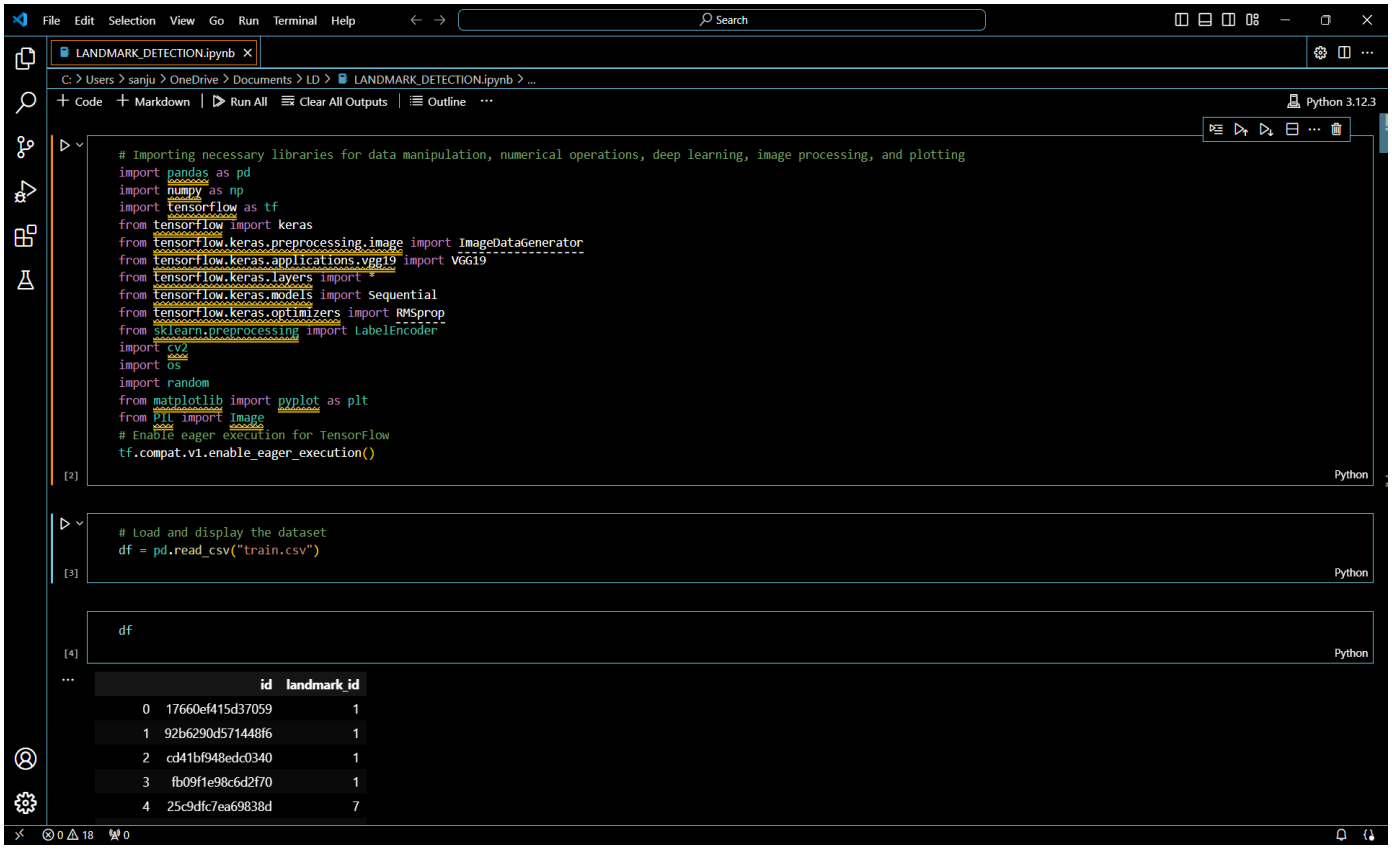
3. LANDMARK DETECTION AI-MODEL USING JUPYTER NOTEBOOK

