```
#Beating DeepFood
!nvidia-smi -L
     GPU 0: Tesla T4 (UUID: GPU-51661545-ab33-e106-2349-e28dbb924b12)
# !pip install tensorflow==2.4
import tensorflow as tf
tf.__version__
     '2.4.0'
#load helper functions from github
!wget https://raw.githubusercontent.com/mrdbourke/tensorflow-deep-learning/main/extras/helper
     --2022-02-04 01:29:11-- https://raw.githubusercontent.com/mrdbourke/tensorflow-deep-lea
     Resolving raw.githubusercontent.com (raw.githubusercontent.com)... 185.199.108.133, 185
     Connecting to raw.githubusercontent.com (raw.githubusercontent.com) | 185.199.108.133 | :443
     HTTP request sent, awaiting response... 200 OK
     Length: 10246 (10K) [text/plain]
     Saving to: 'helper_functions.py.1'
     helper functions.py 100%[==========] 10.01K --.-KB/s
                                                                         in 0s
     2022-02-04 01:29:11 (74.4 MB/s) - 'helper_functions.py.1' saved [10246/10246]
from helper functions import create tensorboard callback, plot loss curves, compare historys
import tensorflow as tf
import tensorflow datasets as tfds
datasets_list = tfds.list_builders()
print("food101" in datasets_list)
     True
#load food101 dataset
(train data, test data), ds info = tfds.load(name = "food101",
                                           split = ["train", "validation"],
                                           shuffle_files = True,
                                           as supervised = True,
                                           with info = True)
```

```
Downloading and preparing dataset food101/2.0.0 (download: 4.65 GiB, generated: Unknown
     DI Completed...: 100%
                           1/1 [04:14<00:00, 183.99s/ url]
     DI Size...: 100%
                      4764/4764 [04:14<00:00, 25.49 MiB/s]
     Extraction completed...: 100%
                                 1/1 [04:14<00:00, 254.71s/ file]
     Shuffling and writing examples to /root/tensorflow_datasets/food101/2.0.0.incompleteDG51
     100%
                                                     75749/75750 [00:25<00:00, 1377.48 examples/s]
     Shuffling and writing examples to /root/tensorflow_datasets/food101/2.0.0.incompleteDG51
     100%
                                                     25249/25250 [00:08<00:00, 3300.60 examples/s]
ds info.features
     FeaturesDict({
          'image': Image(shape=(None, None, 3), dtype=tf.uint8),
          'label': ClassLabel(shape=(), dtype=tf.int64, num_classes=101),
     })
#get class names
class names = ds info.features["label"].names
class names[:10]
     ['apple_pie',
      'baby back ribs',
      'baklava',
      'beef_carpaccio',
      'beef_tartare',
      'beet salad',
      'beignets',
      'bibimbap',
      'bread pudding',
      'breakfast_burrito']
take_one = train_data.take(1)
for image, label in take_one:
  print(image.shape,image.dtype,label)
     (512, 512, 3) <dtype: 'uint8'> tf.Tensor(18, shape=(), dtype=int64)
image
     <tf.Tensor: shape=(512, 512, 3), dtype=uint8, numpy=
