!pip install tensorflow-gpu==2.0.0 Collecting tensorflow-gpu==2.0.0 Downloading https://files.pythonhosted.org/packages/25/44/47f0722aea081697143fbcf5d2aa | 380.8MB 43kB/s Requirement already satisfied: wheel>=0.26 in /usr/local/lib/python3.6/dist-packages (fr Requirement already satisfied: grpcio>=1.8.6 in /usr/local/lib/python3.6/dist-packages (Requirement already satisfied: protobuf>=3.6.1 in /usr/local/lib/python3.6/dist-packages Requirement already satisfied: astor>=0.6.0 in /usr/local/lib/python3.6/dist-packages (f Requirement already satisfied: numpy<2.0,>=1.16.0 in /usr/local/lib/python3.6/dist-packa Collecting tensorflow-estimator<2.1.0,>=2.0.0 Downloading https://files.pythonhosted.org/packages/fc/08/8b927337b7019c374719145d1dce | 450kB 54.2MB/s Requirement already satisfied: wrapt>=1.11.1 in /usr/local/lib/python3.6/dist-packages (Requirement already satisfied: opt-einsum>=2.3.2 in /usr/local/lib/python3.6/dist-packag Requirement already satisfied: six>=1.10.0 in /usr/local/lib/python3.6/dist-packages (fr Requirement already satisfied: keras-preprocessing>=1.0.5 in /usr/local/lib/python3.6/di Collecting tensorboard<2.1.0,>=2.0.0 Downloading https://files.pythonhosted.org/packages/76/54/99b9d5d52d5cb732f099baaaf774 | 3.8MB 71.6MB/s Requirement already satisfied: keras-applications>=1.0.8 in /usr/local/lib/python3.6/dis Requirement already satisfied: absl-py>=0.7.0 in /usr/local/lib/python3.6/dist-packages Requirement already satisfied: gast==0.2.2 in /usr/local/lib/python3.6/dist-packages (fr Requirement already satisfied: termcolor>=1.1.0 in /usr/local/lib/python3.6/dist-package Requirement already satisfied: google-pasta>=0.1.6 in /usr/local/lib/python3.6/dist-pack Requirement already satisfied: setuptools in /usr/local/lib/python3.6/dist-packages (fro Requirement already satisfied: werkzeug>=0.11.15 in /usr/local/lib/python3.6/dist-packag Requirement already satisfied: google-auth<2,>=1.6.3 in /usr/local/lib/python3.6/dist-pa Requirement already satisfied: markdown>=2.6.8 in /usr/local/lib/python3.6/dist-packages Requirement already satisfied: google-auth-oauthlib<0.5,>=0.4.1 in /usr/local/lib/python Requirement already satisfied: requests<3,>=2.21.0 in /usr/local/lib/python3.6/dist-pack Requirement already satisfied: h5py in /usr/local/lib/python3.6/dist-packages (from kera Requirement already satisfied: pyasn1-modules>=0.2.1 in /usr/local/lib/python3.6/dist-pa Requirement already satisfied: cachetools<3.2,>=2.0.0 in /usr/local/lib/python3.6/dist-p Requirement already satisfied: rsa<4.1,>=3.1.4 in /usr/local/lib/python3.6/dist-packages Requirement already satisfied: requests-oauthlib>=0.7.0 in /usr/local/lib/python3.6/dist Requirement already satisfied: idna<2.9,>=2.5 in /usr/local/lib/python3.6/dist-packages Requirement already satisfied: certifi>=2017.4.17 in /usr/local/lib/python3.6/dist-packa Requirement already satisfied: urllib3<1.25,>=1.21.1 in /usr/local/lib/python3.6/dist-pa Requirement already satisfied: chardet<3.1.0,>=3.0.2 in /usr/local/lib/python3.6/dist-pa Requirement already satisfied: pyasn1<0.5.0,>=0.4.6 in /usr/local/lib/python3.6/dist-pac Requirement already satisfied: oauthlib>=3.0.0 in /usr/local/lib/python3.6/dist-packages ERROR: tensorflow 1.15.0 has requirement tensorboard<1.16.0,>=1.15.0, but you'll have te ERROR: tensorflow 1.15.0 has requirement tensorflow-estimator==1.15.1, but you'll have t ERROR: tensorflow-federated 0.12.0 has requirement tensorflow~=2.1.0, but you'll have te ERROR: tensorflow-federated 0.12.0 has requirement tensorflow-addons~=0.7.0, but you'll Installing collected packages: tensorflow-estimator, tensorboard, tensorflow-gpu Found existing installation: tensorflow-estimator 1.15.1 Uninstalling tensorflow-estimator-1.15.1: Successfully uninstalled tensorflow-estimator-1.15.1 Found existing installation: tensorboard 1.15.0 Uninstalling tensorboard-1.15.0:

