



國立雲林科技大學
電子工程系
Department of Electronic Engineering

教育部補助AI應用領域系列課程-人工智慧計算晶片設計和應用人才培育

LAB4-Lenet、EdgeTPU

國立雲林科技大學

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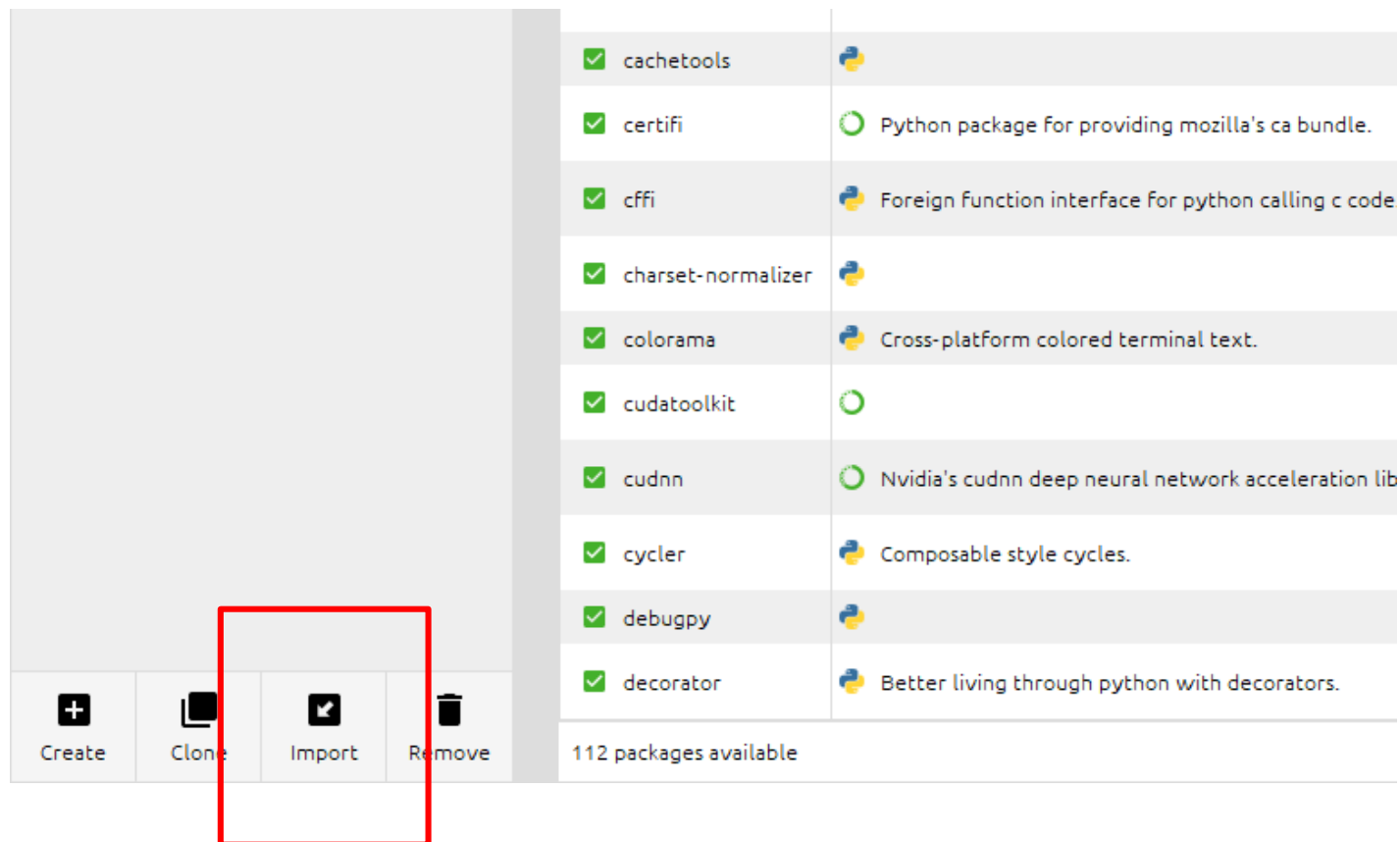


YunTech 國立雲林科技大學
National Yunlin University of Science & Technology





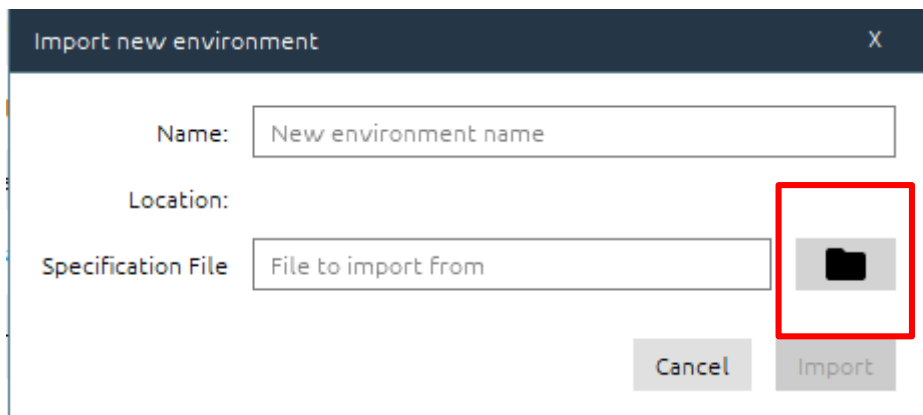
Import library



- 匯入環境



Import library



lenet.yml

- 匯入環境，至雲端硬碟下載





Import library

```
import tensorflow as tf  
import numpy as np
```

```
tf.__version__
```

```
'1.15.0'
```

- cudnn==7.6.5
- cudatoolkit==10.0.130





參數設定

```
num_class = 10  
batch_size = 2048  
epochs = 100  
iterations = 30
```





iterations

- iterations (迭代) : 每一次迭代都是一次權重更新，每一次權重更新需要batch_size個數據進行Forward運算得到損失函式，再BP演算法更新引數。1個iteration等於使用 batchsize個樣本訓練一次。
- 具體的計算公式為：
$$\text{one epoch} = \text{numbers of iterations} = N = \frac{\text{訓練樣本的數量}}{\text{batch_size}}$$





dataset

```
(x_train, y_train), (x_test, y_test) = tf.keras.datasets.mnist.load_data()
```