     array([[[170, 193, 165],
              [175, 198, 170],
```

```
[187, 209, 186],
 . . . ,
 [253, 255, 249],
 [253, 255, 249],
 [253, 255, 249]],
[[169, 185, 159],
 [169, 184, 161],
 [171, 189, 167],
 . . . ,
 [253, 255, 249],
 [253, 255, 249],
[253, 255, 249]],
[[166, 171, 151],
[161, 166, 146],
[158, 165, 147],
 . . . ,
 [253, 255, 249],
 [253, 255, 249],
 [253, 255, 249]],
. . . ,
[[143, 131, 105],
[143, 131, 105],
[141, 132, 103],
 [152, 131, 104],
 [153, 129, 103],
[151, 127, 101]],
[[139, 129, 102],
[138, 128, 101],
[137, 128, 99],
 . . . ,
 [150, 126, 100],
 [151, 125, 100],
[152, 126, 99]],
[[133, 123,
             96],
[134, 124,
             97],
[136, 127,
             98],
 . . . ,
 [149, 125, 99],
 [152, 126, 99],
 [156, 130, 103]]], dtype=uint8)>
```

```
#plot image tensor
import matplotlib.pyplot as plt
import numpy
plt.imshow(image)
```

```
plt.title(class_names[label.numpy()])
plt.axis(False)
```

```
(-0.5, 511.5, 511.5, -0.5)
```



```
#TF likes batched, normalized/scaled datasets
#right now the loaded data is in tuples of (image,label) for both train and test
def preprocess_img (image,label,img_shape = 224):
   image = tf.image.resize(image, [img_shape, img_shape])
   return tf.cast(image, tf.float32), label
```

```
#preprocess a sample

preprocessed_img = preprocess_img(image, label)[0]
preprocessed_img
```

```
<tf.Tensor: shape=(224, 224, 3), dtype=float32, numpy=
array([[[170.5051 , 188.59184 , 163.11736 ],
        [187.9898 , 206.82143 , 186.91837 ],
        [208.97958 , 225.69388 , 212.7653 ],
        . . . ,
                    , 255.
        [253.
                                , 249.
                                             ],
                   , 255.
                                , 249.
        [253.
                                             ],
                                , 249.
        [253.
                    , 255.
                                             ]],
       [[155.02551 , 149.47958 , 134.38776 ],
        [149.11224 , 149.47958 , 137.11734 ],
        [153.97449 , 162.87245 , 152.42857 ],
        . . . ,
        [253.
                    , 255.
                                , 249.
                                             1,
                   , 255.
                                , 249.
        [253.
                                             1,
                                             ]],
        [253.
                    , 255.
                                , 249.
       [[126.99999 , 106.21939 , 99.79082 ],
        [119.591835, 108.19388 , 102.12245 ],
        [118.66837 , 121.42857 , 113.42857 ],
        . . . ,
                    , 255.
        [253.
                                , 249.
                                             ],
                                , 249.
        [253.
                    , 255.
                                             1,
        [253.
                    , 255.
                                 , 249.
                                             ]],
```

