation the rights
          to use, copy, modify, merge, publish, distribute, sublicense, and/or sell
          copies of the Software, and to permit persons to whom the Software is
         * furnished to do so, subject to the following conditions:
         * The above copyright notice and this permission notice shall be included in
         * all copies or substantial portions of the Software.
          * THE SOFTWARE IS PROVIDED "AS IS", WITHOUT WARRANTY OF ANY KIND, EXPRESS OR
          * IMPLIED, INCLUDING BUT NOT LIMITED TO THE WARRANTIES OF MERCHANTABILITY.
          * FITNESS FOR A PARTICULAR PURPOSE AND NONINFRINGEMENT. IN NO EVENT SHALL THE
          * AUTHORS OR COPYRIGHT HOLDERS BE LIABLE FOR ANY CLAIM, DAMAGES OR OTHER
          * LIABILITY, WHETHER IN AN ACTION OF CONTRACT, TORT OR OTHERWISE, ARISING FROM
         * SOFTWARE.
        /* Include ----
        #include "ei_run_classifier.h"
      int raw_feature_get_data(size_t offset, size_t length, float *out_ptr) {
            memcpy(out_ptr, features + offset, length * sizeof(float));
           ei_printf("Edge Impulse standalone inferencing (Sony Spresense)\n");
           if (sizeof(features) / sizeof(float) != EI_CLASSIFIER_DSP_INPUT_FRAME_SIZE) (
                                                                   correct. Expected %d items, but had %u\n",
                   EI_CLASSIFIER_DSP_INPUT_FRAME_SIZE, sizeof(features) / sizeof(float));
            ei_impulse_result_t result = { 0 };
                // the features are stored into flash, and we don't want to load everything into RAM
                signal t features signal;
                features_signal.total_length = sizeof(features) / sizeof(features[0]);
               features_signal.get_data = &raw_feature_get_data;
               EI_IMPULSE_ERROR res = run_classifier(&features_signal, &result, true);
               ei printf("run classifier returned: %d\n". res);
                if (res != 0) return 1;
                ei printf("Predictions (DSP: %d ms., Classification: %d ms., Anomaly: %d ms.): \n",
                    result.timing.dsp, result.timing.classification, result.timing.anomaly);
                                                                                                                                                                 length: 95,227 lines: 85
                                                                                                                                                                                            Ln:29 Col:5 Sel:0|0
                                                                                                                                                                                                                                Windows (CR LF) UTF-8
```

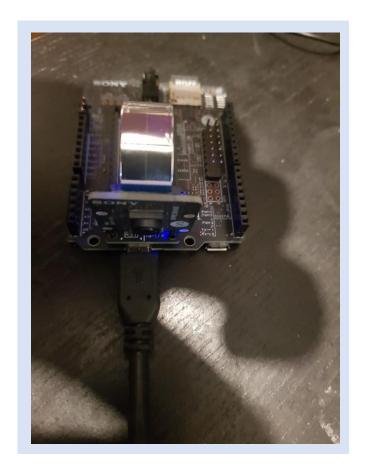
Step 10 – Open a command window and change directory into the top level of the cloned repository



Step 11 – Enter the command make –j if you so not see the output below run the command again



Step 12 – Connect the Sony Spresense to your development machine



Step 13 – Enter the command make flash this will flash the application to the Spresense

```
C:\Users\aptay\Documents\Ei sony\example-standalone-inferencing-spresense>make flash
tools/flash writer.py -s -d -b 115200 -n build/firmware.spk
₽7₽[119;1H₽[JÐ8
@[A@[K@(B@[m[@[33m?@(B@[m]@(B@[m Select your device: COM3 - Silicon Labs CP210x USB to UART Bridge (COM3)
□[34m> COM3 - Silicon Labs CP210x USB to UART Bridge (COM3) □(B□[m□[K
Using device COM3
>>> Install files ...
install -b 115200
Install build/firmware.spk
776368 bytes loaded.
Package validation is OK.
Saving package to "nuttx"
updater# sync
updater# Restarting the board ...
reboot
C:\Users\aptay\Documents\Ei_sony\example-standalone-inferencing-spresense>
```

Step 14 - In the command window enter the command edge-impulse-run-impulse --raw