Loads the MNIST dataset

https://www.tensorflow.org/api_docs/python/tf/keras/datasets/mnist/load_data





資料處理

```
x_train = x_train / 255
x_test = x_test / 255
x_train = x_train.astype('float32')
x_test = x_test.astype('float32')
x_train = np.reshape(x_train, (x_train.shape[0], x_train.shape[1], x_train.shape[2], 1)) #(60000,28,28,1)
x_test = np.reshape(x_test, (x_test.shape[0], x_test.shape[1], x_test.shape[2], 1)) #(10000, 28, 28, 1)
y_train = tf.keras.utils.to_categorical(y_train, 10)
y_test = tf.keras.utils.to_categorical(y_test, 10)
```





函式

- **astype()**

對資料類別進行轉換

- **np.reshape()**

將資料原來的尺寸更改為我們想要的尺寸





定義convolution

```
def conv(x, filters, size):  
    return tf.keras.layers.Conv2D(filters=filters, kernel_size=size)(x)
```





函式

- **tf.keras.layers.Conv2D()**

2D convolution layer (e.g. spatial convolution over images)

https://www.tensorflow.org/api_docs/python/tf/keras/layers/Conv2D





定義pooling層

```
def maxpooling(x):  
    return tf.keras.layers.MaxPooling2D(padding='same', strides=2)(x)
```





函式

- **tf.keras.layers.MaxPooling2D**

Max pooling operation for 2D spatial data.

https://www.tensorflow.org/api_docs/python/tf/keras/layers/MaxPool2D





定義 Model

```
def lenet(x):  
    x = conv(x, 6, (5, 5))  
    x = maxpooling(x)  
    x = conv(x, 16, (5, 5))  
    x = maxpooling(x)  
    x = tf.keras.layers.Flatten()(x)  
    x = tf.keras.layers.Dense(120)(x)  
    x = tf.keras.layers.Dense(84)(x)  
    x = tf.keras.layers.Dense(10, activation='softmax')(x)  
    return x
```





函式

- **tf.keras.layers.Flatten**

Flattens the input. Does not affect the batch size.

https://www.tensorflow.org/api_docs/python/tf/keras/layers/Flatten





定義Model架構

```
img_input = tf.keras.Input(shape=(28,28,1))  
output = lenet(img_input)  
model = tf.keras.Model(img_input,output)
```





可視化Model架構

```
model.summary()
```

Model: "functional_1"

Layer (type)	Output Shape	Param #
=====		
input_1 (InputLayer)	[(None, 28, 28, 1)]	0
conv2d (Conv2D)	(None, 24, 24, 6)	156
max_pooling2d (MaxPooling2D)	(None, 12, 12, 6)	0
conv2d_1 (Conv2D)	(None, 8, 8, 16)	2416
max_pooling2d_1 (MaxPooling2D)	(None, 4, 4, 16)	0
flatten (Flatten)	(None, 256)	0
dense (Dense)	(None, 120)	30840
dense_1 (Dense)	(None, 84)	10164
dense_2 (Dense)	(None, 10)	850
=====		
Total params: 44,426		
Trainable params: 44,426		
Non-trainable params: 0		





LOSS與優化器

```
sgd = tf.keras.optimizers.SGD(learning_rate=0.01)  
model.compile(optimizer=sgd, loss='categorical_crossentropy', metrics=['acc'])
```





函式

- **tf.keras.optimizers.SGD**

Gradient descent (with momentum) optimizer.

https://www.tensorflow.org/api_docs/python/tf/keras/optimizers/SGD





訓練

```
history = model.fit(x=x_train,y=y_train,batch_size=batch_size,epochs=epochs,steps_per_epoch=iterations,validation_data=(x_test, y_test))
```





成果

```
Epoch 91/100
30/30 [=====] - 0s 10ms/step - loss: 0.1116 - accuracy: 0.9666 - val_loss: 0.1056 - val_accuracy: 0.9670
Epoch 92/100
30/30 [=====] - 0s 8ms/step - loss: 0.1107 - accuracy: 0.9666 - val_loss: 0.1052 - val_accuracy: 0.9681
Epoch 93/100
30/30 [=====] - 0s 10ms/step - loss: 0.1102 - accuracy: 0.9672 - val_loss: 0.1059 - val_accuracy: 0.9680
Epoch 94/100
30/30 [=====] - 0s 9ms/step - loss: 0.1093 - accuracy: 0.9670 - val_loss: 0.1051 - val_accuracy: 0.9681
Epoch 95/100
30/30 [=====] - 0s 9ms/step - loss: 0.1087 - accuracy: 0.9677 - val_loss: 0.1026 - val_accuracy: 0.9687
Epoch 96/100
30/30 [=====] - 0s 9ms/step - loss: 0.1077 - accuracy: 0.9680 - val_loss: 0.1022 - val_accuracy: 0.9700
Epoch 97/100
30/30 [=====] - 0s 9ms/step - loss: 0.1072 - accuracy: 0.9682 - val_loss: 0.1011 - val_accuracy: 0.9681
Epoch 98/100
30/30 [=====] - 0s 9ms/step - loss: 0.1066 - accuracy: 0.9681 - val_loss: 0.1027 - val_accuracy: 0.9678
Epoch 99/100
30/30 [=====] - 0s 9ms/step - loss: 0.1056 - accuracy: 0.9683 - val_loss: 0.1017 - val_accuracy: 0.9692
Epoch 100/100
30/30 [=====] - 0s 9ms/step - loss: 0.1050 - accuracy: 0.9682 - val_loss: 0.0981 - val_accuracy: 0.9703
```





