```
# IMAGEN
#----IMPORTS-----
import os
import numpy as np
import cv2
import matplotlib.pylab as plt
from sklearn.cluster import KMeans
import joblib
from scipy.spatial.distance import cdist
import math
import librosa
import librosa.display
from sklearn.decomposition import PCA
from sklearn.preprocessing import StandardScaler
import sounddevice as sd
from scipy.signal import butter, lfilter
import soundfile as sf
import warnings
warnings.filterwarnings("ignore", message="Empty filters detected in mel
frequency basis", category=UserWarning)
#-----PATHS-----PATHS-----
image_path = './dataset/images'
shelfs_path = os.path.join(image_path, 'test')
shelf_names = ['shelf1', 'shelf2', 'shelf3', 'shelf4']
training data = './implementation/images/kmeans/training data.pkl'
#----- CON IMAGENES-----
shelf files = dict()
for shelf in shelf names:
   shelf dir = os.path.join(shelfs_path, shelf)
   shelf original = os.path.join(shelf dir, 'original')
   image files = os.listdir(shelf original)
   shelf files[shelf] = os.path.join(shelf original, image files[0])
#----- THE TECHNIC PROCESAMIENTO DE IMAGENES-----
def get light background (mask, f = 20, p = 0.75):
   height, width = mask.shape
   cluster_size = min([height, width])//f
   cluster = np.ones((cluster size, cluster size), np.uint8)
   # Corners
   corner1 = np.bitwise and(cluster, mask[:cluster size,
:cluster size])
    corner2 = np.bitwise and(cluster, mask[:cluster size:, -
cluster size:])
   corner3 = np.bitwise and(cluster, mask[-cluster size:,
:cluster size])
   corner4 = np.bitwise and(cluster, mask[-cluster size:, -
cluster size:])
    corners = [corner1, corner2, corner3, corner4]
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# Sides
    limitw1 = (width - cluster size)//2
    limitw2 = (width + cluster size)//2
    limith1 = (height - cluster size)//2
    limith2 = (height + cluster size)//2
    side1 = np.bitwise and(cluster, mask[:cluster size,
limitw1:limitw2])
    side2 = np.bitwise and(cluster, mask[limith1:limith2,
:cluster size])
    side3 = np.bitwise and(cluster, mask[limith1:limith2, -
cluster size:])
    side4 = np.bitwise and(cluster, mask[-cluster size:,
limitw1:limitw2])
    sides = [side1, side2, side3, side4]
    # Determining the type of background
            = corners + sides
    light background = sum(np.count nonzero(edge) for edge in edges) >
p*8*(cluster size**2)
    # Inverting if dark background
    if light background:
       return np.bitwise not(mask)
    return mask
#-----BTENCIÓN DE MÁSCARAS-----
os.system('cls')
print('Procesando las imagenes...')
for shelf, file in shelf files.items():
    # BGR image
    image = cv2.imread(file)
    # Dimenssions
    height, width, = image.shape
    # Pixel data vector
    data vector = np.zeros((height * width, 4))
    # Obtener matrices del espacio de colores
    rgb matrix = image.reshape((-1, 3))
    hsv matrix = cv2.cvtColor(image, cv2.COLOR BGR2HSV).reshape((-1, 3))
    lab matrix = cv2.cvtColor(image, cv2.COLOR BGR2LAB).reshape((-1, 3))
    # Asignar a la matriz de datos
    # Conservamos el canal G, S, A y B
    data vector[:, 0] = rgb matrix[:, 2]
    data vector[:, 1] = hsv matrix[:, 1]
    data vector[:, 2:] = lab matrix[:, 1:]
    # Segmentamos la imagen con los vectores obtenidos pos cada pixel
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kmeans = KMeans(n_clusters = 2, n_init = 10, random_state=42) # 2
Clusters. Background and fruit
    kmeans.fit(data vector)
    # Get clusters labels
    labels = kmeans.labels
    # kmeans mask
    kmeans mask = labels.reshape(height, width)
    kmeans mask = kmeans mask.astype(np.uint8) * 255