. . . ,

[[139.71938 , 125.71938 , 98.71938], [137.28569 , 125.6429 , 98.07143], [138.19385 , 125.719406 , 99.85715],

```
[149.47444 , 131.6887 , 112.117226],
            [144.07144 , 123.77037 , 102.785614],
            [154.05106 , 134.47958 , 110.90811 ]],
           [[142.00511 , 130.00511 , 104.00512 ],
            [142.79074 , 133.6581 , 104.72443 ],
            [138.01526 , 129.01526 , 100.015274],
            [150.39792 , 128.39792 , 107.25503 ],
            [150.3419 , 128.347 , 105.19391 ],
            [152.61731 , 130.80608 , 105.66822 ]],
           [[136.67331 , 126.67331 , 99.6733
            [137.04091 , 128.04091 , 99.04091 ],
            [135.41338 , 128.41338 , 99.41338 ],
            [154.41856 , 129.69922 , 107.13792 ],
            [151.8316 , 127.8316 , 103.0254 ],
            [152.09708 , 126.097084, 99.92352 ]]], dtype=float32)>
#batch and prepare dataset(parallelize) pipeline using image dataset from directory
#AUTOTUNE will utilize all CPU/GPU power
#shuffle train data and turn into batches
#we mapped our preprocess_img func to full train_data and used AUTOTUNE to make the process f
train_data = train_data.map(map_func=preprocess_img,num_parallel_calls=tf.data.AUTOTUNE)
train data = train data.shuffle(buffer size=1000).batch(batch size = 32).prefetch(buffer size
test_data = test_data.map(map_func=preprocess_img,num_parallel_calls=tf.data.AUTOTUNE).batch(
train_data,test_data
    (<PrefetchDataset shapes: ((None, 224, 224, 3), (None,)), types: (tf.float32, tf.int64);
     <PrefetchDataset shapes: ((None, 224, 224, 3), (None,)), types: (tf.float32, tf.int64);
#create tensorboard callback
from helper_functions import create_tensorboard_callback
checkpoint path = "model checkpoints/cp.pkt"
model_checkpoint·=·tf.keras.callbacks.ModelCheckpoint(checkpoint_path,
·····monitor·=·"val acc",
·····save best only·=·True,
·····sve weights only--·True,
                                                                                    5/14
```

```
#setup mixed precision training
from tensorflow.keras import mixed_precision
mixed_precision.set_global_policy("mixed_float16")
```