成果圖

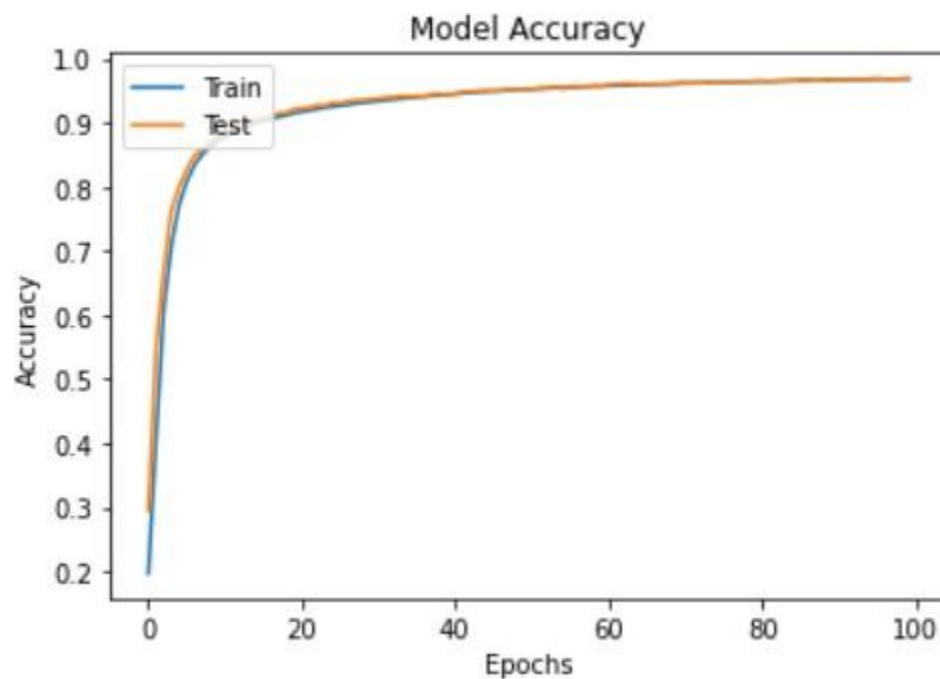
```
import matplotlib.pyplot as plt

plt.plot(history.history['acc'])
plt.plot(history.history['val_acc'])
plt.title('Model Accuracy')
plt.ylabel('Accuracy')
plt.xlabel('Epochs')
plt.legend(['Train', 'Test'], loc='upper left')
plt.show()

plt.plot(history.history['loss'])
plt.plot(history.history['val_loss'])
plt.title('Model Accuracy')
plt.ylabel('Loss')
plt.xlabel('Epochs')
plt.legend(['Train', 'Test'], loc='upper left')
plt.show()
```



成果圖



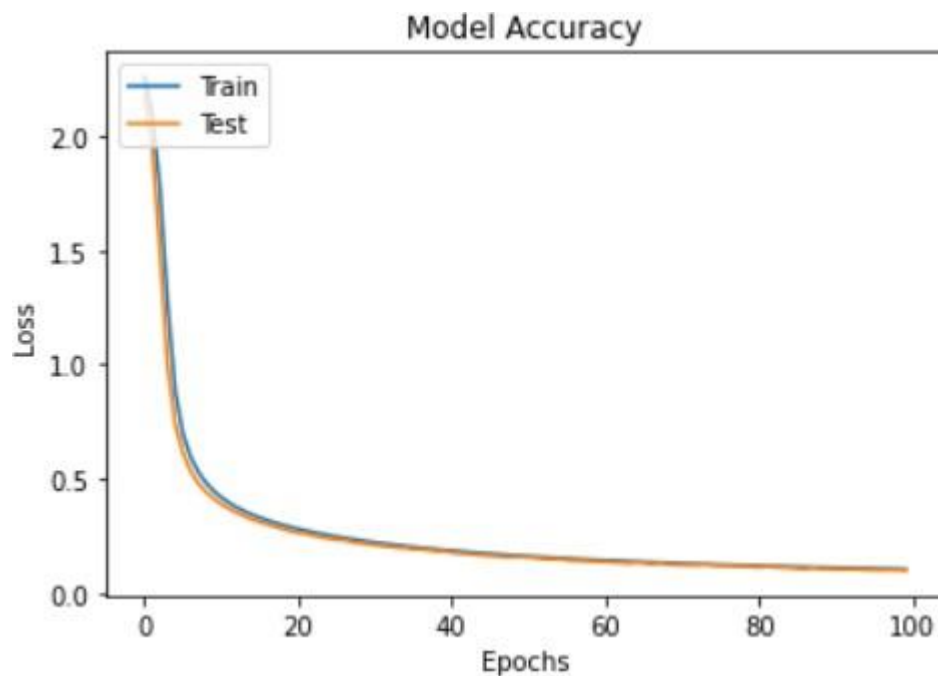


成果圖

```
plt.plot(history.history['loss'])  
plt.plot(history.history['val_loss'])  
plt.title('Model loss')  
plt.ylabel('Loss')  
plt.xlabel('Epoch')  
plt.legend(['Train', 'Test'], loc='upper left')  
plt.show()
```



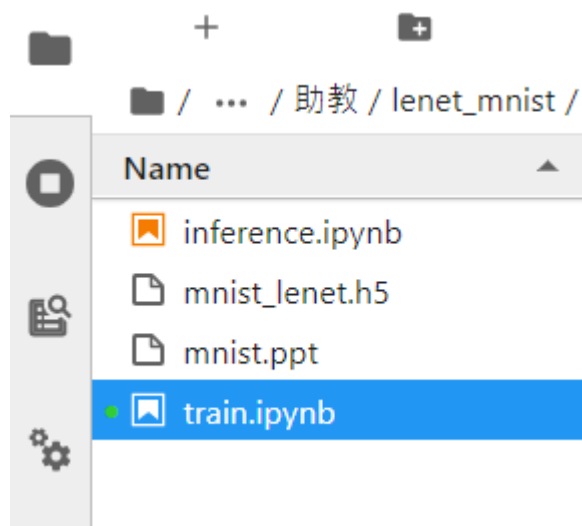
成果圖





儲存model

```
model.save('./mnist_lenet.h5')
```





預測

import

```
import tensorflow as tf  
tf.__version__
```

'2.0.0'

```
import numpy as np  
from PIL import Image  
import matplotlib.pyplot as plt
```

```
import tensorflow as tf  
import numpy as np
```

```
tf.__version__
```

'1.15.0'

```
(lenet) C:\Users\es402>pip install pillow
```

```
(lenet) C:\Users\es402>pip install matplotlib
```





PIL(Pillow)

The Python Imaging Library adds image processing capabilities to your Python interpreter.

This library provides extensive file format support, an efficient internal representation, and fairly powerful image processing capabilities.

The core image library is designed for fast access to data stored in a few basic pixel formats. It should provide a solid foundation for a general image processing tool.