    # Determinación del tipo de fondo de la máscara
    kmeans mask = get light background(kmeans mask)
    # Erosion y dilatación sobre la màscara
    erosion size = min([height, width])//200
    dilatacion\_size = min([height, width])//80
    kernel_erosion = np.ones((erosion_size,erosion_size), np.uint8)
eroded = cv2.erode(kmeans_mask, kernel_erosion, iterations
= 1)
    kernel dilatacion = np.ones((dilatacion size, dilatacion size),
np.uint8)
    kmeans mask = cv2.dilate(eroded, kernel dilatacion, iterations
= 2)
    # Encontrar contornos
    kmeans_cnt, _ = cv2.findContours(kmeans mask, cv2.RETR EXTERNAL,
cv2.CHAIN APPROX SIMPLE)
    kmeans cnt = max(kmeans cnt, key = cv2.contourArea)
    # Contorno aproximado
    epsilon = 0.001 * cv2.arcLength(kmeans cnt, True)
    kmeans_cnt = cv2.approxPolyDP(kmeans_cnt, epsilon, True)
kmeans_cnt = (kmeans_cnt,)
    # Template
                = np.zeros((height, width), dtype=np.uint8)
    tkmeans
    # Dibujar
    cv2.drawContours(tkmeans, kmeans cnt, -1, 255, thickness =
cv2.FILLED)
    # Guardar mascara
    cv2.imwrite(os.path.join(shelfs path,
f"{shelf}/processed/{os.path.basename(file)}"), tkmeans)
#----- DICCIONARIO DE MASCARAS-----
shelf masks = dict()
for shelf in shelf names:
    shelf_dir = os.path.join(shelfs_path, shelf)
    shelf_mask = os.path.join(shelf_dir, 'processed')
    mask files = os.listdir(shelf mask)
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shelf_masks[shelf] = os.path.join(shelf_mask, mask_files[0])
#-----RANGOS DE COLOR---------
lower red 2 = np.array([170, 60, 60])
upper red 2 = np.array([179, 255, 255])
lower red 1 = np.array([0, 60, 60])
upper red 1 = np.array([8, 255, 255])
lower orange = np.array([8, 120, 80])
upper orange = np.array([21, 255, 255])
lower yellow = np.array([21, 50, 80])
upper yellow = np.array([25, 255, 255])
lower green = np.array([25, 40, 40])
upper green = np.array([100, 255, 255])
#----- #----- #----- EXTRACCIÓN DE CARACTERÍSTICAS IMAGENES------
print('Extrayendo características de las imagenes...')
conversion color = { 'V' :-20, 'R' : -10, 'A' : 10, 'N' : 20}
image features = dict.fromkeys(shelf names)
for shelf, image file, mask file in zip(shelf files.keys(),
shelf files.values(), shelf masks.values()):
    # Leer la imagen y la máscara
    image = cv2.imread(image file)
    mask = cv2.imread(mask file, cv2.IMREAD GRAYSCALE)
    # Convertir la imagen de BGR a HSV
    hsv image = cv2.cvtColor(image, cv2.COLOR BGR2HSV)
    # Aplicar la máscara
    fruit = cv2.bitwise and(hsv image, hsv image, mask=mask)
    #-----Extracción de los momentos de Hu-----Extracción de los momentos de Hu-----
    # Encontrar el rectángulo delimitador de la fruta
    (x, y, w, h) = cv2.boundingRect(mask)
    # Recortar la imagen original para obtener solo la región de la fruta
    trimed = fruit[y:y + h, x:x + w]
    # Convertir la imagen a escala de grises si es necesario
    trimed gray = cv2.cvtColor(trimed, cv2.COLOR BGR2GRAY)
    # Calcular los momentos de la imagen
    momentos = cv2.moments(trimed gray)
    # Calcular los momentos de Hu
    momentos hu = cv2.HuMoments(momentos)
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# Aplicar logaritmo a los momentos de Hu para mejorar la escala
   log moments hu = -np.sign(momentos hu) *
np.log10(np.abs(momentos hu))
   moments = log moments hu.reshape(-1)
   #-----Extracción de color-----
   conteo = {
       'V' : np.sum(np.all(np.logical and(lower green <= fruit, fruit</pre>
<= upper green), axis=-1)),
       'R1': np.sum(np.all(np.logical and(lower red 1 <= fruit, fruit</pre>
<= upper red 1), axis=-1)),
       'R2': np.sum(np.all(np.logical and(lower red 2 <= fruit, fruit</pre>
