```
In [1]: import numpy as np
          import pandas as pd
          import matplotlib.pyplot as plt
          import keras
In [2]: import tensorflow as tf
          from tensorflow.keras.preprocessing.image import ImageDataGenerator
          from tensorflow.keras import layers
          from tensorflow.keras.callbacks import EarlyStopping
In [3]: # Set up data generators with data augmentation
          train_datagen = ImageDataGenerator(
                zoom_range=0.5,
                                                     # Randomly zoom in/out on the image
                                                    # Randomly Zoom in/out on the image
# Randomly apply shearing transformation
# Rescale pixel values to [0, 1]
# Randomly flip the image horizontally
# Randomly flip the image vertically
                shear_range=0.3,
                rescale=1/255.
                horizontal flip=True,
                vertical_flip=True,
rotation_range=90,
                                                     # Randomly rotate the image between -90 and 90 degrees
                brightness_range=[0.2, 1.0], # Randomly adjust the brightness of the image
          val_datagen = ImageDataGenerator(rescale=1/255)
           # Create a generator for training data with augmentation
          train_generator = train_datagen.flow_from_directory(
               directory='Dataset/train',
                target size=(256, 256),
                batch_size=32,
                class_mode='categorical'
           # Create a generator for validation data without augmentation
          val_generator = val_datagen.flow_from_directory(
    directory='Dataset/valid',
                target_size=(256, 256),
                batch_size=32,
               class_mode='categorical'
          Found 70295 images belonging to 38 classes. Found 17572 images belonging to 38 classes.
In [4]: t_img, label = train_generator.next()
In [5]: t_img.shape
Out[5]: (32, 256, 256, 3)
In [6]: class_names = list(train_generator.class_indices.keys())
          class names
Out[6]: ['Apple__Apple_scab',
             'Apple___Black_rot',
            'Apple___Cedar_apple_rust',
            'Apple___healthy',
'Blueberry___healthy',
            'Cherry_(including_sour)___Powdery_mildew',
            'Cherry_(including_sour)__healthy',
'Corn_(maize)__Cercospora_leaf_spot Gray_leaf_spot',
            'Corn_(maize)__Common_rust_',
'Corn_(maize)__Northern_Leaf_Blight',
            'Corn_(maize) healthy',
'Grape___Black_rot',
'Grape___Esca_(Black_Measles)',
            'Grape___Leaf_blight_(Isariopsis_Leaf_Spot)',
            'Grape__healthy',
'Orange__Haunglongbing_(Citrus_greening)',
'Peach__Bacterial_spot',
            'Peach__healthy',
'Pepper,_bell__Bacterial_spot',
'Pepper,_bell__healthy',
            'Potato___Early_blight',
            'Potato___Late_blight',
             'Potato healthy',
            Raspberry healthy',
'Soybean healthy',
'Squash Powdery mildew',
'Strawberry Leaf_scorch',
'Strawberry healthy',
            'Tomato___Bacterial_spot',
            'Tomato___Early_blight',
            'Tomato___Late_blight',
            'Tomato___Leaf_Mold',
            'Tomato___Septoria_leaf_spot',
'Tomato___Spider_mites Two-spotted_spider_mite',
            'Tomato___Target_Spot',
            'Tomato___Tomato_Yellow_Leaf_Curl_Virus',
            'Tomato___Tomato_mosaic_virus',
'Tomato___healthy']
```

```
In [*]: import matplotlib.pyplot as plt

plt.figure(figsize=(10, 10))
    images, labels = next(train_generator)

for i in range(12):
        ax = plt.subplot(4, 3, i+1)
        plt.imshow(images[i])
        plt.title(class_names[labels[i].argmax()])