<https://pypi.org/project/Pillow/>





預測

載入model

```
model = tf.keras.models.load_model('./mnist_lenet.h5')
```

如果有錯執行:

```
(lenet) C:\Users\es402>pip install h5py==2.10
```





函式

- `tf.keras.models.load_model()`

Loads a model saved via `model.save()`.

https://www.tensorflow.org/api_docs/python/tf/keras/models/load_model



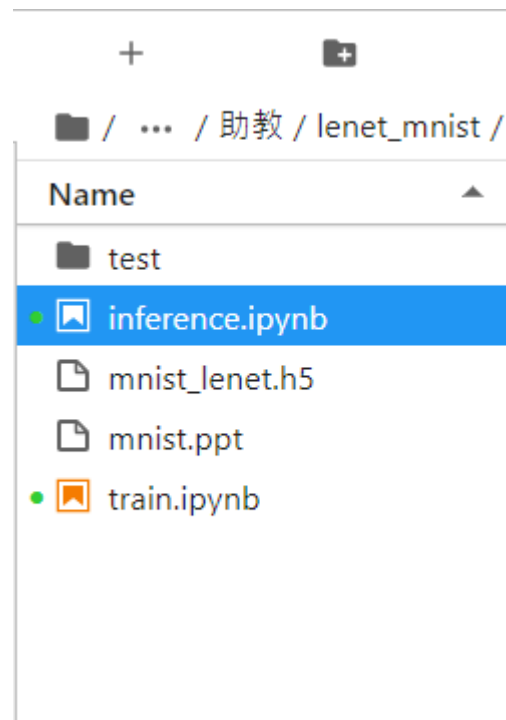
預測

載入預測圖片

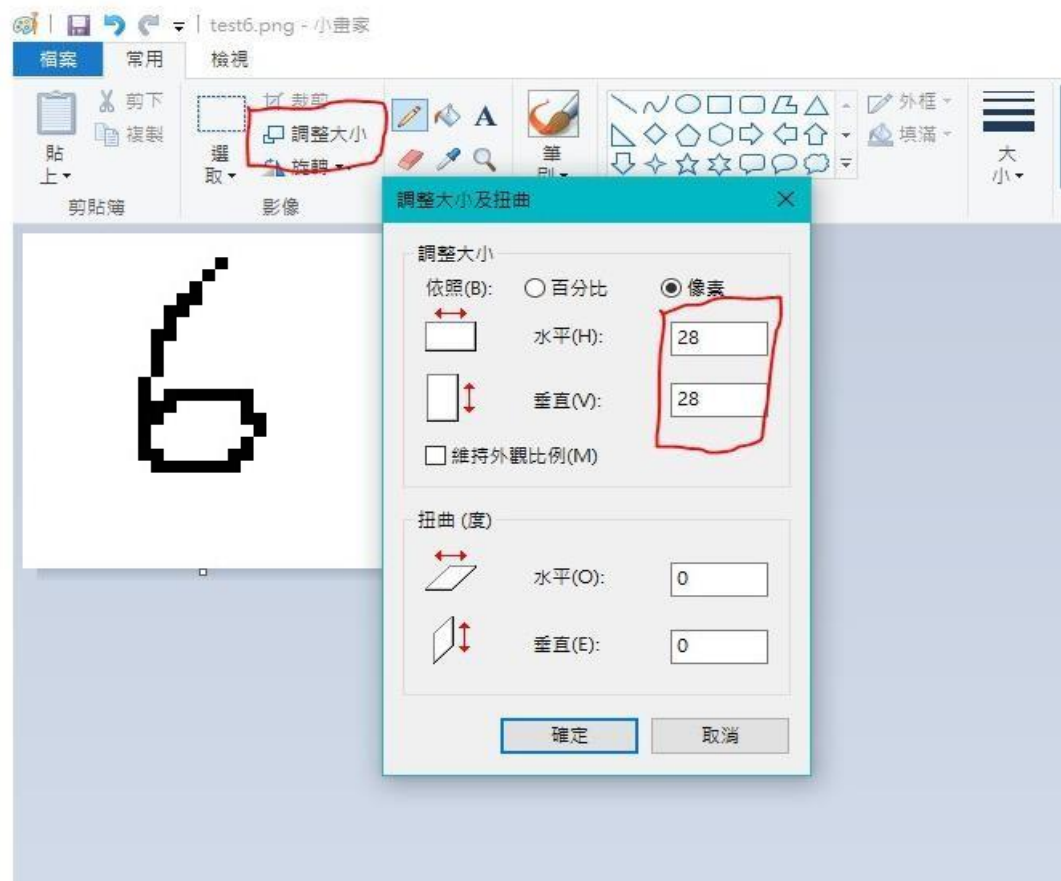
```
img = Image.open('./test/3.png')  
  
plt.figure(figsize=(1,1))  
plt.imshow(img)  
plt.show()
```



預測圖片請各位開啟小畫家手寫



預測





預測

預測圖片前處理

```
img = np.array(img)
```

```
img = np.dot(img[...,:3], [0.299, 0.587, 0.114])
```

```
img = 255-img  
img = img / 255.
```

```
img = np.reshape(img,(1,28,28,1))
```





函式

```
img = np.dot(img[...,:3], [0.299, 0.587, 0.114])
```

基於matplotlib和公式將 RGB 圖轉換為灰度圖，只對文字內容感興趣

$$Y' = 0.299 R + 0.587 G + 0.114 B$$





函式

```
img = 255-img  
img = img / 255.
```

這裡讀入的圖片陣列是 float32 型的，範圍是 0-1，而 PIL.Image 資料是 uint8 型的，範圍是 0-255，所以要進行轉換





預測

預測圖片

```
model.predict(img)
```

```
array([[7.4919909e-03, 2.3622868e-04, 1.3560286e-02, 9.0231025e-01,  
        1.0235576e-03, 3.6447242e-04, 5.5334434e-02, 2.8058883e-05,  
        1.8490007e-02, 1.1606632e-03]], dtype=float32)
```





預測

預測多張圖片

```
file = ['./test/0.png',  
        './test/1.png',  
        './test/2.png',  
        './test/3.png',  
        './test/4.png',  
        './test/5.png',  
        './test/6.png',  
        './test/7.png',  
        './test/8.png',  
        './test/9.png']  
  
for f in file:  
    img = Image.open(f)  
    plt.figure(figsize=(1,1))  
    plt.imshow(img)  
    plt.show()  
    img = np.array(img)  
    img = np.dot(img[...,:3], [0.299, 0.587, 0.114])  
    img = 255-img  
    img = img / 255.  
    img = np.reshape(img,(1,28,28,1))  
    model.predict(img)  
    print(np.argmax(model.predict(img)))  
    print("-----")
```