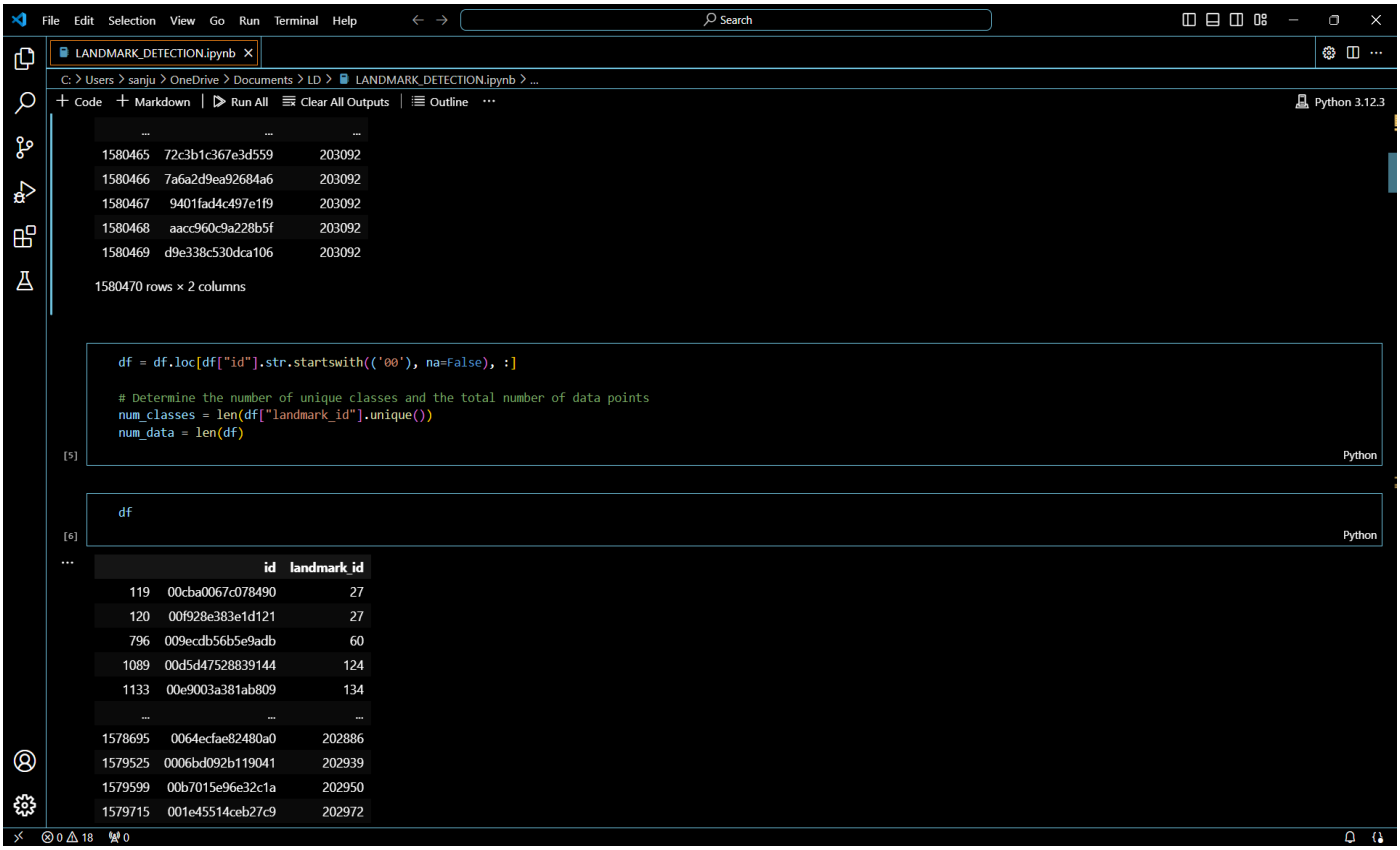


```
# Importing necessary libraries for data manipulation, numerical operations, deep learning, image processing, and plotting
import pandas as pd
import numpy as np
import tensorflow as tf
from tensorflow import keras
from tensorflow.keras.preprocessing.image import ImageDataGenerator
from tensorflow.keras.applications.vgg19 import VGG19
from tensorflow.keras.layers import *
from tensorflow.keras.models import Sequential
from tensorflow.keras.optimizers import RMSprop
from sklearn.preprocessing import LabelEncoder
import cv2
import os
import random
from matplotlib import pyplot as plt
from PIL import Image
# Enable eager execution for TensorFlow
tf.compat.v1.enable_eager_execution()
```

```
# Load and display the dataset
df = pd.read_csv("train.csv")
```

```
df
```

	id	landmark_id
0	17660ef415d37059	1
1	92b6290d571448f6	1
2	cd41bf948edc0340	1
3	fb09f1e98c6d2f70	1
4	25c9dfc7ea69838d	7



...	...	...
1580465	72c3b1c367e3d559	203092
1580466	7a6a2d9ea92684a6	203092
1580467	9401fad4c497e1f9	203092
1580468	aacc960c9a228b5f	203092
1580469	d9e338c530dca106	203092