<= upper red 2), axis=-1)),
       'A' : np.sum(np.all(np.logical and(lower yellow <= fruit, fruit
<= upper yellow), axis=-1)),
       'N' : np.sum(np.all(np.logical and(lower orange <= fruit, fruit</pre>
<= upper_orange), axis=-1))</pre>
   conteo_por_rango = {
       'V': conteo['V'],
       'R': conteo['R1'] + conteo['R2'],
       'A': conteo['A'],
       'N': conteo['N']
   }
   sorted conteo = sorted(conteo por rango.items(), key=lambda x: x[1],
reverse=True)
   # Obtener el segundo elemento más grande
   segundo mas grande = sorted conteo[1]
   # Obtener la etiqueta y el valor del segundo elemento más grande
   etiqueta segundo mas grande = segundo mas grande[0]
   valor segundo mas grande = segundo mas grande[1]
   # Obtener la etiqueta basándose en el rango con el mayor conteo
   etiqueta = max(conteo por rango, key = conteo por rango.get)
    # Se usa el hecho de que a excepción de las manzanas, el resto de las
frutas tienen poco rojo
   if (etiqueta segundo mas grande == 'R')and(valor segundo mas grande >
0.35*conteo por rango[etiqueta]):
       etiqueta = 'R'
   color = conversion color[etiqueta]
   #------Vector de características-----
   image_features[shelf] = np.append(moments[2:4], color)
def knn(training, test, k n):
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Χ
            = np.concatenate([v for v in training.values()], axis =
0)
            = np.concatenate([[k] * v.shape[0] for k, v in
training.items()])
   dist = cdist(test, X)
   sorted ind = np.argsort(dist, axis = 1)
   sorted k = sorted ind[:, 0:k n]
   predicted = []
   for row in sorted k:
      labels = list(y[row])
      prediction = max(set(labels), key = labels.count)
      predicted.append(prediction)
   return predicted
#-----#
data
             = joblib.load(training data)
centroids = data['centroids']
prediction = knn(centroids,
np.vstack(list(image features.values())), 1)
shelfs = dict(zip(image features.keys(), prediction))
fruit types
           = ['pera', 'banana', 'manzana', 'naranja']
dataset_path
            = './dataset/audios/test'
original path = os.path.join(dataset path, 'original')
processed path = os.path.join(dataset path, 'processed')
model file = './implementation/audio/knn/model.pkl'
            = dict.fromkeys(['pca', 'features', 'scaler'])
model
#-----PARAMETROS DE AUDIO-------
FRAME SIZE = 512
HOP SIZE = int(FRAME SIZE/2)
#------GENERAL AUDIO FUNCTIONS------
def load audio(audiofile):
   test audio, sr = librosa.load(audiofile, sr = None)
   duration = librosa.get duration(path=audiofile, sr=sr)
   return test audio, sr, duration
#-----FILTERS------
def band pass filter(signal, sr, low cutoff, high cutoff):
  b, a = butter(N=3, Wn = [low cutoff, high cutoff], btype='band',
fs=sr)
   return lfilter(b, a, signal)
#----- PUNCTIONS FOR AUDIO PROCESSING-------
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def spectral flux(signal):
    # Calcular el espectrograma de magnitudes
    spectrogram = np.abs(librosa.stft(signal, n fft = FRAME SIZE,
hop length = HOP SIZE))
    # Calcular el flujo espectral
    spectral flux values = np.sum(np.diff(spectrogram, axis=1) **2,
axis=0)
    return spectral flux values
def process(audio in, audio out, rms umbral = 0.043, flux umbral =
0.096):
    signal, sr, = load audio(audio in)
    rms = librosa.feature.rms(y = signal, frame length = FRAME SIZE,
hop length = HOP SIZE)
    rms /= np.max(np.abs(rms))
    trms = librosa.times_like(rms, sr = sr, hop_length = HOP_SIZE, n_fft
= FRAME SIZE)
    trms /= trms[-1]
    flux = spectral flux(signal)
    flux /= np.max(np.abs(flux))
    fluxframes = range(len(flux))