- 將手寫圖片放入”test”資料夾





函式

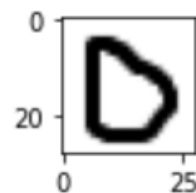
- `plt.figure(figsize=(float,float))` 寬度,高度 (以英寸為單位)

https://matplotlib.org/3.1.1/api/_as_gen/matplotlib.pyplot.figure.html

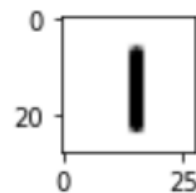




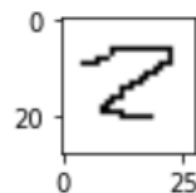
預測



0



1



2

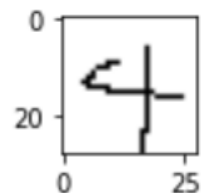




預測



3



4

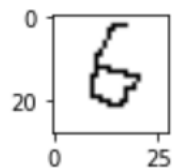


5

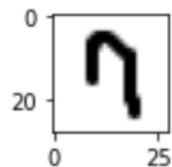




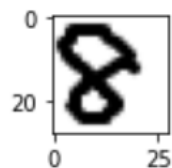
預測



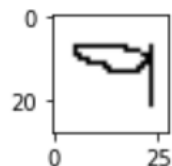
6



7



8



9





















下載win32 燒入程式





下載img檔








 raspbian-2017-06-23/	2017-06-23 07:14	-
 raspbian-2017-07-05/	2017-07-05 17:43	-
 raspbian-2017-08-17/	2017-08-17 09:17	-
 raspbian-2017-09-08/	2017-09-08 12:13	-
 raspbian-2017-12-01/	2017-12-01 10:22	-
 raspbian-2018-03-14/	2018-03-16 18:07	-
 raspbian-2018-04-19/	2018-04-19 15:40	-
 raspbian-2018-06-29/	2018-06-29 03:28	-
 raspbian-2018-10-11/	2018-10-11 11:46	-
 raspbian-2018-11-15/	2018-11-15 21:06	-
 raspbian-2019-04-09/	2019-04-09 23:46	-
 raspbian-2019-06-24/	2019-06-24 07:20	-
 raspbian-2019-07-12/	2019-07-12 14:55	-
 raspbian-2019-09-30/	2019-09-30 15:52	-
 raspbian-2020-02-07/	2020-02-07 08:23	-
 raspbian-2020-02-14/	2020-02-14 15:33	-





點開後 進到這畫面 點第三個 下載

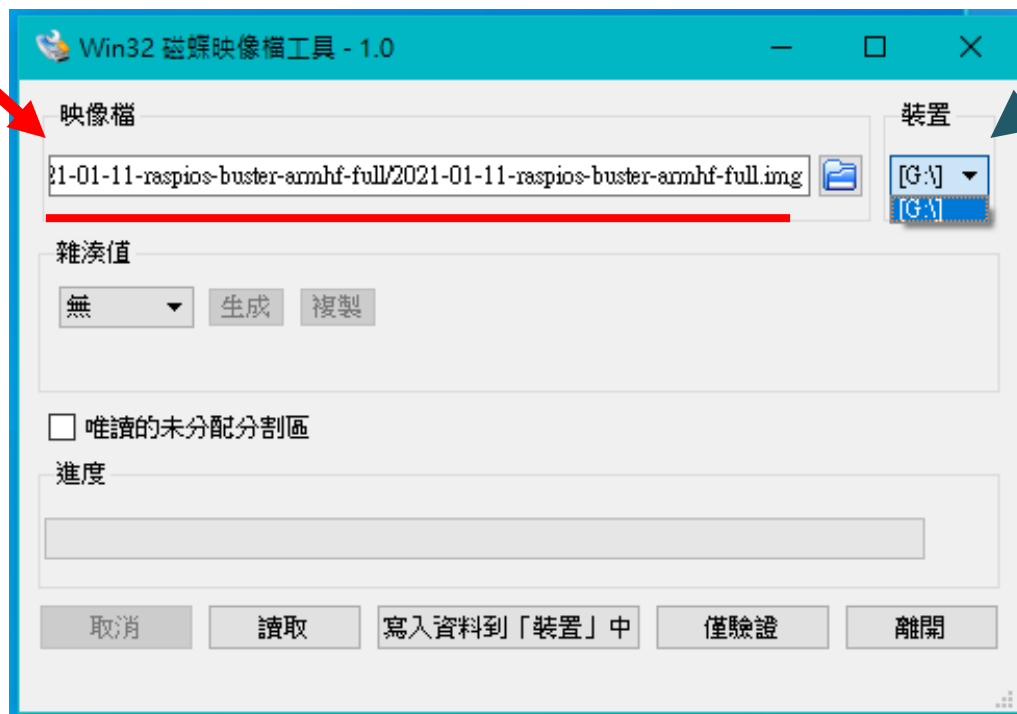
Index of /raspbian/images/raspbian-2020-02-14

<u>Name</u>	<u>Last modified</u>	<u>Size</u>	<u>Description</u>
 Parent Directory		-	
 2020-02-13-raspbian-buster.info	2020-02-13 16:21	170K	
 2020-02-13-raspbian-buster.zip	2020-02-13 16:21	1.1G	
 2020-02-13-raspbian-buster.zip.sha1	2020-02-14 13:47	73	
 2020-02-13-raspbian-buster.zip.sha256	2020-02-14 13:48	97	
 2020-02-13-raspbian-buster.zip.sig	2020-02-14 12:55	488	
 2020-02-13-raspbian-buster.zip.torrent	2020-02-14 13:48	22K	