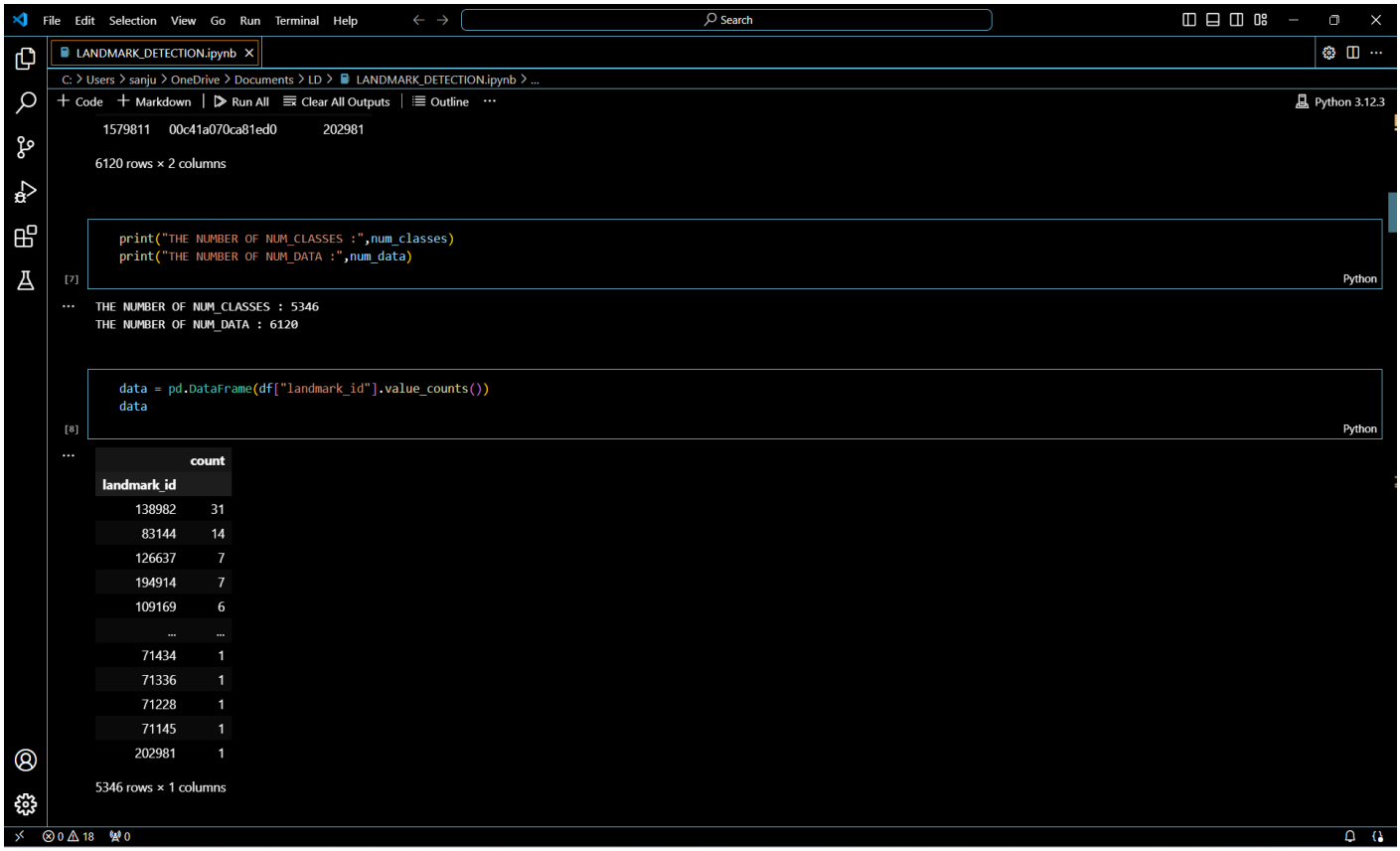
1580470 rows × 2 columns

```
df = df.loc[df["id"].str.startswith(('00'), na=False), :]

# Determine the number of unique classes and the total number of data points
num_classes = len(df["landmark_id"].unique())
num_data = len(df)
```

```
df
```

