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1. 請比較你本次作業的架構，參數量、結果和原HW3作業架構、參數量、結果做比較。(1%)

本次：

(1) 架構與參數量

|   |                    |         |   |                    |   |   |                   |   |            |      |
|---|--------------------|---------|---|--------------------|---|---|-------------------|---|------------|------|
| Layer (Type)                                      | Output Shape       | Param # | depthwise_conv2d_3 (Depthwise (None, 24, 24, 64)) | 640                | conv2d_6 (Conv2D)                               | (None, 12, 12, 128)                               | 8192              | global_max_pooling2d_1 (Gloab (None, 128))                                      | 0          |      |
| input_1 (InputLayer)                              | (None, 48, 48, 1)  | 0       | dropout_4 (Dropout)                               | (None, 24, 24, 64) | 0   | batch_normalization_11 (Bate (None, 12, 12, 128)) | 512               | dense_1 (Dense)   | (None, 56) | 7224 |
| conv2d_1 (Conv2D)                                 | (None, 48, 48, 32) | 288     | batch_normalization_6 (Batch (None, 24, 24, 64))  | 256                | activation_11 (Activation)                      | (None, 12, 12, 128)                               | 0                 | dense_2 (Dense)   | (None, 7)  | 399  |
| dropout_1 (Dropout)                               | (None, 48, 48, 32) | 0       | activation_6 (Activation)                         | (None, 24, 24, 64) | 0   | depthwise_conv2d_6 (Depthwise (None, 6, 6, 128))  | 1280              | Total params: 73,511<br>Trainable params: 71,079<br>Non-trainable params: 2,432 |            |      |
| batch_normalization_1 (Batch (None, 48, 48, 32))  | 128                |         | conv2d_4 (Conv2D)                                 | (None, 24, 24, 64) | 4096  | dropout_7 (Dropout)                               | (None, 6, 6, 128) | 0   |            |      |
| activation_1 (Activation)                         | (None, 48, 48, 32) | 0       | batch_normalization_7 (Batch (None, 24, 24, 64))  | 256                | batch_normalization_12 (Bate (None, 6, 6, 128)) | 512   |                   |   |            |      |
| depthwise_conv2d_1 (Depthwise (None, 48, 48, 32)) | 320                |         | activation_7 (Activation)                         | (None, 24, 24, 64) | 0   | activation_12 (Activation)                        | (None, 6, 6, 128) | 0   |            |      |
| dropout_2 (Dropout)                               | (None, 48, 48, 32) | 0       | depthwise_conv2d_4 (Depthwise (None, 12, 12, 64)) | 640                | conv2d_7 (Conv2D)                               | (None, 6, 6, 128)                                 | 16384             |   |            |      |
| batch_normalization_2 (Batch (None, 48, 48, 32))  | 128                |         | dropout_5 (Dropout)                               | (None, 12, 12, 64) | 0   | batch_normalization_13 (Bate (None, 6, 6, 128))   | 512               |   |            |      |
| activation_2 (Activation)                         | (None, 48, 48, 32) | 0       | batch_normalization_8 (Batch (None, 12, 12, 64))  | 256                | activation_13 (Activation)                      | (None, 6, 6, 128)                                 | 0                 |   |            |      |
| conv2d_2 (Conv2D)                                 | (None, 48, 48, 64) | 2048    | activation_8 (Activation)                         | (None, 12, 12, 64) | 0   | depthwise_conv2d_7 (Depthwise (None, 6, 6, 128))  | 1280              |   |            |      |
| batch_normalization_3 (Batch (None, 48, 48, 64))  | 256                |         | conv2d_5 (Conv2D)                                 | (None, 12, 12, 64) | 4096  | dropout_8 (Dropout)                               | (None, 6, 6, 128) | 0   |            |      |
| activation_3 (Activation)                         | (None, 48, 48, 64) | 0       | batch_normalization_9 (Batch (None, 12, 12, 64))  | 256                | batch_normalization_14 (Bate (None, 6, 6, 128)) | 512   |                   |   |            |      |
| depthwise_conv2d_2 (Depthwise (None, 24, 24, 64)) | 640                |         | activation_9 (Activation)                         | (None, 12, 12, 64) | 0   | activation_14 (Activation)                        | (None, 6, 6, 128) | 0   |            |      |
| dropout_3 (Dropout)                               | (None, 24, 24, 64) | 0       | depthwise_conv2d_5 (Depthwise (None, 12, 12, 64)) | 640                | conv2d_8 (Conv2D)                               | (None, 6, 6, 128)                                 | 16384             |   |            |      |
| batch_normalization_4 (Batch (None, 24, 24, 64))  | 256                |         | dropout_6 (Dropout)                               | (None, 12, 12, 64) | 0   | batch_normalization_15 (Bate (None, 6, 6, 128))   | 512               |   |            |      |
| activation_4 (Activation)                         | (None, 24, 24, 64) | 0       | batch_normalization_10 (Bate (None, 12, 12, 64))  | 256                | activation_15 (Activation)                      | (None, 6, 6, 128)                                 | 0                 |   |            |      |
| conv2d_3 (Conv2D)                                 | (None, 24, 24, 64) | 4096    | activation_10 (Activation)                        | (None, 12, 12, 64) | 0   |   |                   |   |            |      |
| batch_normalization_5 (Batch (None, 24, 24, 64))  | 256                |         |   |                    |   |   |                   |   |            |      |
| activation_5 (Activation)                         | (None, 24, 24, 64) | 0       |   |                    |   |   |                   |   |            |      |