        plt.axis("off")
In [8]: # Define the model architecture
model = tf.keras.Sequential([
```

Metal device set to: Apple M1

## In [10]: model.summary()

## Model: "sequential"

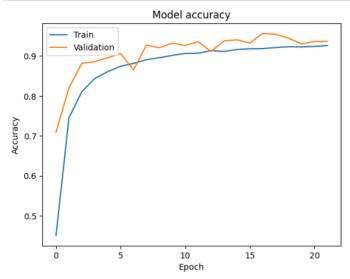
Layer (type)	Output Shape	Param #
conv2d (Conv2D)	(None, 254, 254, 32)	
<pre>max_pooling2d (MaxPooling2D )</pre>	(None, 127, 127, 32)	0
conv2d_1 (Conv2D)	(None, 125, 125, 64)	18496
<pre>max_pooling2d_1 (MaxPooling 2D)</pre>	(None, 62, 62, 64)	0
conv2d_2 (Conv2D)	(None, 60, 60, 128)	73856
<pre>max_pooling2d_2 (MaxPooling 2D)</pre>	(None, 30, 30, 128)	0
conv2d_3 (Conv2D)	(None, 28, 28, 256)	295168
<pre>max_pooling2d_3 (MaxPooling 2D)</pre>	(None, 14, 14, 256)	0
flatten (Flatten)	(None, 50176)	0
dense (Dense)	(None, 512)	25690624
dropout (Dropout)	(None, 512)	0
dense_1 (Dense)	(None, 38)	19494
======================================		=======

Epoch 1/40 2023-04-22 08:53:12.037942: W tensorflow/tsl/platform/profile\_utils/cpu\_utils.cc:128] Failed to get CPU frequency: 0 Hz v: 0.7095 Epoch 2/40 2197/2197 [ ========= ] - 842s 383ms/step - loss: 0.8128 - accuracy: 0.7450 - val loss: 0.5604 - val accurac v: 0.8202 Epoch 3/40 2197/2197 [ y: 0.8818 Epoch 4/40 2197/2197 [ ====== ] - 798s 363ms/step - loss: 0.4987 - accuracy: 0.8436 - val loss: 0.3743 - val accurac y: 0.8860 Epoch 5/40 2197/2197 г y: 0.8958 Epoch 6/40 2197/2197 г ========== 1 - 811s 369ms/step - loss: 0.3939 - accuracy: 0.8745 - val loss: 0.3062 - val accurac y: 0.9062 Epoch 7/40 2197/2197 [= :========= 1 - 818s 372ms/step - loss: 0.3720 - accuracy: 0.8817 - val loss: 0.4674 - val accurac v: 0.8654 Epoch 8/40 2197/2197 [============= ] - 833s 379ms/step - loss: 0.3449 - accuracy: 0.8910 - val\_loss: 0.2446 - val\_accurac v: 0.9274 Epoch 9/40 2197/2197 [ ========] - 807s 367ms/step - loss: 0.3306 - accuracy: 0.8957 - val\_loss: 0.2450 - val\_accurac y: 0.9208 Epoch 10/40 2197/2197 [= :========] - 795s 362ms/step - loss: 0.3201 - accuracy: 0.9017 - val\_loss: 0.2292 - val\_accurac y: 0.9324 Epoch 11/40 2197/2197 [= ======== ] - 799s 364ms/step - loss: 0.2991 - accuracy: 0.9065 - val loss: 0.2582 - val accurac y: 0.9261 Epoch 12/40 2197/2197 [= y: 0.9362 Epoch 13/40 2197/2197 [= y: 0.9116 Epoch 14/40 2197/2197 [= :========= ] - 792s 360ms/step - loss: 0.2845 - accuracy: 0.9116 - val\_loss: 0.2038 - val\_accurac y: 0.9377 Epoch 15/40 2197/2197 г =======] - 775s 353ms/step - loss: 0.2737 - accuracy: 0.9164 - val\_loss: 0.1864 - val\_accurac y: 0.9408 Epoch 16/40 2197/2197 [ ========== ] - 783s 356ms/step - loss: 0.2660 - accuracy: 0.9182 - val loss: 0.2185 - val accurac y: 0.9328 Epoch 17/40 y: 0.9565 Epoch 18/40 2197/2197 [= v: 0.9545 Epoch 19/40 y: 0.9449 Epoch 20/40 2197/2197 [= y: 0.9303 Epoch 21/40 2197/2197 [ ========] - 961s 437ms/step - loss: 0.2517 - accuracy: 0.9242 - val\_loss: 0.2139 - val\_accurac y: 0.9364 Epoch 22/40 y: 0.9368

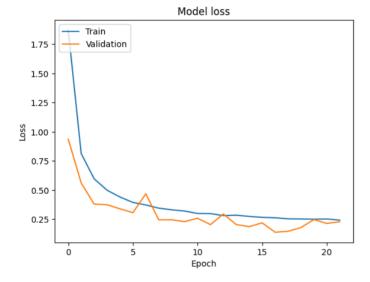
```
In [12]: # # Define early stopping to prevent overfitting
          # early stop = EarlyStopping(monitor='val loss', patience=)
          # # Train the model
          # history = model.fit(
              train generator,
                validation_data=val_generator,
                epochs=40,
callbacks=[early_stop]
In [13]: model.save('my model v5.h5')
In [14]: acc = model.evaluate generator(val generator)[1]
          print(f"The accuracy of your model is {acc *100} %")
          /var/folders/f5/xb4v70_j01j5t85gdv_td55c0000gn/T/ipykernel_8787/2485115042.py:1: UserWarning: `Model.evaluate_generator` is deprecated and will be removed in a future version. Please use `Model.evaluate`, which supports generators.