	id	landmark_id
119	00cba0067c078490	27
120	00f928e383e1d121	27
796	009ecdb56b5e9adb	60
1089	00d5d47528839144	124
1133	00e9003a381ab809	134
...	...	...
1578695	0064ecfae82480a0	202886
1579525	0006bd092b119041	202939
1579599	00b7015e96e32c1a	202950
1579715	001e45514ceb27c9	202972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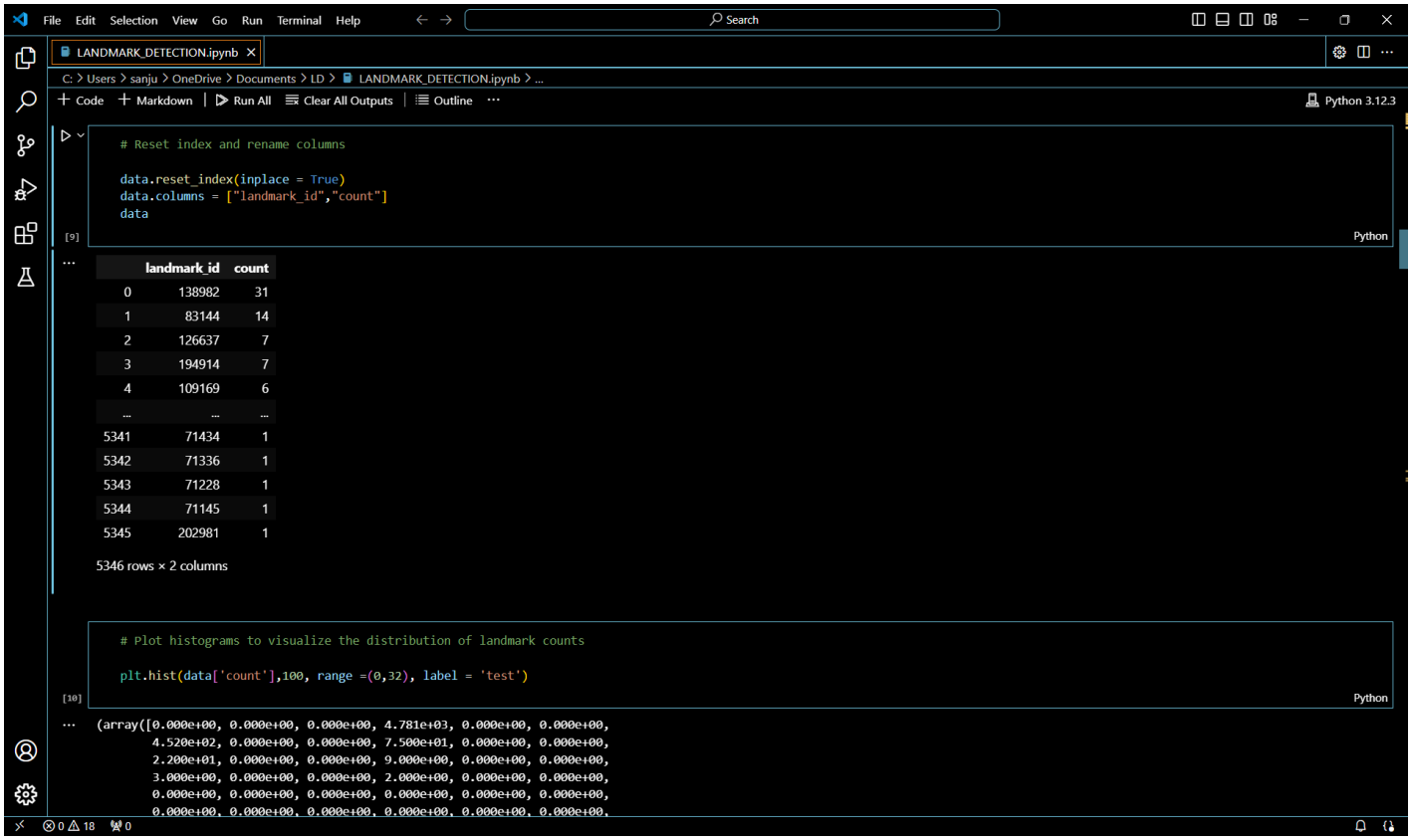
+ Code + Markdown | Run All Clear All Outputs | Outline ...
Python 3.12.3
1579811 00c41a070ca81ed0 202981
6120 rows × 2 columns
print("THE NUMBER OF NUM_CLASSES :",num_classes)
print("THE NUMBER OF NUM_DATA :",num_data)
[7]
Python
THE NUMBER OF NUM_CLASSES : 5346
THE NUMBER OF NUM_DATA : 6120
data = pd.DataFrame(df["landmark_id"].value_counts())
data
[8]
Python
count
landmark_id
138982 31
83144 14
126637 7
194914 7
109169 6
... ...
71434 1
71336 1
71228 1
71145 1
202981 1
5346 rows × 1 columns
0 18 0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Python 3.12.3
# Reset index and rename columns
data.reset_index(inplace = True)
data.columns = ["landmark_id","count"]
data
[9]
Python
landmark_id count
0 138982 31
1 83144 14
2 126637 7
3 194914 7
4 109169 6
... ...
5341 71434 1
5342 71336 1
5343 71228 1
5344 71145 1
5345 202981 1
5346 rows × 2 columns
# Plot histograms to visualize the distribution of landmark counts
plt.hist(data['count'],100, range =(0,32), label = 'test')
[10]
Python
(array([0.000e+00, 0.000e+00, 0.000e+00, 4.781e+03, 0.000e+00, 0.000e+00,
4.520e+02, 0.000e+00, 0.000e+00, 7.500e+01, 0.000e+00, 0.000e+00,
2.200e+01, 0.000e+00, 0.000e+00, 9.000e+00, 0.000e+00, 0.000e+00,
3.000e+00, 0.000e+00, 0.000e+00, 2.000e+00, 0.000e+00, 0.000e+00,
0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
0 18 0