••••••••••••verbose•=•0)

INFO:tensorflow:Mixed precision compatibility check (mixed_float16): OK
Your GPU will likely run quickly with dtype policy mixed_float16 as it has compute capal
INFO:tensorflow:Mixed precision compatibility check (mixed_float16): OK
Your GPU will likely run quickly with dtype policy mixed_float16 as it has compute capal

```
#build feature extraction model
from tensorflow.keras import layers
from tensorflow.keras.layers.experimental import preprocessing
input shape = (224, 224, 3)
base model = tf.keras.applications.EfficientNetB0(include top=False)
base model.trainable = False
inputs = layers.Input(shape=input shape,name="input layer")
x = base model(inputs,training=False)
x = layers.GlobalAveragePooling2D()(x)
x = layers.Dense(len(class names))(x)
outputs = layers.Activation("softmax",dtype = tf.float32,name = "softmax float32")(x)
                                                                                         # tur
model = tf.keras.Model(inputs,outputs)
model.compile(loss="sparse categorical crossentropy",
              optimizer = tf.keras.optimizers.Adam(),
              metrics = ["accuracy"]) #since labels are in int we use sparse , if it were on
model.summary()
```

Layer (type)	Output Shape	Param #
input_layer (InputLayer)	[(None, 224, 224, 3)]	0
efficientnetb0 (Functional)	(None, None, None, 1280)	4049571
global_average_pooling2d (Gl	(None, 1280)	0
dense (Dense)	(None, 101)	129381
softmax_float32 (Activation)	(None, 101)	0

Total params: 4,178,952 Trainable params: 129,381 Non-trainable params: 4,049,571

```
for layer in model.layers:
  print(layer.name,layer.trainable,layer.dtype,layer.dtype policy)
     input layer True float32 <Policy "float32">
    efficientnetb0 False float32 <Policy "mixed_float16">
    global average pooling2d True float32 <Policy "mixed float16">
    dense True float32 <Policy "mixed float16">
     softmax float32 True float32 <Policy "float32">
for layer in model.layers[1].layers:
  print(layer.name,layer.trainable,layer.dtype,layer.dtype policy)
    block6b expand activation False float32 <Policy "mixed float16">
    block6b dwconv False float32 <Policy "mixed float16">
    block6b bn False float32 <Policy "mixed float16">
    block6b activation False float32 <Policy "mixed float16">
    block6b se squeeze False float32 <Policy "mixed float16">
    block6b se reshape False float32 <Policy "mixed float16">
    block6b se reduce False float32 <Policy "mixed float16">
    block6b se expand False float32 <Policy "mixed float16">
    block6b se excite False float32 <Policy "mixed float16">
    block6b project conv False float32 <Policy "mixed float16">
    block6b project bn False float32 <Policy "mixed float16">
    block6b_drop False float32 <Policy "mixed_float16">
    block6b add False float32 <Policy "mixed float16">
    block6c_expand_conv False float32 <Policy "mixed_float16">
    block6c expand bn False float32 <Policy "mixed float16">
    block6c expand activation False float32 <Policy "mixed float16">
    block6c dwconv False float32 <Policy "mixed float16">
    block6c bn False float32 <Policy "mixed float16">
    block6c activation False float32 <Policy "mixed float16">
    block6c_se_squeeze False float32 <Policy "mixed_float16">
    block6c se reshape False float32 <Policy "mixed float16">
    block6c se reduce False float32 <Policy "mixed float16">
    block6c_se_expand False float32 <Policy "mixed_float16">
    block6c se excite False float32 <Policy "mixed float16">
    block6c project conv False float32 <Policy "mixed float16">
    block6c project bn False float32 <Policy "mixed float16">
    block6c_drop False float32 <Policy "mixed_float16">
    block6c_add False float32 <Policy "mixed_float16">
    block6d expand conv False float32 <Policy "mixed float16">
    block6d_expand_bn False float32 <Policy "mixed_float16">
    block6d expand activation False float32 <Policy "mixed float16">
    block6d dwconv False float32 <Policy "mixed float16">
    block6d_bn False float32 <Policy "mixed_float16">
    block6d activation False float32 <Policy "mixed float16">
    block6d_se_squeeze False float32 <Policy "mixed_float16">
    block6d se reshape False float32 <Policy "mixed float16">
    block6d_se_reduce False float32 <Policy "mixed_float16">
    block6d se expand False float32 <Policy "mixed float16">
```

```
block6d se excite False float32 <Policy "mixed float16">
block6d project conv False float32 <Policy "mixed float16">
block6d_project_bn False float32 <Policy "mixed_float16">
block6d drop False float32 <Policy "mixed float16">
block6d add False float32 <Policy "mixed float16">
block7a expand conv False float32 <Policy "mixed float16">
block7a expand bn False float32 <Policy "mixed float16">
block7a expand activation False float32 <Policy "mixed float16">
block7a dwconv False float32 <Policy "mixed float16">
block7a bn False float32 <Policy "mixed float16">
block7a_activation False float32 <Policy "mixed_float16">
block7a se squeeze False float32 <Policy "mixed float16">
block7a se reshape False float32 <Policy "mixed float16">
block7a se reduce False float32 <Policy "mixed float16">
block7a_se_expand False float32 <Policy "mixed_float16">
block7a_se_excite False float32 <Policy "mixed_float16">
block7a project conv False float32 <Policy "mixed float16">
block7a project bn False float32 <Policy "mixed float16">
top_conv False float32 <Policy "mixed_float16">
top bn False float32 <Policy "mixed float16">
```