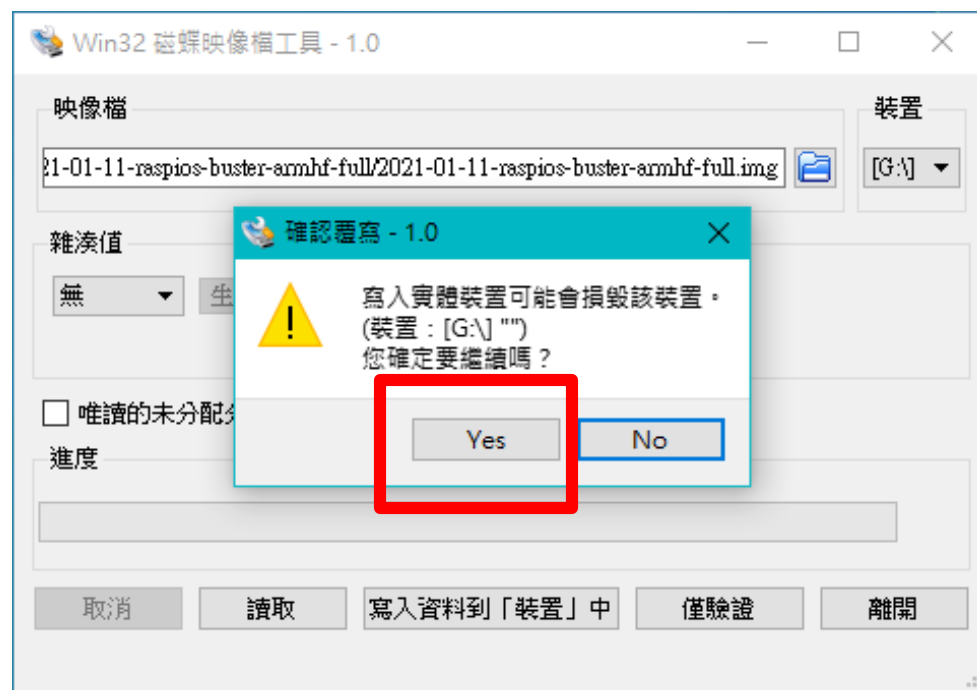


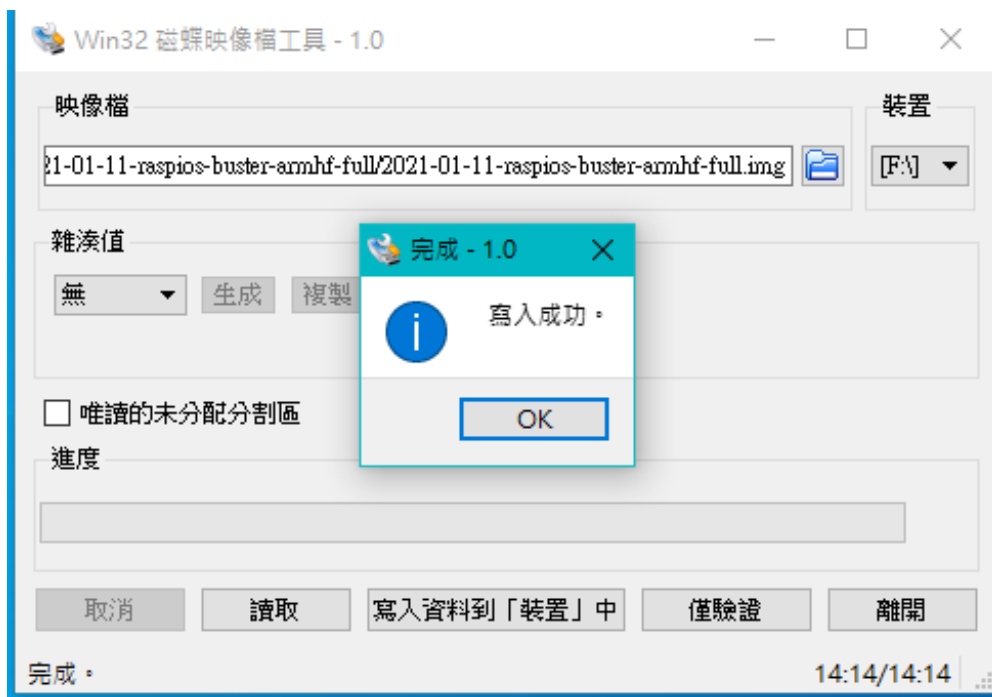
2021-01-11-raspbian-buster-armhf-full

名稱	修改日期
2021-01-11-raspbian-buster-armhf-full.i...	2022/10/20 下



SD卡





有出現 格式化視窗
直接關閉即可

把SD卡放到 樹梅派



設定

Welcome to Raspberry Pi

Set Country

Enter the details of your location. This is used to set the language, time zone, keyboard and other international settings.

Country: Taiwan

Language: Chinese

Timezone: Taipei

☐ Use English language ☐ Use US keyboard

Press 'Next' when you have made your selection.

BackNext





設定

Welcome to Raspberry Pi

Change Password

The default 'pi' user account currently has the password 'raspberrypi'. It is strongly recommended that you change this to a different password that only you know.

Enter new password:

Confirm new password:

☒ Hide characters

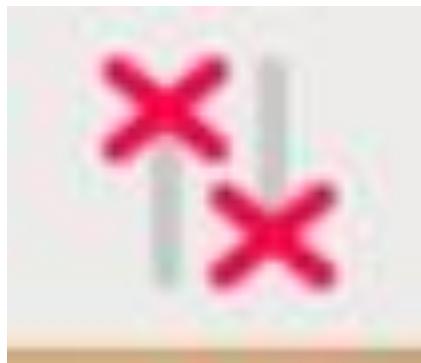
Press 'Next' to activate your new password.

預設密碼為raspberrypi，可以不用填





WiFi





在樹梅派上設定安裝包

以下指令 可到官網 <https://coral.ai/docs/accelerator/get-started/#1-install-the-edge-tpu-runtime> 複製指令

安裝套件階段 不要插上TPU!!!!!!!!!!!!!!
安裝套件階段 不要插上TPU!!!!!!!!!!!!!!
安裝套件階段 不要插上TPU!!!!!!!!!!!!!!





在樹梅派上設定安裝指令

- `echo "deb https://packages.cloud.google.com/apt coral-edgetpu-stable main" | sudo tee /etc/apt/sources.list.d/coral-edgetpu.list`
- `curl https://packages.cloud.google.com/apt/doc/apt-key.gpg | sudo apt-key add -`
- `sudo apt-get update`





- `sudo apt-get install libedgetpu1-std`
- `sudo apt-get install python3-pycoral`





以下測試指令 請插上TPU

```
mkdir coral && cd coral
```

```
git clone https://github.com/google-coral/pycoral.git
```

```
cd pycoral
```





```
bash examples/install_requirements.sh classify_image.py
```