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[10]

```
(array([0.000e+00, 0.000e+00, 0.000e+00, 4.781e+03, 0.000e+00, 0.000e+00,
        4.520e+02, 0.000e+00, 0.000e+00, 7.500e+01, 0.000e+00, 0.000e+00,
        2.200e+01, 0.000e+00, 0.000e+00, 9.000e+00, 0.000e+00, 0.000e+00,
        3.000e+00, 0.000e+00, 0.000e+00, 2.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 1.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00, 0.000e+00,
        1.000e+00, 0.000e+00, 0.000e+00, 0.000e+00]),
 array([ 0.  ,  0.32,  0.64,  0.96,  1.28,  1.6 ,  1.92,  2.24,  2.56,
         2.88,  3.2 ,  3.52,  3.84,  4.16,  4.48,  4.8 ,  5.12,  5.44,
         5.76,  6.08,  6.4 ,  6.72,  7.04,  7.36,  7.68,  8.  ,  8.32,
         8.64,  8.96,  9.28,  9.6 ,  9.92, 10.24, 10.56, 10.88, 11.2 ,
        11.52, 11.84, 12.16, 12.48, 12.8 , 13.12, 13.44, 13.76, 14.08,
        14.4 , 14.72, 15.04, 15.36, 15.68, 16.  , 16.32, 16.64, 16.96,
        17.28, 17.6 , 17.92, 18.24, 18.56, 18.88, 19.2 , 19.52, 19.84,
        20.16, 20.48, 20.8 , 21.12, 21.44, 21.76, 22.08, 22.4 , 22.72,
        23.04, 23.36, 23.68, 24.  , 24.32, 24.64, 24.96, 25.28, 25.6 ,
        25.92, 26.24, 26.56, 26.88, 27.2 , 27.52, 27.84, 28.16, 28.48,
        28.8 , 29.12, 29.44, 29.76, 30.08, 30.4 , 30.72, 31.04, 31.36,
        31.68, 32.  ]),
 <BarContainer object of 100 artists>)
```

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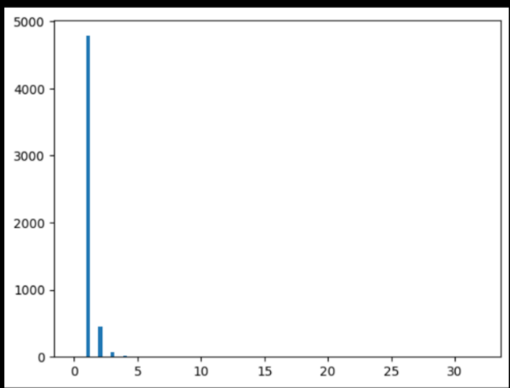


```python
# Count the number of entries within specific ranges of counts
data['count'].between(0,5).sum()
```

[11]

```
5339
```

```python
data['count'].between(5,10).sum()
```

[12]

```
14
```

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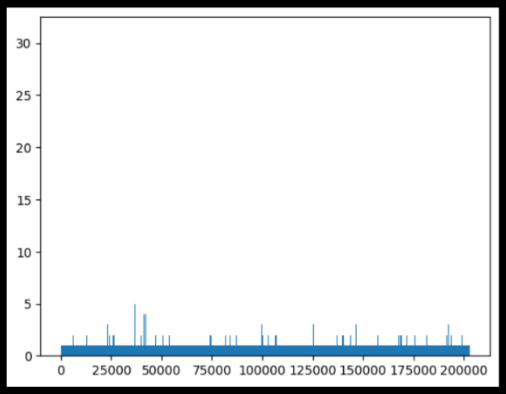
Python 3.12.3

[13]
```
plt.hist(df["landmark_id"], bins=df["landmark_id"].unique())
```
Python

```
(array([2., 1., 1., ..., 1., 1., 2.]),
 array([2.70000e+01, 6.00000e+01, 1.24000e+02, ..., 2.02950e+05,
        2.02972e+05, 2.02981e+05]),
 <BarContainer object of 5345 artists>)
```



[14]
```
# Base path for image files
base_path = "./photos/"
```
Python

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Python 3.12.3

[14] Python

+ Code + Markdown

[15]
```
lencoder = LabelEncoder()
lencoder.fit(df["landmark_id"])
```
Python

```
LabelEncoder()
```