    tflux = librosa.frames to time(fluxframes, hop length=HOP SIZE, n fft
= FRAME SIZE)
    tflux /= tflux[-1]
    left index = np.argmax(np.abs(flux) > flux umbral)
    rigth index = len(flux) - 1 - np.argmax(np.abs(np.flip(flux)) >
flux umbral)
    tsignal = librosa.times like(signal, sr = sr, hop length=HOP SIZE,
n fft=FRAME SIZE)
    tsignal /= tsignal[-1]
    flag
         = False
    pad left = 0
    pad rigth = 0
    flag left = False
    flag rigth = False
    while not flag:
        if rms[0, left index] > rms umbral:
            if left index > pad left + 15:
                rms left = left index - np.argmax(np.flip(np.abs(rms[0,
:left index]) < rms umbral))</pre>
                if rms left <= 0:</pre>
                    rms left = left index
                flag left = True
            else:
                pad_left += 15
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left index = pad left + np.argmax(np.abs(flux[pad left:])
> flux umbral)
       else:
               rms_left = left_index
               flag left = True
       if rms[0, rigth index] > rms umbral:
           if rigth index < (len(flux) - 1 - pad rigth-15):</pre>
               rms rigth = rigth index + np.argmax(np.abs(rms[0,
rigth index:]) < rms umbral)</pre>
               if rms rigth >= len(flux):
                   rms rigth = rigth index
               flag rigth = True
           else:
               pad rigth += 15
               rigth index = len(flux[:-pad rigth]) - 1 -
np.argmax(np.flip(np.abs(flux[:-pad rigth]) > flux umbral))
       else:
           rms rigth = rigth index
           flag rigth = True
       flag = flag left and flag rigth
   left index = min(left index, rms left)
   rigth index = max(rigth index, rms rigth)
   mask = tsignal >= tflux[left index]
   sf.write(audio out, trimed, sr)
#----- FEATURES------FUNCTIONS TO EXTRACT FEATURES------
def calculate split frequency bin (split frequency, sample rate,
num frequency bins):
    """Infer the frequency bin associated to a given split frequency."""
    frequency range = sample rate / 2
    frequency delta per bin = frequency range / num frequency bins
    split frequency bin = math.floor(split frequency /
frequency delta per bin)
    return int(split frequency bin)
def band energy ratio (spectrogram, split frequency, sample rate):
    """Calculate band energy ratio with a given split frequency."""
    split frequency bin = calculate split frequency bin(split frequency,
sample rate, len(spectrogram[0]))
   band energy ratio = []
    # calculate power spectrogram
   power spectrogram = np.abs(spectrogram) ** 2
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power spectrogram = power spectrogram.T
   # calculate BER value for each frame
   for frame in power spectrogram:
       sum power low frequencies = frame[:split frequency bin].sum()
       sum power high frequencies = frame[split frequency bin:].sum()
       band energy ratio current frame = sum power low frequencies /
(sum power high frequencies + sum power low frequencies)
       band energy ratio.append(band energy ratio current frame)
   return np.array(band energy ratio)
def rms(signal, frames, hop):
   return librosa.feature.rms(y=signal, frame length = frames,
hop length = hop)
def get_features(signal, sr):
   feature = np.empty((1, 0))
   spec = librosa.stft(signal, n fft = FRAME SIZE, hop length =
HOP SIZE)
   # max
   split frequency = 600
   BER = band energy ratio(spec, split frequency, sr)
   feat = np.max(np.abs(BER))
   feature = np.append(feature, feat)
   # min
   # 1
   split frequency = 1900
   BER = band energy ratio(spec, split frequency, sr)