https://colab.research.google.com/drive/1eW5Hm81vpEEMchkph6RdxftgnDCab9ed#scrollTo=U HKiBH03ah8&printMode=true

Successfully installed tensorboard-2.1.1 tensorflow-estimator-2.1.0 tensorflow-gpu-2.0.0

Successfully uninstalled tensorboard-1.15.0

```
!pip install tensorflow-hub
```

```
Requirement already satisfied: tensorflow-hub in /usr/local/lib/python3.6/dist-packages
     Requirement already satisfied: protobuf>=3.4.0 in /usr/local/lib/python3.6/dist-packages
     Requirement already satisfied: numpy>=1.12.0 in /usr/local/lib/python3.6/dist-packages (
     Requirement already satisfied: six>=1.10.0 in /usr/local/lib/python3.6/dist-packages (fr
     Requirement already satisfied: setuptools in /usr/local/lib/python3.6/dist-packages (fro
from future import absolute import, division, print function, unicode literals
import tensorflow as tf
import tensorflow hub as hub
import os
from tensorflow.keras.layers import Dense, Flatten, Conv2D
from tensorflow.keras import Model
from tensorflow.keras.preprocessing.image import ImageDataGenerator
from tensorflow.keras.optimizers import Adam
from tensorflow.keras import layers
Loading the data
zip_file=tf.keras.utils.get_file(origin='https://storage.googleapis.com/plantdata/PlantVillag
fname='PlantVillage.zip', extract=True)
```

```
zip_file=tf.keras.utils.get_file(origin='https://storage.googleapis.com/plantdata/PlantVillag
fname='PlantVillage.zip', extract=True)
# Create the training and validation directories
data_dir = os.path.join(os.path.dirname(zip_file), 'PlantVillage')
train_dir = os.path.join(data_dir, 'train')
validation_dir = os.path.join(data_dir, 'validation')
```