[16]
```
def encode_label(label):
    return lencoder.transform(label)
```
Python

[17]
```
def decode_label(label):
    return lencoder.inverse_transform(label)
```
Python

[18]
```
def get_image_from_numbers(num, df):
    fname, label = df.iloc[num, :]
    fname = fname + '.jpg'
    f1, f2, f3 = fname[0], fname[1], fname[2]
    full_path = os.path.join(base_path, f1, f2, f3, fname)
    im = cv2.imread(full_path)
    if im is None:
        print("Error loading image:", full_path)
        return None, None
    return im, label
```
Python

```
print("8 sample images from random classes")
fig = plt.figure(figsize=(25, 25))
```

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[18]

```
print("8 sample images from random classes")
fig = plt.figure(figsize=(25, 25))
for i in range(1, 9):
    ri = random.choices(os.listdir(base_path), k=3)
    folder = base_path + "0/0/" + ri[2]
    if not os.path.exists(folder):
        print(f"Folder path '{folder}' does not exist.")
        continue

    files_in_folder = os.listdir(folder)
    if not files_in_folder:
        print(f"No files found in folder '{folder}'.")
        continue

    random_img = random.choice(files_in_folder)
    img_path = os.path.join(folder, random_img)

    print(f"Image {i} path:", img_path)
    img = np.array(Image.open(img_path))
    fig.add_subplot(1, 8, i)
    plt.imshow(img)
    plt.axis("off")
plt.show()
```

[19] Python

```
8 sample images from random classes
Image 1 path: ./photos/0/0/0\000ad2281360d346.jpg
Image 2 path: ./photos/0/0/0\000926f8a449fa35.jpg
Image 3 path: ./photos/0/0/0\0001b7ba0106b4d6.jpg
Image 4 path: ./photos/0/0/0\00017a931c28eec1.jpg
Image 5 path: ./photos/0/0/0\000e4d10449d1f1a.jpg
Image 6 path: ./photos/0/0/0\0009bcbcdd28d005.jpg
Image 7 path: ./photos/0/0/0\0004fa8cf9a1cd08.jpg
Image 8 path: ./photos/0/0/0\0003cd4c99bf2049.jpg
```

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```
learning_rate = 0.0001
decay_speed = 1e-6
momentum = 0.9
loss_function = "sparse_categorical_crossentropy"
source_model = VGG19(weights=None)
drop_layer = Dropout(0.5)
```

[20] Python

```
model = Sequential()
for layer in source_model.layers[:-1]:
    if layer == source_model.layers[-25]:
        model.add(BatchNormalization())
    model.add(layer)
model.add(Dense(num_classes, activation ="softmax"))
# Print the model summary
model.summary()
```

[21] Python