            acc = model.evaluate_generator(val_generator)[1]
          The accuracy of your model is 93.67744326591492 %
In [15]: ref = dict(zip(list(train_generator.class_indices.values()) , list(train_generator.class_indices.keys())))
In [16]: import pickle
          with open('ref.pickle', 'wb') as handle:
              pickle.dump(ref, handle, protocol=pickle.HIGHEST_PROTOCOL)
In [26]: from keras.models import load_model
    model = load_model("/Users/shankalpapokharel/AI Projects/gpu_ipd/best_model.h5")
In [30]: from tensorflow.keras.preprocessing.image import load_img, img_to_array
          def prediction(path):
               # Load the image and resize it to (256, 256)
              img = load_img(path, target_size = (256, 256))
              # Convert the image to a NumPy array
              x = img_to_array(img)
              # Add an extra dimension to the array to create a batch of size 1
              x = np.expand_dims(x, axis=0)
              # Scale the pixel values to the range [0, 1]
              x = x/255.0
              # Make a prediction using the trained model
              predictions = model.predict(x)
              # Get the index of the predicted class
              pred = np.argmax(predictions)
              # Look up the predicted class name using the ref dictionary
              predicted_class = ref[pred]
              # Calculate the confidence level for the prediction
              confidence = round(100 * np.max(predictions[0]), 2)
              # Return the predicted class name and confidence level
return predicted_class, confidence
In [31]: path = "/Users/shankalpapokharel/AI Projects/gpu_ipd/Dataset/test/AppleCedarRust2.JPG"
In [32]: prediction(path)
          1/1 [======= ] - 1s 778ms/step
Out[32]: ('Apple___Cedar_apple_rust', 99.67)
```

```
In [33]: import matplotlib.pyplot as plt

# Plot training & validation accuracy values
plt.plot(history.history['accuracy'])
plt.plot(history.history['val_accuracy'])
plt.title('Model accuracy')
plt.ylabel('Accuracy')
plt.vlabel('Epoch')
plt.legend(['Train', 'Validation'], loc='upper left')
plt.show()
```



```
In [34]: # Plot training & validation loss values
    plt.plot(history.history['loss'])
    plt.plot(history.history['val_loss'])
    plt.title('Model loss')
    plt.ylabel('Loss')
    plt.xlabel('Epoch')
    plt.legend(['Train', 'Validation'], loc='upper left')
    plt.show()
```



```
In [35]: train generator.class indices
Out[35]: {'Apple__Apple_scab': 0,
                 Apple__Black_rot': 1,
                 'Apple__Cedar_apple_rust': 2,
                 'Apple
                            healthv': 3,
                 'Blueberry healthy': 4,
                 'Cherry_(including_sour)___Powdery_mildew': 5,
                 'Cherry_(including_sour)__healthy': 6,
                 'Corn_(maize)___Cercospora_leaf_spot Gray_leaf_spot': 7,
                'Corn_(maize) __Common_rust_': 8,
'Corn_(maize) __Northern_Leaf_Blight': 9,
                'Corn_(maize) healthy': 10,
'Grape Black_rot': 11,
                 'Grape__Esca_(Black_Measles)': 12,
                 'Grape___Leaf_blight_(Isariopsis_Leaf_Spot)': 13,
                'Grape__ healthy': 14,
'Orange__ Haunglongbing_(Citrus_greening)': 15,
'Peach__ Bacterial_spot': 16,
                'Peach_healthy': 17,
'Pepper,_bell__Bacterial_spot': 18,
'Pepper,_bell__healthy': 19,
                 'Potato__Early_blight': 20,
                 'Potato__Late_blight': 21,
                 'Potato
                             healthy': 22,
                'Raspberry_healthy': 23,
'Soybean_healthy': 24,
                'Squash__Powdery_mildew': 25,
'Strawberry__Leaf_scorch': 26,
                'Strawberry_