TO DOs

```
#save model to a file
model.save("drive/MyDrive/tensorflow saved models/101 food milestone model")
     INFO:tensorflow:Assets written to: drive/MyDrive/tensorflow saved models/101 food milest
    INFO:tensorflow:Assets written to: drive/MyDrive/tensorflow saved models/101 food milest
#load model
loaded model = tf.keras.models.load model("drive/MyDrive/tensorflow saved models/101 food mil
#evaluate loaded model
loaded loss,loaded accuracy = loaded model.evaluate(test data)
loaded loss, loaded accuracy
    790/790 [============= ] - 50s 63ms/step - loss: 1.0915 - accuracy: 0.76
     (1.0915277004241943, 0.7068910598754883)
for layer in loaded model.layers[1].layers:
  print(layer.trainable,layer.name,layer.dtype policy)
     iline ninckor se liezuahe khoiich mitsen linatio >
   True block5c se reduce <Policy "mixed float16">
     True block5c se expand <Policy "mixed float16">
    True block5c se excite <Policy "mixed float16">
    True block5c_project_conv <Policy "mixed_float16">
    True block5c project bn <Policy "mixed float16">
    True block5c drop <Policy "mixed float16">
    True block5c_add <Policy "mixed_float16">
    True block6a expand conv <Policy "mixed float16">
    True block6a_expand_bn <Policy "mixed_float16">
    True block6a expand activation <Policy "mixed float16">
    True block6a_dwconv_pad <Policy "mixed_float16">
    True block6a dwconv <Policy "mixed float16">
    True block6a bn <Policy "mixed float16">
    True block6a activation <Policy "mixed float16">
    True block6a_se_squeeze <Policy "mixed_float16">
    True block6a se reshape <Policy "mixed float16">
    True block6a se reduce <Policy "mixed float16">
    True block6a_se_expand <Policy "mixed_float16">
    True block6a se excite <Policy "mixed float16">
    True block6a project conv <Policy "mixed float16">
    True block6a_project_bn <Policy "mixed_float16">
    True block6b expand conv <Policy "mixed float16">
    True block6b_expand_bn <Policy "mixed_float16">
    True block6b expand activation <Policy "mixed float16">
    True block6b dwconv <Policy "mixed float16">
    True block6b_bn <Policy "mixed_float16">
    True block6b activation <Policy "mixed float16">
    True block6b_se_squeeze <Policy "mixed_float16">
    True block6b_se_reshape <Policy "mixed_float16">
    True block6b se reduce <Policy "mixed float16">
    True block6b se expand <Policy "mixed float16">
     Thus blockEb as sysita (Doliny "mixed fleat16")
```

```
TF 101 food vision.ipynb - Colaboratory
     ITUE DIOCKOD_SE_EXCITE CROTICA MITMEN_ITORCIO >
    True block6b_project_conv <Policy "mixed_float16">
    True block6b project bn <Policy "mixed float16">
    True block6b drop <Policy "mixed float16">
    True block6b add <Policy "mixed float16">
    True block6c_expand_conv <Policy "mixed_float16">
    True block6c expand bn <Policy "mixed float16">
    True block6c expand activation <Policy "mixed float16">
    True block6c dwconv <Policy "mixed float16">
    True block6c_bn <Policy "mixed_float16">
    True block6c_activation <Policy "mixed_float16">
    True block6c se squeeze <Policy "mixed float16">
    True block6c se reshape <Policy "mixed float16">
     True block6c se reduce <Policy "mixed float16">
    True block6c_se_expand <Policy "mixed_float16">
    True block6c_se_excite <Policy "mixed_float16">
    True block6c project conv <Policy "mixed float16">
    True block6c_project_bn <Policy "mixed_float16">
    True block6c drop <Policy "mixed float16">
    True block6c_add <Policy "mixed_float16">
    True block6d_expand_conv <Policy "mixed_float16">
    True block6d_expand_bn <Policy "mixed float16">
    True block6d_expand_activation <Policy "mixed_float16">
    True block6d dwconv <Policy "mixed float16">
    True block6d_bn <Policy "mixed_float16">
    True block6d activation <Policy "mixed float16">
    True block6d se squeeze ¿Policy "mixed float16">
#download pretrained model
!wget https://storage.googleapis.com/ztm tf course/food vision/07 efficientnetb0 feature extr
     --2022-02-04 02:11:19-- https://storage.googleapis.com/ztm tf course/food vision/07 eff
    Resolving storage.googleapis.com (storage.googleapis.com)... 142.251.107.128, 173.194.21
    Connecting to storage.googleapis.com (storage.googleapis.com)|142.251.107.128|:443... cc
    HTTP request sent, awaiting response... 200 OK
    Length: 16976857 (16M) [application/zip]
    Saving to: '07 efficientnetb0 feature extract model mixed precision.zip'
    07 efficientnetb0 f 100%[=======>] 16.19M 63.1MB/s
                                                                         in 0.3s
     2022-02-04 02:11:20 (63.1 MB/s) - '07_efficientnetb0_feature_extract_model_mixed_precisi
```

```
!mkdir downloaded gs model
!unzip 07 efficientnetb0 feature extract model mixed precision.zip -d downloaded gs model
```

```
Archive: 07 efficientnetb0 feature extract model mixed precision.zip
   creating: downloaded_gs_model/07_efficientnetb0_feature_extract_model_mixed_precisior
   creating: downloaded gs model/07 efficientnetb0 feature extract model mixed precisior
  inflating: downloaded gs model/07 efficientnetb0 feature extract model mixed precisior
  inflating: downloaded_gs_model/07_efficientnetb0_feature_extract_model_mixed_precisior
```