```
Model: "sequential"
```

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Python 3.12.3
Model: "sequential"
Layer (type) | Output Shape | Param #
batch_normalization (BatchNormalization) | (None, 224, 224, 3) | 12
block1_conv1 (Conv2D) | (None, 224, 224, 64) | 1,792
block1_conv2 (Conv2D) | (None, 224, 224, 64) | 36,928
block1_pool (MaxPooling2D) | (None, 112, 112, 64) | 0
block2_conv1 (Conv2D) | (None, 112, 112, 128) | 73,856
block2_conv2 (Conv2D) | (None, 112, 112, 128) | 147,584
block2_pool (MaxPooling2D) | (None, 56, 56, 128) | 0
block3_conv1 (Conv2D) | (None, 56, 56, 256) | 295,168
block3_conv2 (Conv2D) | (None, 56, 56, 256) | 590,080
block3_conv3 (Conv2D) | (None, 56, 56, 256) | 590,080
block3_conv4 (Conv2D) | (None, 56, 56, 256) | 590,080
block3_pool (MaxPooling2D) | (None, 28, 28, 256) | 0
block4_conv1 (Conv2D) | (None, 28, 28, 512) | 1,180,160
block4_conv2 (Conv2D) | (None, 28, 28, 512) | 2,359,808
block4_conv3 (Conv2D) | (None, 28, 28, 512) | 2,359,808
block4_conv4 (Conv2D) | (None, 28, 28, 512) | 2,359,808
block4_pool (MaxPooling2D) | (None, 14, 14, 512) | 0
block5_conv1 (Conv2D) | (None, 14, 14, 512) | 2,359,808
block5_conv2 (Conv2D) | (None, 14, 14, 512) | 2,359,808
block5_conv3 (Conv2D) | (None, 14, 14, 512) | 2,359,808
0 18 0


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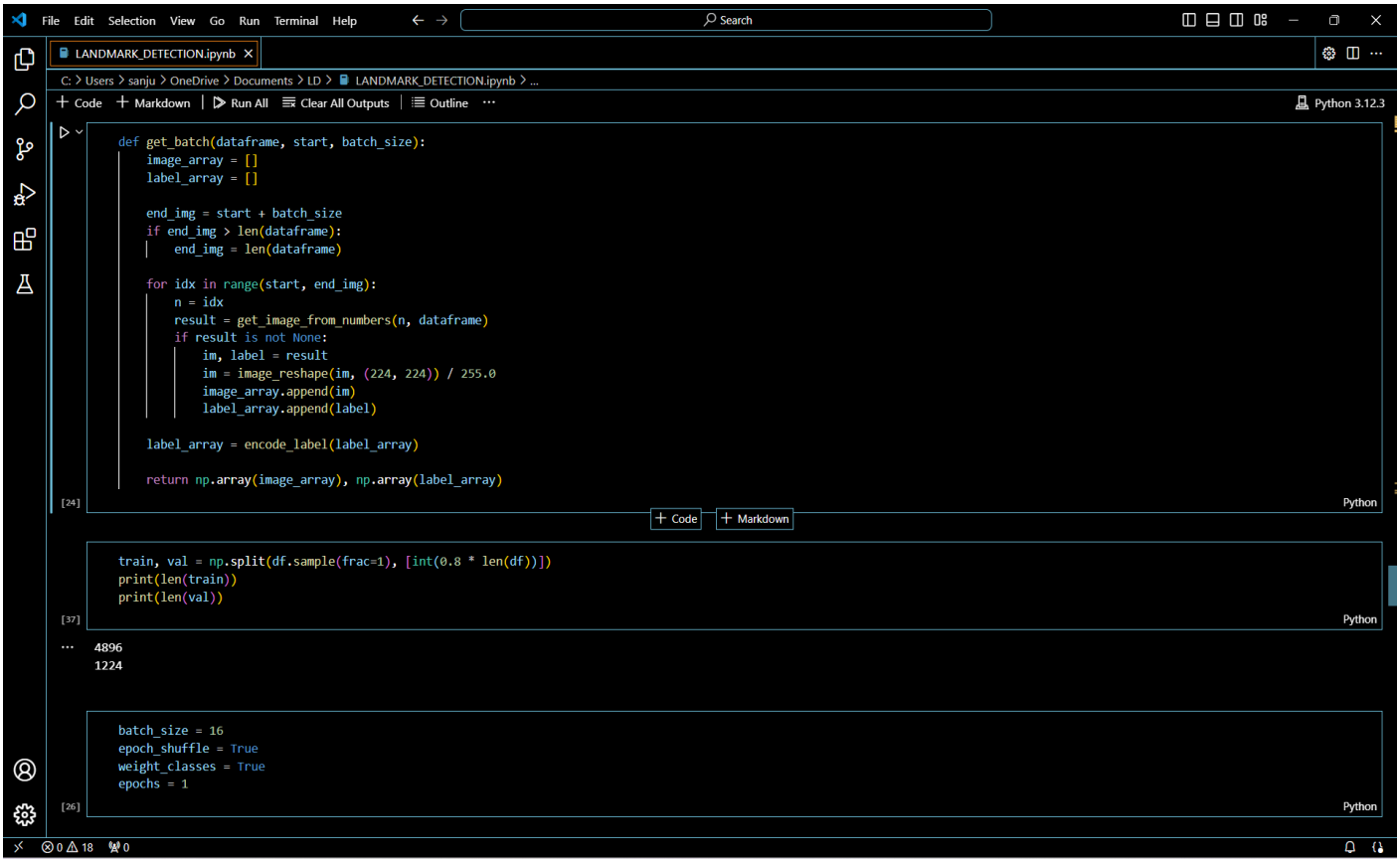
Python 3.12.3
block5_conv3 (Conv2D) | (None, 14, 14, 512) | 2,359,808