   feat = np.min(np.abs(BER))
   feature = np.append(feature, feat)
   # 2
   split frequency = 5000
   BER = band energy ratio(spec, split frequency, sr)
   feat = np.min(np.abs(BER))
   feature = np.append(feature, feat)
   split frequency = 9000
   BER = band_energy_ratio(spec, split_frequency, sr)
   feat = np.min(np.abs(BER))
   feature = np.append(feature, feat)
   # std
   # 1
   split frequency = 8000
   BER = band energy ratio(spec, split frequency, sr)
   BER /= np.max(np.abs(BER))
   feat = np.std(BER)/np.mean(np.abs(BER))
   feature = np.append(feature, feat)
   split_frequency = 1000
   BER = band energy ratio(spec, split frequency, sr)
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```
BER /= np.max(np.abs(BER))
    feat = np.std(BER)/np.mean(np.abs(BER))
   feature = np.append(feature, feat)
   #ZCR
   cutoff = 5000
   cuton = 1000
   filtered = band pass filter(signal, sr, cuton, cutoff)
    zcr = librosa.feature.zero crossing rate(filtered,
frame length=FRAME SIZE, hop length=HOP SIZE) [0]
    zcr /= np.max(np.abs(zcr))
    # mean
   feat = np.mean(zcr)
   feature = np.append(feature, feat)
    # maximum
   cutoff = 10000
   cuton = 10
    filtered = band pass filter(signal, sr, cuton, cutoff)
    zcr = librosa.feature.zero crossing rate(filtered,
frame length=FRAME SIZE, hop length=HOP SIZE)[0]
    feat = np.max(np.abs(zcr))
   feature = np.append(feature, feat)
   # std
   cutoff = 10000
   cuton = 20
   filtered = band pass filter(signal, sr, cuton, cutoff)
    zcr = librosa.feature.zero crossing rate(filtered,
frame length=FRAME SIZE, hop length=HOP SIZE)[0]
    feat = np.std(zcr)/np.mean(np.abs(zcr))
   feature = np.append(feature, feat)
    # mean local
   cutoff = 5000
   cuton = 1000
   filtered = band pass filter(signal, sr, cuton, cutoff)
    zcr = librosa.feature.zero crossing rate(filtered,
frame length=FRAME SIZE, hop length=HOP SIZE) [0]
    zcr /= np.max(np.abs(zcr))
    feat = np.mean(zcr[((len(zcr)*3)//14 - 5) : ((len(zcr)*3)//14 + 5)])
   feature = np.append(feature, feat)
   # local max
   cutoff = 10000
   cuton = 10
   filtered = band pass filter(signal, sr, cuton, cutoff)
    zcr = librosa.feature.zero crossing rate(filtered,
frame length=FRAME SIZE, hop length=HOP SIZE)[0]
    feat = np.max(zcr[((len(zcr)*3)//4 - 10) : ((len(zcr)*3)//4 + 10)])
   feature = np.append(feature, feat)
   # Roll off
   cuton = 100
   cutoff = 8500
    filtered = band pass filter(signal, sr, cuton, cutoff)
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roll off = librosa.feature.spectral rolloff(y=filtered, sr=sr,
n fft=FRAME SIZE, hop length=HOP SIZE, roll percent=0.28)[0]
    roll off /= np.max(np.abs(roll off))
    # mean
    feat = np.mean(np.abs(roll off))
    feature = np.append(feature, feat)
    cuton = 100
    cutoff = 8500
    filtered = band pass filter(signal, sr, cuton, cutoff)
    roll off = librosa.feature.spectral rolloff(y=filtered, sr=sr,
n fft=FRAME SIZE, hop length=HOP SIZE, roll percent=0.55)[0]
    feat = np.max(np.abs(roll off))
    feature = np.append(feature, feat)
    # std
    cutoff = 8500
    cuton = 50
    filtered = band pass filter(signal, sr, cuton, cutoff)
    roll off = librosa.feature.spectral rolloff(y=filtered, sr=sr,
n fft=FRAME SIZE, hop length=HOP SIZE, roll percent=0.28)[0]
    roll off /= np.max(np.abs(roll off))
    feat = np.std(np.abs(roll off))/np.mean(np.abs(roll off))
    feature = np.append(feature, feat)
    #MFCCS
   n \text{ mfcc} = 4
    # 1
    cuton = 500
    cutoff = 5000
    filtered = band pass filter(signal, sr, cuton, cutoff)
    mfccs = librosa.feature.mfcc(y = signal, sr=sr, n mfcc = n mfcc,