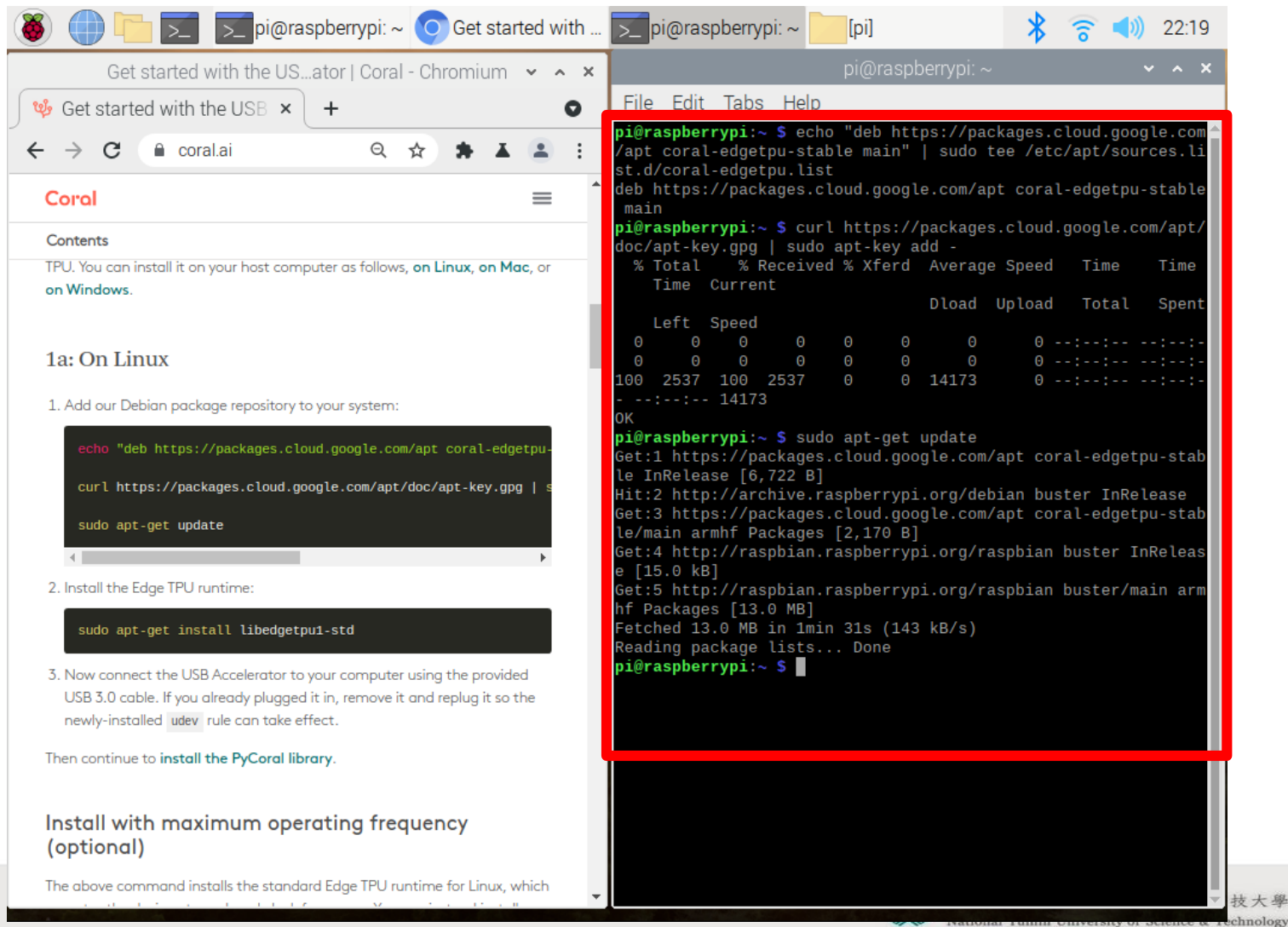
```
python3 examples/classify_image.py \  
--model test_data/mobilenet_v2_1.0_224_inat_bird_quant_edgetpu.tflite \  
--labels test_data/inat_bird_labels.txt \ --input test_data/parrot.jpg
```

這測試指令 簡而言之 載測試的模型 程式 圖片

最後一行去執行



套件成功畫面



The screenshot displays a Raspberry Pi desktop environment. On the left, a Chromium browser window shows the Coral website's instructions for Linux installation. On the right, a terminal window shows the execution of commands to add the Coral package repository, update the package list, and install the Edge TPU runtime. The terminal output confirms the successful installation of the 13.0 MB package.

Browser Window (Coral - Chromium):

- Address bar: `coral.ai`
- Page Title: Get started with the USB...
- Section: 1a: On Linux
- Step 1: Add our Debian package repository to your system:

```
echo "deb https://packages.cloud.google.com/apt coral-edgetpu-stable main" | sudo tee /etc/apt/sources.list.d/coral-edgetpu.list
deb https://packages.cloud.google.com/apt coral-edgetpu-stable main
sudo apt-get update
```
- Step 2: Install the Edge TPU runtime:

```
sudo apt-get install libedgetpu1-std
```
- Step 3: Now connect the USB Accelerator to your computer using the provided USB 3.0 cable. If you already plugged it in, remove it and replug it so the newly-installed `udev` rule can take effect.
- Text: Then continue to [install the PyCoral library](#).
- Section: Install with maximum operating frequency (optional)
- Text: The above command installs the standard Edge TPU runtime for Linux, which

Terminal Window (pi@raspberrypi: ~):

```
pi@raspberrypi:~$ echo "deb https://packages.cloud.google.com/apt coral-edgetpu-stable main" | sudo tee /etc/apt/sources.list.d/coral-edgetpu.list
deb https://packages.cloud.google.com/apt coral-edgetpu-stable main
pi@raspberrypi:~$ curl https://packages.cloud.google.com/apt/doc/apt-key.gpg | sudo apt-key add -
% Total    % Received % Xferd  Average Speed   Time    Time     Time  Current
           Dload  Upload   Total   Spent    Dload  Upload   Total   Spent
0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
100 2537 100 2537 0 0 14173 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0
OK
pi@raspberrypi:~$ sudo apt-get update
Get:1 https://packages.cloud.google.com/apt coral-edgetpu-stable InRelease [6,722 B]
Hit:2 http://archive.raspberrypi.org/debian buster InRelease
Get:3 https://packages.cloud.google.com/apt coral-edgetpu-stable/main armhf Packages [2,170 B]
Get:4 http://raspbian.raspberrypi.org/raspbian buster InRelease [15.0 kB]
Get:5 http://raspbian.raspberrypi.org/raspbian buster/main armhf Packages [13.0 MB]
Fetched 13.0 MB in 1min 31s (143 kB/s)
Reading package lists... Done
pi@raspberrypi:~$
```