```
C:\Windows\System32\cmd.exe - edge-impulse-run-impulse --raw
 :\Users\aptay\Documents\Ei_sony\example-standalone-inferencing-spresense>edge-impulse-run-impulse --raw
   N: You're running an outdated version of the Edge Impulse CLI tools
      Upgrade via `npm update -g edge-impulse-cli`
 SER] Connecting to COM3
Edge Impulse standalone inferencing (Sony Spresense)
Features (60 ms.): 0.623529 0.631372 0.643137 0.647058 0.650980 0.654902 0.662745 0.674509 0.690196 0.698039 0.721568 0.
733333 0.745098 0.745098 0.752941 0.760784 0.768627 0.780392 0.784313 0.792156 0.792156 0.796078 0.800000 0.803921 0.803
921 0.807843 0.811764 0.827451 0.835294 0.839215 0.839215 0.847058 0.854902 0.858823 0.862745 0.862745 0.870588 0.866666
0.866666 0.866666 0.866666 0.862745 0.862745 0.862745 0.862745 0.862745 0.862745 0.862745 0.858823 0.854902 0.850980 0.
850980 0.850980 0.847058 0.847058 0.843137 0.843137 0.843137 0.847058 0.843137 0.843137 0.839215 0.835294 0.831372 0.823
<u>529 0.823529 0.815686 0.811764</u> 0.807843 0.807843 0.803921 0.796078 0.796078 0.792156 0.788235 0.780392 0.776470 0.764706
0.760784 0.756862 0.752941 0.749019 0.745098 0.737254 0.733333 0.725490 0.717647 0.709803 0.701960 0.690196 0.686274 0.
678431 0.666666 0.662745 0.647058 0.639215 0.635294 0.643137 0.654902 0.654902 0.658823 0.662745 0.670588 0.682353 0.694
117 0.705882 0.717647 0.733333 0.749019 0.752941 0.756862 0.764706 0.772549 0.788235 0.788235 0.796078 0.796078 0.800000
0.807843 0.811764 0.811764 0.815686 0.819607 0.835294 0.839215 0.843137 0.850980 0.854902 0.862745 0.866666 0.870588 0.
870588 0.874509 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588
745 0.862745 0.858823 0.854902 0.858823 0.854902 0.850980 0.847058 0.850980 0.850980 0.850980 0.847058 0.847058
0.843137 0.839215 0.831372 0.831372 0.823529 0.819607 0.815686 0.815686 0.811764 0.807843 0.811764 0.803921 0.796078 0.
788235 0.784313 0.776470 0.768627 0.764706 0.760784 0.756862 0.749019 0.745098 0.737254 0.733333 0.725490 0.717647 0.705
882 0.698039 0.690196 0.682353 0.678431 0.666666 0.650980 0.643137 0.647058 0.654902 0.666666 0.666666 0.670588 0.678431
0.682353 0.690196 0.701960 0.709803 0.717647 0.733333 0.752941 0.764706 0.764706 0.776470 0.780392 0.792156 0.800000 0.
800000 0.807843 0.811764 0.811764 0.819607 0.819607 0.823529 0.827451 0.839215 0.843137 0.850980 0.854902 0.858823 0.870
588 0.874509 0.878431 0.878431 0.882353 0.882353 0.882353 0.882353 0.882353 0.878431 0.878431 0.878431 0.878431 0.878431
854902 0.847058 0.854902 0.854902 0.847058 0.843137 0.839215 0.831372 0.823529 0.823529 0.819607 0.815686 0.815686 0.815
686 0.807843 0.800000 0.796078 0.796078 0.788235 0.780392 0.772549 0.768627 0.764706 0.756862 0.752941 0.745098 0.741176
0.729411 0.721568 0.717647 0.705882 0.698039 0.690196 0.682353 0.674509 0.658823 0.654902 0.654902 0.662745 0.670588 0.
```

Step 15 – Scroll down the processing results and you will see the classification, press cntrl-c to stop the application – compare this with the predicted accuracy of the model

```
C:\Windows\System32\cmd.exe - edge-impulse-run-impulse --raw
035294 0.078431 0.035294 0.031372 0.070588
Predictions (time: 3844 ms.):
Wheat: 0.039062
maize: 0.960937
Predictions (DSP: 60 ms., Classification: 3844 ms., Anomaly: 0 ms.):
Features (60 ms.): 0.623529 0.631372 0.643137 0.647058 0.650980 0.654902 0.662745 0.674509 0.690196 0.698039 0.721568 0
921 0.807843 0.811764 0.827451 0.835294 0.839215 0.839215 0.847058 0.854902 0.858823 0.862745 0.862745 0.870588 0.866666
0.866666 0.866666 0.866666 0.862745 0.862745 0.862745 0.862745 0.862745 0.862745 0.862745 0.858823 0.854902 0.850980 0.
529 0.823529 0.815686 0.811764 0.807843 0.807843 0.803921 0.796078 0.796078 0.792156 0.788235 0.780392 0.776470 0.764706
678431 0.666666 0.662745 0.647058 0.639215 0.635294 0.643137 0.654902 0.654902 0.658823 0.662745 0.670588 0.682353 0.694
117 0.705882 0.717647 0.733333 0.749019 0.752941 0.756862 0.764706 0.772549 0.788235 0.788235 0.796078 0.796078 0.800000
870588 0.874509 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588 0.870588
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788235 0.784313 0.776470 0.768627 0.764706 0.760784 0.756862 0.749019 0.745098 0.737254 0.733333 0.725490 0.717647 0.705
<u>588 0.874509 0.878431 0.878431</u> 0.882353 0.882353 0.882353 0.882353 0.882353 0.878431 0.878431 0.878431 0.878431 0.878431 0.878431
0.878431 0.878431 0.874509 0.874509 0.870588 0.866666 0.866666 0.862745 0.858823 0.862745 0.862745 0.862745 0.858823 0.
686 0.807843 0.800000 0.796078 0.796078 0.788235 0.780392 0.772549 0.768627 0.764706 0.756862 0.752941 0.745098 0.741176
0.729411 0.721568 0.717647 0.705882 0.698039 0.690196 0.682353 0.674509 0.658823 0.654902 0.654902 0.662745 0.670588 0.
```