Label Mapping

```
!wget https://github.com/obeshor/Plant-Diseases-Detector/archive/master.zip
!unzip master.zip;
import json
with open('Plant-Diseases-Detector-master/categories.json', 'r') as f:
    cat_to_name = json.load(f)
    classes = list(cat_to_name.values())

print (classes)
```

```
--2020-03-22 17:38:36-- https://github.com/obeshor/Plant-Diseases-Detector/archive/mast
Resolving github.com (github.com)... 140.82.112.4
Connecting to github.com (github.com) | 140.82.112.4 | :443... connected.
HTTP request sent, awaiting response... 302 Found
Location: <a href="https://codeload.github.com/obeshor/Plant-Diseases-Detector/zip/master">https://codeload.github.com/obeshor/Plant-Diseases-Detector/zip/master</a> [follow
--2020-03-22 17:38:37-- <a href="https://codeload.github.com/obeshor/Plant-Diseases-Detector/zip">https://codeload.github.com/obeshor/Plant-Diseases-Detector/zip</a>
Resolving codeload.github.com (codeload.github.com)... 140.82.113.9
Connecting to codeload.github.com (codeload.github.com) | 140.82.113.9 | :443... connected.
HTTP request sent, awaiting response... 200 OK
Length: unspecified [application/zip]
Saving to: 'master.zip'
master.zip
                         <=>
                                               1
                                                   2.25M 11.0MB/s
                                                                       in 0.2s
2020-03-22 17:38:37 (11.0 MB/s) - 'master.zip' saved [2358172]
Archive: master.zip
59c418921242879a6aa5378175076bf7f39a84fe
   creating: Plant-Diseases-Detector-master/
   creating: Plant-Diseases-Detector-master/GreenDoctor/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.gitignore
   creating: Plant-Diseases-Detector-master/GreenDoctor/.idea/
   creating: Plant-Diseases-Detector-master/GreenDoctor/.idea/codeStyles/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/codeStyles/Project.xml
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/codeStyles/codeStyleConfig
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/encodings.xml
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/gradle.xml
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/misc.xml
  inflating: Plant-Diseases-Detector-master/GreenDoctor/.idea/runConfigurations.xml
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/
 extracting: Plant-Diseases-Detector-master/GreenDoctor/app/.gitignore
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/build.gradle
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/proguard-rules.pro
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/java/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/java/isomora
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/java/isomora
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/java/isomora
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/androidTest/java/isomora
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/AndroidManifest.xml
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/assets/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/assets/plant_labels
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/assets/soybean.JPG
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/ic launcher-web.png
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/isomora/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/isomora/com/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/isomora/com/gr
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/isomora/com/gr
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/java/isomora/com/gr
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/drawable-v24/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/drawable-v24/ic
   creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/drawable/
  inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/drawable/ic lau
```

```
creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/layout/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/layout/activity
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-anydpi-v
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-anydpi-v
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-anydpi-v
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-hdpi/
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-hdpi/ic_
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-hdpi/ic
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-hdpi/ic
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-mdpi/
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-mdpi/ic_
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-mdpi/ic
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-mdpi/ic_
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xhdpi/
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xhdpi/ic
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xhdpi/ic
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xhdpi/ic
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxhdpi/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxhdpi/i
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxhdpi/i
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxhdpi/i
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxxhdpi/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxxhdpi/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxxhdpi/
extracting: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/mipmap-xxxhdpi/
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/values/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/values/colors.x
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/values/ic launc
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/values/strings.
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/main/res/values/styles.x
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/java/
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/java/isomora/
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/java/isomora/com/
  creating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/java/isomora/com/gr
 inflating: Plant-Diseases-Detector-master/GreenDoctor/app/src/test/java/isomora/com/gr
 inflating: Plant-Diseases-Detector-master/GreenDoctor/build.gradle
 inflating: Plant-Diseases-Detector-master/GreenDoctor/gradle.properties
  creating: Plant-Diseases-Detector-master/GreenDoctor/gradle/
  creating: Plant-Diseases-Detector-master/GreenDoctor/gradle/wrapper/
 inflating: Plant-Diseases-Detector-master/GreenDoctor/gradle/wrapper/gradle-wrapper.ja
 inflating: Plant-Diseases-Detector-master/GreenDoctor/gradle/wrapper/gradle-wrapper.pr
 inflating: Plant-Diseases-Detector-master/GreenDoctor/gradlew
 inflating: Plant-Diseases-Detector-master/GreenDoctor/gradlew.bat
extracting: Plant-Diseases-Detector-master/GreenDoctor/settings.gradle
 inflating: Plant-Diseases-Detector-master/Plant Diseases Detection with TF2 V2.ipynb
 inflating: Plant-Diseases-Detector-master/Plant Diseases Detection with TF2 V4.ipynb
 inflating: Plant-Diseases-Detector-master/README.md
 inflating: Plant-Diseases-Detector-master/ config.yml
  creating: Plant-Diseases-Detector-master/assets/
 inflating: Plant-Diseases-Detector-master/assets/PlantVillagefarmer.jpg
 inflating: Plant-Diseases-Detector-master/assets/detect crop disease in africa.jpg
 inflating: Plant-Diseases-Detector-master/assets/greendoctor.png
 inflating: Plant-Diseases-Detector-master/assets/over.png
 inflating: Plant-Diseases-Detector-master/categories.json
['Apple___Apple_scab', 'Apple___Black_rot', 'Apple___Cedar_apple_rust', 'Apple___healthy
```