套件成功畫面





測試成功畫面

The screenshot shows a Raspberry Pi desktop environment. On the left is a file manager window displaying the contents of the home directory, including folders like coral, Desktop, Documents, Downloads, MagPi, Music, Pictures, Public, Templates, Videos, lib, lost+found, media, and mnt. On the right is a terminal window with the following output:

```
pi@raspberrypi: ~$ cd coral
pi@raspberrypi: ~/coral$ git clone https://github.com/google-coral/pycoral.git
Cloning into 'pycoral'...
remote: Enumerating objects: 315, done.
Receiving objects: 32% (102/315), 684.01 KiB | 122.00 KiB/s
Receiving objects: 33% (104/315), 684.01 KiB | 122.00 KiB/s
Receiving objects: 33% (104/315), 788.01 KiB | 106.00 KiB/s
Receiving objects: 33% (104/315), 908.01 KiB | 101.00 KiB/s
Receiving objects: 33% (104/315), 1004.01 KiB | 93.00 KiB/s
remote: Total 315 (delta 0), reused 0 (delta 0), pack-reused 315
Receiving objects: 100% (315/315), 6.32 MiB | 116.00 KiB/s, done.
Resolving deltas: 100% (97/97), done.
pi@raspberrypi: ~/coral$ cd pycoral
pi@raspberrypi: ~/coral/pycoral$ bash examples/install_requirements.sh classify_image.py
DOWNLOAD: mobilenet_v2_1.0_224_inat_bird_quant_edgetpu.tflite
% Total    % Received % Xferd  Average Speed   Time    Time     % Total    % Received % Xferd  Average Speed   Time    Time
% Time     Current                                Dload  Upload  Total  Spent
0 0         0    0    0    0     0      0     0  0:00:00  0:00:00
0 0         0    0    0    0     0      0     0  0:00:00  0:00:00
4 4197k    4 207k    0    0  105k    0  0:00:39  0:00:00
7 4197k    7 303k    0    0  102k    0  0:00:41  0:00:00
9 4197k    9 383k    0    0  98950  0  0:00:43  0:00:00
12 4197k   12 504k    0    0  101k    0  0:00:41  0:00:00
15 4197k   15 664k    0    0  111k    0  0:00:37  0:00:00
17 4197k   17 744k    0    0  104k    0  0:00:40  0:00:00
22 4197k   22 936k    0    0  117k    0  0:00:35  0:00:00
25 4197k   25 1059k  0    0  118k    0  0:00:35  0:00:00
25 4197k   25 1075k  0    0  102k    0  0:00:41  0:00:17
```



測試成功畫面

The screenshot shows a Raspberry Pi desktop environment. On the left, a file manager window displays the file system structure, including folders like coral, Desktop, Documents, Downloads, MagPi, Music, Pictures, Public, Templates, Videos, lib, lost+found, media, and mnt. On the right, a terminal window displays the output of a test script. The terminal output shows a series of lines indicating successful downloads and file operations, with a final prompt 'pi@raspberrypi:~/coral/pycoral \$'.

```
pi@raspberrypi: ~
Get started with ...
pi@raspberrypi: ~/coral/pycoral
File Edit Tabs Help
43 3495k 43 1523k 0 0 137k 0 0:00:25 0:00:1
45 3495k 45 1598k 0 0 133k 0 0:00:26 0:00:1
50 3495k 50 1774k 0 0 137k 0 0:00:25 0:00:1
53 3495k 53 1870k 0 0 134k 0 0:00:26 0:00:1
56 3495k 56 1982k 0 0 132k 0 0:00:26 0:00:1
59 3495k 59 2062k 0 0 129k 0 0:00:27 0:00:1
60 3495k 60 2121k 0 0 125k 0 0:00:27 0:00:1
65 3495k 65 2297k 0 0 128k 0 0:00:27 0:00:1
70 3495k 70 2457k 0 0 129k 0 0:00:26 0:00:1
73 3495k 73 2585k 0 0 129k 0 0:00:26 0:00:1
77 3495k 77 2713k 0 0 124k 0 0:00:28 0:00:2
78 3495k 78 2729k 0 0 119k 0 0:00:29 0:00:2
84 3495k 84 2958k 0 0 128k 0 0:00:27 0:00:2
89 3495k 89 3134k 0 0 130k 0 0:00:26 0:00:2
92 3495k 92 3246k 0 0 130k 0 0:00:26 0:00:2
97 3495k 97 3422k 0 0 131k 0 0:00:26 0:00:2
100 3495k 100 3495k 0 0 133k 0 0:00:26 0:00:2
6 --:--:-- 221k
DOWNLOAD: inat_bird_labels.txt
% Total % Received % Xferd Average Speed Time Time
Time Current
Left Speed
0 0 0 0 0 0 0 0 --:--:-- --:--:--
0 0 0 0 0 0 0 0 --:--:-- --:--:--
0 0 0 0 0 0 0 0 --:--:-- --:--:--
--:--:-- 0
100 37146 100 37146 0 0 65628 0 --:--:-- --:--:--
--:--:-- 65628
DOWNLOAD: parrot.jpg
% Total % Received % Xferd Average Speed Time Time
Time Current
Left Speed
0 0 0 0 0 0 0 0 --:--:-- --:--:--
0 0 0 0 0 0 0 0 --:--:-- --:--:--
--:--:-- 0
41 582k 41 239k 0 0 237k 0 0:00:02 0:00:0
100 582k 100 582k 0 0 353k 0 0:00:01 0:00:0
1 --:--:-- 536k
pi@raspberrypi:~/coral/pycoral $
```



測試成功畫面

```
pi@raspberrypi:~/coral/pycoral $ python3 examples/classify_image.py --model test_data/mobilenet_v2_1.0_224_inat_bird_quantized.tflite --labels test_data/inat_bird_labels.txt --input test_data/parrot.jpg
----INFERENCE TIME----
Note: The first inference on Edge TPU is slow because it includes loading the model into Edge TPU memory.
124.3ms
15.1ms
14.9ms
14.7ms
21.8ms
-----RESULTS-----
Ara macao (Scarlet Macaw): 0.75781
```

會跑出放進圖片的預測結果



登出



先登出等完全斷電再拔除電源





Reference

- <https://www.raspberrypi.org/downloads/>
- <https://coral.ai/>





END