                                    __
_healthy': 27,
                'Tomato___Bacterial_spot': 28,
                 'Tomato___Early_blight': 29,
                'Tomato Late blight': 30,
                'Tomato Leaf Mold': 31,
                 'Tomato___Septoria_leaf_spot': 32,
                'Tomato_
                             'Tomato
                 'Tomato___
                               Tomato_Yellow_Leaf_Curl_Virus': 35,
                 'Tomato___Tomato_mosaic_virus': 36,
'Tomato__healthy': 37}
                'Tomato_
In [37]: train_generator.class_indices.keys()
Out[37]: dict_keys(['Apple__Apple_scab', 'Apple__Black_rot', 'Apple__Cedar_apple_rust', 'Apple__healthy', 'Blueberry_healthy', 'Chery_(including_sour)__healthy', 'Corn_(maize)__Cercospora_leaf_spot_Gray_leaf_spot_t', 'Corn_(maize)__Common_rust_', 'Corn_(maize)__Northern_Leaf_Blight', 'Corn_(maize)__healthy', 'Grape__Black_rot', 'Grape__Esca_(Black_Measles)', 'Grape_Leaf_blight_(Isariopsis_Leaf_Spot)', 'Grape_healthy', 'Orange_Haunglongbing_(Citrus_greening)', 'Peach__Bacterial_spot', 'Peach__healthy', 'Peach_healthy', 'Peach_healthy', 'Sobean_healthy', 'Sobean_healthy', 'Squash_Powdery_mildew', 'Strawberry_Leaf_scorch', 'Strawberry_healthy', 'Tomato_Bacterial_spot', 'Tomato_Early_blight', 'Tomato_Late_blight', 'Tomato_Late_blight', 'Tomato_Late_blight', 'Tomato_Late_blight', 'Tomato_Late_blight', 'Tomato_Late_blight', 'Tomato_Tomato_Tomato_Mosaic_virus', 'Tomato_healthy'])
In [38]: list(train generator.class indices.keys())
Out[38]: ['Apple__Apple_scab',
                 'Apple___Black_rot',
'Apple___Cedar_apple_rust',
                 'Apple__healthy',
'Blueberry__healthy',
                 'Cherry_(including_sour)___Powdery_mildew',
                 'Cherry_(including_sour)__healthy'
                 'Corn_(maize)___Cercospora_leaf_spot Gray_leaf_spot',
                 'Corn_(maize)__Common_rust_
                 'Corn_(maize)___Northern_Leaf_Blight',
                 'Corn_(maize)__healthy'
                 'Grape___Black_rot',
                 'Grape___Esca_(Black_Measles)'
                 'Grape__Leaf_blight_(Isariopsis_Leaf_Spot)',
                 'Grape__healthy',
'Orange__Haunglongbing_(Citrus_greening)',
                 'Peach__Bacterial_spot',
                           healthy',
                 'Peach
                 'Pepper,_bell___Bacterial_spot',
                'Pepper,_bell__healthy',
'Potato__Early_blight',
                 'Potato__Late_blight',
                Potato healthy',
'Raspberry healthy',
'Soybean healthy',
'Squash Powdery mildew'
                 'Strawberry___Leaf_scorch',
                                    healthy',
                 'Strawberry_
                'Tomato___Bacterial_spot',
                'Tomato___Early_blight',
'Tomato___Late_blight',
                'Tomato Leaf Mold',
                 'Tomato___Septoria_leaf_spot',
                             ____Spider_mites Two-spotted_spider_mite',
_Target_Spot',
                 'Tomato
                'Tomato
                 'Tomato___Tomato_Yellow_Leaf_Curl_Virus',
                 'Tomato
                               _Tomato_mosaic_virus',
                'Tomato_
                             healthv'l
In [39]: r = dict(zip(list(train_generator.class_indices.values()) , list(train_generator.class_indices.keys())))
```

```
In [40]: print(r)