Transfer Learning with TensorFlow Hub

```
pixels = 299
FV SIZE = 2048
MODULE HANDLE = "https://tfhub.dev/google/tf2-preview/inception v3/feature vector/4"
IMAGE SIZE = (pixels, pixels)
BATCH SIZE = 64
Data Processing
# Inputs are suitably resized for the selected module
validation datagen = tf.keras.preprocessing.image.ImageDataGenerator(rescale = 1./255)
validation generator = validation datagen.flow from directory(
    validation dir,
    shuffle = False,
    color mode = "rgb",
    class mode = "categorical",
    target size = IMAGE SIZE,
    batch size = BATCH SIZE)
do data augmentation = True
if do data augmentation:
  train datagen = tf.keras.preprocessing.image.ImageDataGenerator(
      rescale = 1./255,
      rotation_range = 40,
      horizontal_flip = True,
      width shift range = 0.2,
      height shift range = 0.2,
      shear_range = 0.2,
      zoom_range = 0.2,
      fill mode = 'nearest')
else:
  train_datagen = validation_datagen
train_generator = train_datagen.flow_from_directory(
    train dir,
    subset = "training",
    shuffle = True,
    seed = 42,
    color mode = "rgb",
    class mode = "categorical",
    target_size=IMAGE_SIZE,
    batch size=BATCH SIZE)
    Found 10861 images belonging to 38 classes.
     Found 43444 images belonging to 38 classes.
```

Build the Model

```
feature_extractor = hub.KerasLayer(MODULE_HANDLE,
                                   input shape=IMAGE SIZE+(3,),
                                   output shape=[FV SIZE])
do_fine_tuning = False
if do fine tuning:
  feature_extractor.trainable = True
  # unfreeze some layers of base network for fine-tuning
  for layer in feature extractor.layers[-30:]:
    layer.trainable =True
else:
  feature extractor.trainable = False
model = tf.keras.Sequential([
    feature extractor,
    tf.keras.layers.Flatten(),
    tf.keras.layers.Dense(512, activation='relu'),
    tf.keras.layers.Dropout(rate=0.2),
    tf.keras.layers.Dense(train generator.num classes, activation='softmax',
                           kernel regularizer=tf.keras.regularizers.l2(0.0001))
])
Specifying Loss Function and Optimizer
#Compile model specifying the optimizer learning rate
                                                                                      LEARNING
LEARNING RATE = 0.001 #@param {type:"number"}
model.compile(
  optimizer=tf.keras.optimizers.Adam(lr=LEARNING RATE),
   loss='categorical crossentropy',
  metrics=['accuracy'])
Double-click (or enter) to edit
Training the Model
EPOCHS=10
STEPS_EPOCHS = train_generator.samples//train_generator.batch_size
VALID STEPS=validation generator.samples//validation generator.batch size
history = model.fit_generator(
          train_generator,
          steps per epoch=STEPS EPOCHS,
          epochs=EPOCHS,
```