(2) 正確率

Private: 0.63973

Public: 0.64781

HW3：

(1) 架構與參數量

|   |                     |         |   |                   |         |
|---|---------------------|---------|---|-------------------|---------|
| Layer (type)  | Output Shape        | Param # | dropout_3 (Dropout)   | (None, 6, 6, 512) | 0       |
| conv2d_1 (Conv2D)   | (None, 48, 48, 128) | 1280    | conv2d_7 (Conv2D)   | (None, 6, 6, 768) | 3539712 |
| conv2d_2 (Conv2D)   | (None, 48, 48, 128) | 147584  | conv2d_8 (Conv2D)   | (None, 6, 6, 768) | 5309184 |
| batch_normalization_1 (Batch Normalization (None, 48, 48, 128)) | 512                 |         | batch_normalization_4 (Batch Normalization (None, 6, 6, 768)) | 3072              |         |
| max_pooling2d_1 (MaxPooling2 (None, 24, 24, 128))               | 0                   |         | max_pooling2d_4 (MaxPooling2 (None, 3, 3, 768))               | 0                 |         |
| dropout_1 (Dropout)   | (None, 24, 24, 128) | 0       | dropout_4 (Dropout)   | (None, 3, 3, 768) | 0       |
| conv2d_3 (Conv2D)   | (None, 24, 24, 256) | 295168  | flatten_1 (Flatten)   | (None, 6912)      | 0       |
| conv2d_4 (Conv2D)   | (None, 24, 24, 256) | 590080  | dense_1 (Dense)   | (None, 1024)      | 7078912 |
| batch_normalization_2 (Batch Normalization (None, 24, 24, 256)) | 1024                |         | dropout_5 (Dropout)   | (None, 1024)      | 0       |
| max_pooling2d_2 (MaxPooling2 (None, 12, 12, 256))               | 0                   |         | dense_2 (Dense)   | (None, 1024)      | 1049600 |
| dropout_2 (Dropout)   | (None, 12, 12, 256) | 0       | dropout_6 (Dropout)   | (None, 1024)      | 0       |
| conv2d_5 (Conv2D)   | (None, 12, 12, 512) | 1180160 | dense_3 (Dense)   | (None, 1024)      | 1049600 |
| conv2d_6 (Conv2D)   | (None, 12, 12, 512) | 2359808 | dropout_7 (Dropout)   | (None, 1024)      | 0       |
| batch_normalization_3 (Batch Normalization (None, 12, 12, 512)) | 2048                |         | dense_4 (Dense)   | (None, 7)         | 7175    |
| max_pooling2d_3 (MaxPooling2 (None, 6, 6, 512))                 | 0                   |         | Total params: 22,614,919                                      |                   |         |
|   |                     |         | Trainable params: 22,611,591                                  |                   |         |
|   |                     |         | Non-trainable params: 3,328                                   |                   |         |