          {0: 'Apple__Apple_scab', 1: 'Apple__Black_rot', 2: 'Apple__Cedar_apple_rust', 3: 'Apple__healthy', 4: 'Blueberry_healthy', 5: 'Cherry_(including_sour)__Powdery_mildew', 6: 'Cherry_(including_sour)_healthy', 7: 'Corn_(maize)__Cercospora_leaf_spot G ray_leaf_spot', 8: 'Corn_(maize)__Common_rust_', 9: 'Corn_(maize)__Northern_Leaf_Blight', 10: 'Corn_(maize)_healthy', 11: 'G rape__Black_rot', 12: 'Grape__Esca_(Black_Measles)', 13: 'Grape__Leaf_blight_(Isariopsis_Leaf_Spot)', 14: 'Grape__healthy', 15: 'Orange__Haunglongbing_(Citrus_greening)', 16: 'Peach__Bacterial_spot', 17: 'Peach__healthy', 18: 'Pepper, bell__healthy', 20: 'Potato___Early_blight', 21: 'Potato__Late_blight', 22: 'Potato__healthy', 23: 'Ra spberry__healthy', 24: 'Soybean__healthy', 25: 'Squash__Powdery_mildew', 26: 'Strawberry__Leaf_scorch', 27: 'Strawberry__healthy', 28: 'Tomato___Bacterial_spot', 29: 'Tomato__Early_blight', 30: 'Tomato__Late_blight', 31: 'Tomato__Leaf_Mold', 32: 'Tomato__Septoria_leaf_spot', 33: 'Tomato__Tomato_mosaic_virus', 37: 'Tomato__healthy'}
In [44]: import os
           test_dir = '/Users/shankalpapokharel/AI Projects/gpu_ipd/Dataset/test/'
           for filename in os.listdir(test dir):
               try:
                    path = os.path.join(test_dir, filename)
                    predicted_class, confidence = prediction(path)
print(f"File: {filename}, Predicted class: {predicted_class}, Confidence: {confidence}%")
               except:
                    print("Couldn't read the file")
           1/1 [======] - 0s 20ms/step
           File: AppleScab3.JPG, Predicted class: Potato Early blight, Confidence: 95.59%
                                     File: TomatoEarlyBlight2.JPG, Predicted class: Tomato_
                               ====== | - 0s 10ms/step
           File: TomatoEarlyBlight3.JPG, Predicted class: Tomato
                                                                             Early blight, Confidence: 99.03%
                                               =====] - 0s 11ms/step
           File: PotatoHealthy1.JPG, Predicted class: Potato__healthy, Confidence: 100.0%
                                          ======= | - 0s 13ms/step
           File: AppleScab2.JPG, Predicted class: Apple Apple scab, Confidence: 100.0%
                                         =======] - 0s 13ms/step
           File: TomatoEarlyBlight1.JPG, Predicted class: Tomato_
                                                                             Early blight, Confidence: 95.98%
           1/1 [====
                                      ======== 1 - 0s 14ms/step
           File: PotatoHealthy2.JPG, Predicted class: Potato_healthy, Confidence: 99.99%
                                          ======] - 0s 13ms/step
           File: AppleScab1.JPG, Predicted class: Cherry_(including_sour)___Powdery_mildew, Confidence: 77.53%
                                     ======] - 0s 13ms/step
           1/1 [==:
           File: TomatoEarlyBlight4.JPG, Predicted class: Tomato___Early_blight, Confidence: 100.0%
           Couldn't read the file
           1/1 [======
                                  ======] - 0s 15ms/step
           File: TomatoEarlyBlight5.JPG, Predicted class: Tomato Early blight, Confidence: 97.38%
                                                 ===] - 0s 12ms/step
           File: TomatoEarlyBlight6.JPG, Predicted class: Tomato___Early_blight, Confidence: 99.55%
           1/1 [===
                                               =====1 - 0s 12ms/step
           File: PotatoEarlyBlight4.JPG, Predicted class: Potato
                                                                             Early blight, Confidence: 100.0%
                                                       - 0s 13ms/step
           File: PotatoEarlyBlight5.JPG, Predicted class: Potato___Early_blight, Confidence: 100.0%
           1/1 [===
                                              =====] - 0s 14ms/step