inflating: downloaded_gs_model/07_efficientnetb0_feature_extract_model_mixed_precisior
 creating: downloaded_gs_model/07_efficientnetb0_feature_extract_model_mixed_precisior

downloaded_model = tf.keras.models.load_model("/content/downloaded_gs_model/07_efficientnetb0

```
downloaded_model.summary()
```

Model: "model"

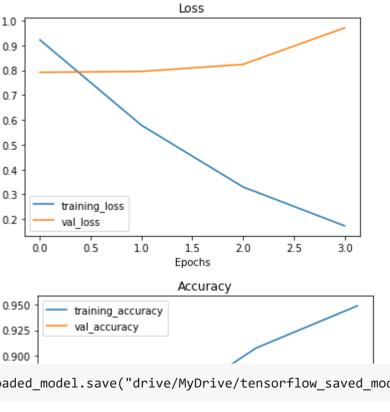
Layer (type)	Output Shape	Param #
input_layer (InputLayer)	[(None, 224, 224, 3)]	0
efficientnetb0 (Functional)	(None, None, None, 1280)	4049571
pooling_layer (GlobalAverage	(None, 1280)	0
dense (Dense)	(None, 101)	129381
softmax_float32 (Activation)	(None, 101)	0
_		

Total params: 4,178,952 Trainable params: 4,136,929 Non-trainable params: 42,023

```
downloaded_model.evaluate(test_data)
```

```
from tensorflow.keras.callbacks import EarlyStopping
early_stopping = EarlyStopping(monitor = 'val_loss',patience=3)
```

```
save best only = True,
                                                sve weights only = True,
                                                verbose = 0)
for layer in downloaded model.layers[1].layers:
 print(layer.trainable,layer.name,layer.dtype policy)
fine_tune_epochs = 5+95
history fine tuned downloaded model = downloaded model.fit(train data,
                                                    epochs = fine tune epochs,
                                                    steps per epoch = len(train data),
                                                    validation_data = test_data,
                                                    validation steps = int(0.15 * len(
                                                    initial epoch=history 101 food cla
                                                    callbacks = [create tensorboard ca
                                                               model checkpoint, ear
    Saving TensorBoard log files to: training logs/efficientnetB0 101 food classes/20220204
    Epoch 3/100
    WARNING:tensorflow:Can save best model only with val acc available, skipping.
    WARNING:tensorflow:Can save best model only with val_acc available, skipping.
    Epoch 4/100
    2368/2368 [============== ] - 297s 125ms/step - loss: 0.5854 - accuracy:
    WARNING:tensorflow:Can save best model only with val_acc available, skipping.
    WARNING:tensorflow:Can save best model only with val acc available, skipping.
    Epoch 5/100
    WARNING:tensorflow:Can save best model only with val_acc available, skipping.
    WARNING:tensorflow:Can save best model only with val acc available, skipping.
    Epoch 6/100
    2368/2368 [============== ] - 299s 126ms/step - loss: 0.1679 - accuracy:
    WARNING:tensorflow:Can save best model only with val acc available, skipping.
    WARNING: tensorflow: Can save best model only with val acc available, skipping.
 plot loss curves(history fine tuned downloaded model)
```



downloaded_model.save("drive/MyDrive/tensorflow_saved_models/101_food_milestone_model+all_lay

INFO:tensorflow:Assets written to: drive/MyDrive/tensorflow_saved_models/101_food_milest INFO:tensorflow:Assets written to: drive/MyDrive/tensorflow saved models/101 food milest

```
downloaded_model.evaluate(test_data)
```

790/790 [============] - 51s 64ms/step - loss: 0.9969 - accuracy: 0.77 [0.9968550205230713, 0.7767128944396973]

!tensorboard dev upload --logdir ./training_logs \

- --name "Transfer learning experiments" \
- --description "A series of different transfer learning experiments with varying amounts of
- --one_shot # exits the uploader when upload has finished

2022-02-04 03:22:50.338829: I tensorflow/stream_executor/platform/default/dso_loader.cc

***** TensorBoard Uploader *****

This will upload your TensorBoard logs to https://tensorboard.dev/ from the following directory:

./training logs

This TensorBoard will be visible to everyone. Do not upload sensitive data.

Your use of this service is subject to Google's Terms of Service https://policies.google.com/terms> and Privacy Policy

https://policies.google.com/privacy, and TensorBoard.dev's Terms of Service https://tensorboard.dev/policy/terms/.

This notice will not be shown again while you are logged into the uploader. To log out, run `tensorboard dev auth revoke`.

Continue? (yes/NO) yes

Please visit this URL to authorize this application: https://accounts.google.com/o/oauthenter the authorization code: 4/1AX4XfWid-qABYP-tn64ui9PR307TGNaK7jpQRBv2QVQZA3HiYWe1Nh

New experiment created. View your TensorBoard at: https://tensorboard.dev/experiment/VV:

```
[2022-02-04T03:23:19] Started scanning logdir.
[2022-02-04T03:23:21] Total uploaded: 28 scalars, 0 tensors, 2 binary objects (2.0 MB)
[2022-02-04T03:23:21] Done scanning logdir.
```

Done. View your TensorBoard at https://tensorboard.dev/experiment/VViGoKOERJC2hVf06yjyiv

completed at 10:23 PM

√ 35s

X