n fft = FRAME SIZE, hop length = HOP SIZE)
    feat = np.max(mfccs, axis = 1)
    feature = np.append(feature, feat[3])
    # 2
   cuton = 10
    cutoff = 8000
    filtered = band pass filter(signal, sr, cuton, cutoff)
    mfccs = librosa.feature.mfcc(y = filtered, sr=sr, n mfcc = n mfcc,
n fft = FRAME SIZE, hop length = HOP SIZE)
    mfccs /= np.max(np.abs(mfccs), axis = 1, keepdims=True)
    feat = np.std(np.abs(mfccs), axis = 1)/np.mean(np.abs(mfccs), axis =
1)
    feature = np.append(feature, feat[3])
    # 3
    cuton = 10
    cutoff = 8000
    filtered = band pass filter(signal, sr, cuton, cutoff)
    mfccs = librosa.feature.mfcc(y = filtered, sr=sr, n mfcc = n mfcc,
n fft = FRAME SIZE, hop length = HOP SIZE)
    mfccs /= np.max(np.abs(mfccs), axis = 1, keepdims=True)
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mfccs = mfccs[:, ((mfccs.shape[1]*4) // 5 - 10):((mfccs.shape[1]*4))
//5 + 10)]
   feat = np.std(np.abs(mfccs), axis=1) / np.mean(np.abs(mfccs), axis=1)
   feature = np.append(feature, feat[1])
   #envelope
   env = rms(signal, FRAME SIZE, HOP SIZE)
   env = env.reshape(-1,)
   selected = np.linspace(0, len(env) - 1, 30, dtype=int)
   env = env[selected]
   feat = env[11]
   feature = np.append(feature, feat)
   feat = env[12]
   feature = np.append(feature, feat)
   return feature
#-----#
duration = 2.5 # Duración de la grabación en segundos
= 48000
               # Frecuencia de muestreo en Hz
#-----LOOP-----LOOP-----
_____
while True:
   c = input('Presione una ENTER cuando este listo para grabar o
presione \'n\' para salir.')
   if c.lower() == 'n':
      break
   os.system('cls')
   print("Grabando...")
   data recorded = sd.rec(int(duration * fs), samplerate = fs, channels
= 1, dtype = 'int16')
   sd.wait()
   print("Grabación completa.")
   orden = os.path.join(original path,
f"test{len(os.listdir(original path)) + 1}.wav")
   sf.write(orden, data recorded, fs)
   #-----PROCESSING--------
   processed order = os.path.join(processed path,
f"test{len(os.listdir(processed path)) + 1}.wav")
   process(orden, processed order)
   #-----FEATURES EXTRACTION------
   signal, sr, _ = load_audio(processed_order)
   feature = get features(signal, sr)
   test features = feature.reshape(1, -1)
   #-----LOAD THE TRAINED MODEL-----
   model = joblib.load(model file)
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reduced:dict = model['features']
   pca = model['pca']
   scaler
              = model['scaler']
   #-----COORDINATES TRANSFORMATION-----
   scaled test features = scaler.transform(test features)
   reduced_test = pca.transform(scaled_test_features)
   #-----PREDICTION------
   prediction = knn(reduced, reduced test, 3)
   place = [shelf for shelf, fruit in shelfs.items() if fruit in
prediction
   #-----RESULTS-----
   if len(place) == 0:
       print(f"No se encontró una {prediction} en ninguna de las 4
estanterías.")
   elif len(place) == 1:
       print(f"Se encontró una {prediction} en el {place[0]}")
   elif len(place) > 1:
       print(f"Se encontró una {prediction} en las siguientes
estanterias: {place}")
   fig, axs = plt.subplots(\mathbf{1}, \mathbf{4}, figsize = (\mathbf{15}, \mathbf{5}))
   for shelf, file in shelf files.items():
       image = cv2.imread(file)
       axs[i].imshow(cv2.cvtColor(image, cv2.COLOR BGR2RGB))
       axs[i].axis('off')
       axs[i].set title(shelf)
       if shelf in place:
          h, w, = image.shape
           rect = plt.Rectangle((0, 0), w, h, linewidth = 5, edgecolor =
'green', facecolor = 'none')
          axs[i].add patch(rect)
       i += 1
   plt.subplots adjust(wspace = 0.5)
   plt.show()
warnings.resetwarnings()
```