(2) 正確率

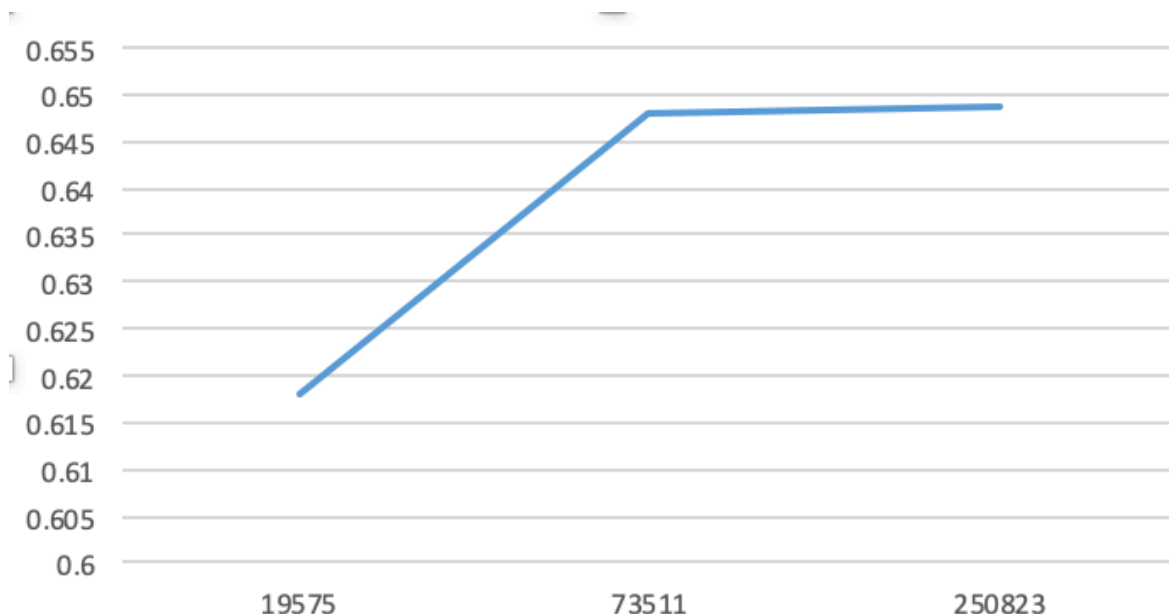
Private: 0.68487

Public: 0.68208

可以發現我在HW3的參數量比HW8多上非常多，約為300倍，但正確率卻只高了約4%，可見 model compressing是有效的。

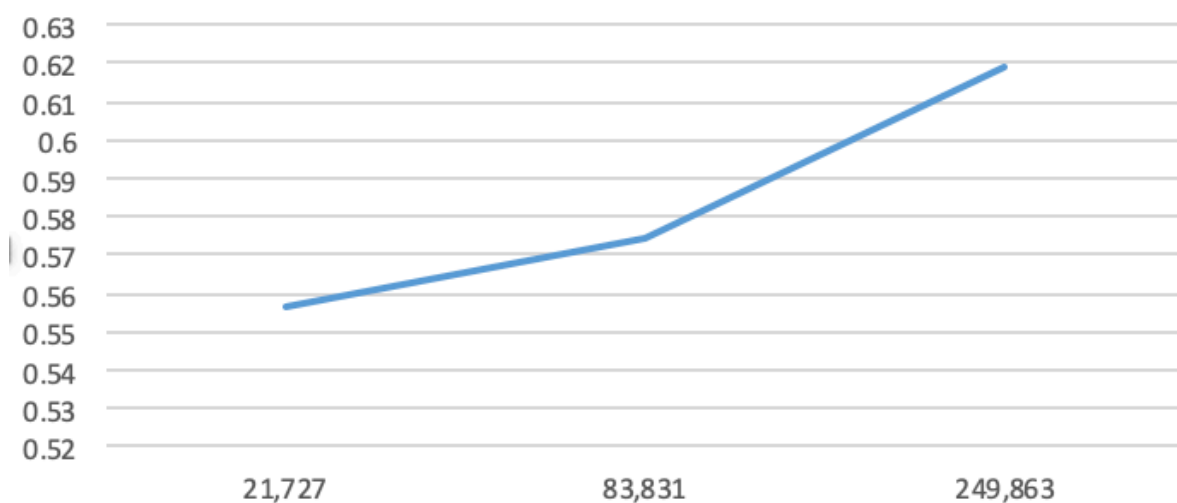
2. 請使用MobileNet的架構，畫出參數量-acc的散布圖（橫軸為參數量，縱軸為accuracy，且至少3個點，參數量選擇時儘量不要離的太近，結果選擇只要大致收斂，不用train到最好沒關係。）(1%)

橫軸為參數量，縱軸為在validation set上的正確率



3. 請使用一般CNN的架構，畫出參數量-acc的散布圖（橫軸為參數量，縱軸為accuracy，且至少3個點，參數量選擇時儘量不要離的太近，結果選擇只要大致收斂，不用train到最好沒關係。）(1%)

橫軸為參數量，縱軸為在validation set上的正確率



4. 請你比較題2和題3的結果，並請針對當參數量相當少的時候，如果兩者參數量相當，兩者的差異，以及你認為為什麼會造成這個原因。(2%)

當參數量相當少時，MobileNet能有比一般CNN高的正確率，我認為是因為MobileNet是使用Depthwise Separable Convolution，如此能透過在某些地方共用參數來減少參數量，雖然會使得取出的特徵較接近，但能夠在參數量少的狀況下取出許多的特徵，相比於一般CNN，在參數量少時，只能夠取出少量特徵，因此正確率會下降很多。

此外，可以看到當我們增加參數量時，一般CNN的正確率逐漸上升且有越來越好的趨勢，但MobileNet的正確率在一定程度上升後開始停滯，可見MobileNet比較適合在參數量少的狀況，再繼續增加參數量也沒有辦法明顯提高正確率。