validation data=validation generator.

```
validation_steps=VALID_STEPS)
```

Checking Performance

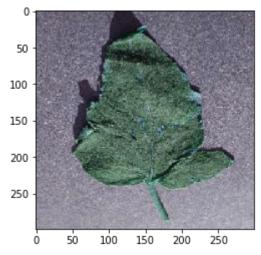
```
import matplotlib.pylab as plt
import numpy as np
acc = history.history['accuracy']
val_acc = history.history['val_accuracy']
loss = history.history['loss']
val loss = history.history['val loss']
epochs range = range(EPOCHS)
plt.figure(figsize=(8, 8))
plt.subplot(1, 2, 1)
plt.plot(epochs range, acc, label='Training Accuracy')
plt.plot(epochs range, val acc, label='Validation Accuracy')
plt.legend(loc='lower right')
plt.title('Training and Validation Accuracy')
plt.ylabel("Accuracy (training and validation)")
plt.xlabel("Training Steps")
plt.subplot(1, 2, 2)
plt.plot(epochs range, loss, label='Training Loss')
plt.plot(epochs range, val loss, label='Validation Loss')
plt.legend(loc='upper right')
plt.title('Training and Validation Loss')
plt.ylabel("Loss (training and validation)")
plt.xlabel("Training Steps")
plt.show()
С⇒
     NameError
                                                Traceback (most recent call last)
     <ipython-input-1-91320fedef2f> in <module>()
           2 import matplotlib.pylab as plt
           3 import numpy as np
     ----> 4 acc = history.history['accuracy']
           5 val acc = history.history['val accuracy']
           6 loss = history.history['loss']
     NameError: name 'history' is not defined
      SEARCH STACK OVERFLOW
```

Random Test

```
# Import OpenCV
import cv2
# Utility
import itertools
import random
from collections import Counter
from glob import iglob
def load image(filename):
   img = cv2.imread(os.path.join(data_dir, validation_dir, filename))
   img = cv2.resize(img, (IMAGE_SIZE[0], IMAGE_SIZE[1]) )
   img = img / 255
   return img
def predict(image):
   probabilities = model.predict(np.asarray([img]))[0]
   class idx = np.argmax(probabilities)
   return {classes[class_idx]: probabilities[class_idx]}
for idx, filename in enumerate(random.sample(validation_generator.filenames, 5)):
   print("SOURCE: class: %s, file: %s" % (os.path.split(filename)[0], filename))
   img = load image(filename)
   prediction = predict(img)
   print("PREDICTED: class: %s, confidence: %f" % (list(prediction.keys())[0], list(predicti
   plt.imshow(img)
   plt.figure(idx)
   plt.show()
```

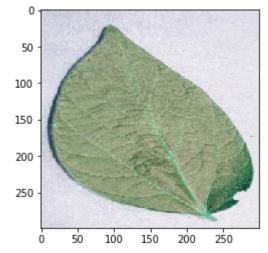
Г⇒

SOURCE: class: Tomato___Target_Spot, file: Tomato___Target_Spot/b1daf6e8-612f-469c-9a22-PREDICTED: class: Tomato___Spider_mites Two-spotted_spider_mite, confidence: 0.531647

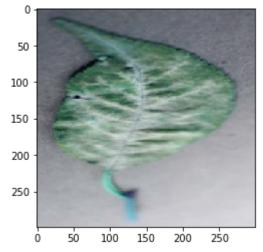


<Figure size 432x288 with 0 Axes>

SOURCE: class: Soybean___healthy, file: Soybean___healthy/8851e67a-5530-4c9e-868c-9efa4d PREDICTED: class: Soybean___healthy, confidence: 0.999971



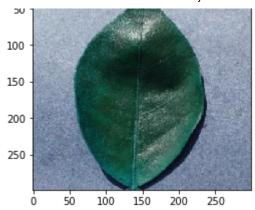
SOURCE: class: Cherry_(including_sour)___Powdery_mildew, file: Cherry_(including_sour)___PREDICTED: class: Cherry_(including_sour)___Powdery_mildew, confidence: 0.999121



<Figure size 432x288 with 0 Axes>

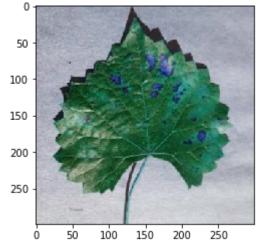
SOURCE: class: Orange___Haunglongbing_(Citrus_greening), file: Orange___Haunglongbing_(C PREDICTED: class: Orange Haunglongbing (Citrus greening), confidence: 0.999979





<Figure size 432x288 with 0 Axes>

SOURCE: class: Grape___Esca_(Black_Measles), file: Grape___Esca_(Black_Measles)/c6701b18 PREDICTED: class: Grape___Esca_(Black_Measles), confidence: 0.968418



<Figure size 432x288 with 0 Axes>