           File: PotatoEarlyBlight2.JPG, Predicted class: Potato___Early_blight, Confidence: 100.0%
                                               ====] - 0s 13ms/step
           File: PotatoEarlyBlight3.JPG, Predicted class: Apple
                                                                           healthy, Confidence: 98.33%
           1/1 [=
                                               ====1 - 0s 13ms/step
           File: PotatoEarlyBlight1.JPG, Predicted class: Potato___Early_blight, Confidence: 100.0%
           I/1 [=============] - 0s 14ms/step
File: TomatoYellowCurlVirus2.JPG, Predicted class: Tomato__Tomato_Yellow_Leaf_Curl_Virus, Confidence: 100.0%
                                       ======= | - 0s 12ms/step
           File: TomatoYellowCurlVirus3.JPG, Predicted class: Tomato___Tomato__Yellow_Leaf_Curl_Virus, Confidence: 97.19%
                                        ======] - 0s 14ms/step
           File: TomatoYellowCurlVirus1.JPG, Predicted class: Tomato___Tomato_Yellow_Leaf_Curl_Virus, Confidence: 100.0%
                                                    == 1 - 0s 13ms/step
           File: TomatoHealthy4.JPG, Predicted class: Tomato_healthy, Confidence: 100.0%
           1/1 [========] - 0s 11ms/step
File: TomatoYellowCurlVirus4.JPG, Predicted class: Tomato Yellow Leaf Curl Virus, Confidence: 100.0%
                                                   ==] - 0s 13ms/step
           File: TomatoHealthy1.JPG, Predicted class: Tomato__healthy, Confidence: 100.0%
                                              =====] - 0s 13ms/step
           File: TomatoYellowCurlVirus5.JPG, Predicted class: Tomato
                                                                                 Tomato Yellow Leaf Curl Virus, Confidence: 100.0%
                                                       - 0s 13ms/step
           File: TomatoHealthy3.JPG, Predicted class: Tomato_
                                                                        healthy, Confidence: 100.0%
                                          ======] - 0s 13ms/step
           File: TomatoHealthy2.JPG, Predicted class: Tomato
                                                                        healthy, Confidence: 99.74%
                                              =====] - 0s 13ms/step
           File: TomatoYellowCurlVirus6.JPG, Predicted class: Tomato_
                                                                                 _Tomato_Yellow_Leaf_Curl_Virus, Confidence: 100.0%
                                       ======== 1 - 0s 13ms/step
           1/1 [=====
           File: AppleCedarRust2.JPG, Predicted class: Apple__Cedar_apple_rust, Confidence: 99.67%
                                               =====] - 0s 13ms/step
           File: CornCommonRust1.JPG, Predicted class: Corn_(maize)_
                                                                                __Common_rust_, Confidence: 99.93%
           1/1 [=====] - 0s 31ms/step
           File: AppleCedarRust3.JPG, Predicted class: Apple__Cedar_apple_rust, Confidence: 56.0%
                                           ======] - 0s 12ms/step
           File: AppleCedarRust1.JPG, Predicted class: Apple
                                                                        Cedar apple rust, Confidence: 94.18%
           1/1 [======= ] - 0s 15ms/step
           File: CornCommonRust3.JPG, Predicted class: Corn_(maize)___Common_rust_, Confidence: 100.0%
                                 File: AppleCedarRust4.JPG, Predicted class: Apple_
                                                                        Cedar apple rust, Confidence: 99.94%
 In [ ]:
 In [ ]:
In [62]: path = "/Users/shankalpapokharel/Downloads/7.jpg"
```