block5_conv4 (Conv2D) | (None, 14, 14, 512) | 2,359,808
block5_pool (MaxPooling2D) | (None, 7, 7, 512) | 0
flatten (Flatten) | (None, 25088) | 0
fc1 (Dense) | (None, 4096) | 102,764,544
fc2 (Dense) | (None, 4096) | 16,781,312
dense (Dense) | (None, 5346) | 21,902,562
Total params: 161,472,814 (615.97 MB)
Trainable params: 161,472,808 (615.97 MB)
Non-trainable params: 6 (24.00 B)
optim1 = keras.optimizers.RMSprop(learning_rate = learning_rate)
model.compile(optimizer = optim1, loss = loss_function, metrics = ["accuracy"])
[22]
Python
def image_reshape(im, target_size):
if im is None:
raise ValueError("Input image is None.")
if im.size == 0:
raise ValueError("Input image size is zero.")
resized_image = cv2.resize(im, target_size)
return resized_image
[23]
Python
0 18 0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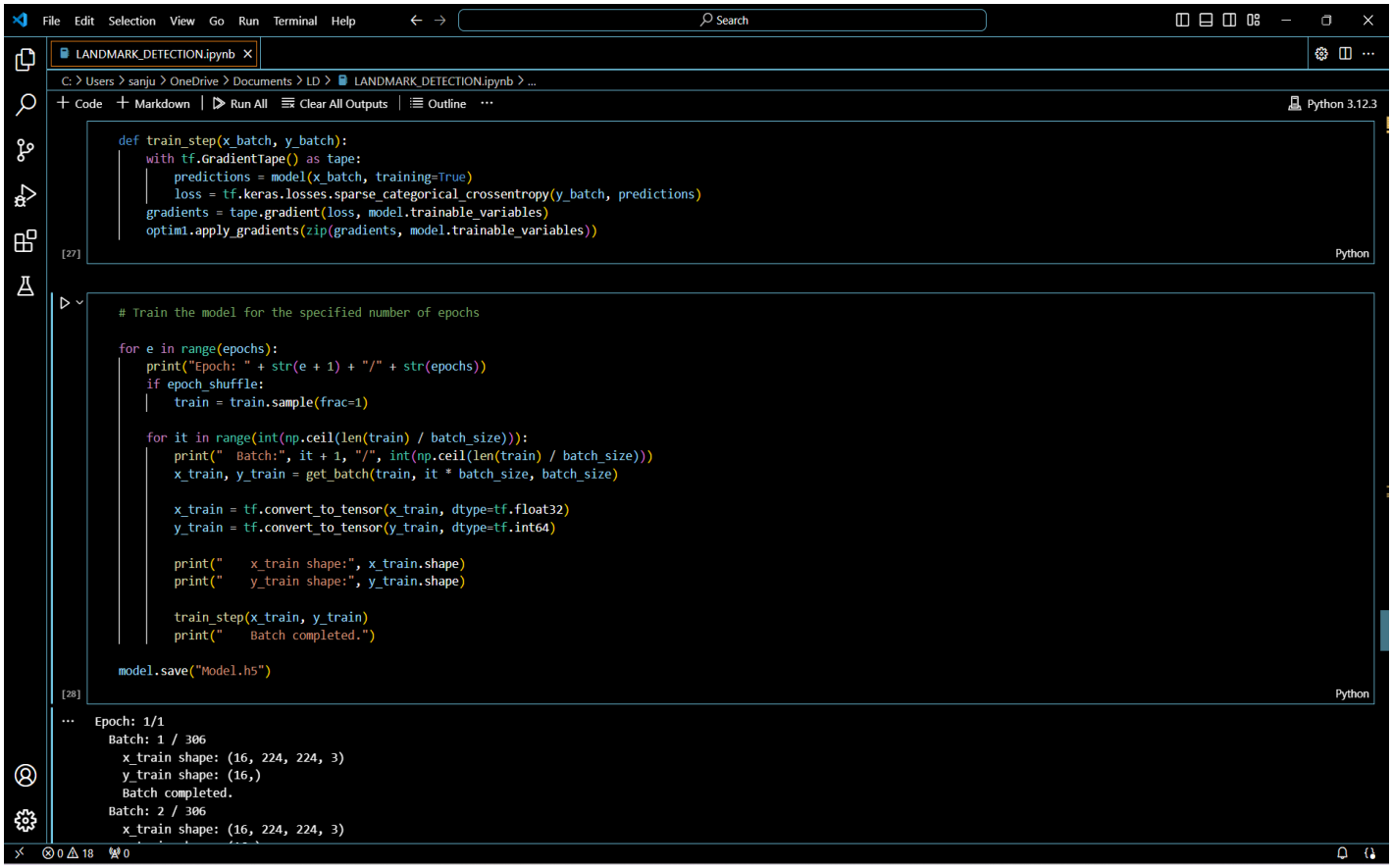
Code Markdown Run All Clear All Outputs Outline
Python 3.12.3
def get_batch(dataframe, start, batch_size):
image_array = []
label_array = []
end_img = start + batch_size
if end_img > len(dataframe):
end_img = len(dataframe)
for idx in range(start, end_img):
n = idx
result = get_image_from_numbers(n, dataframe)
if result is not None:
im, label = result
im = image_reshape(im, (224, 224)) / 255.0
image_array.append(im)
label_array.append(label)
label_array = encode_label(label_array)
return np.array(image_array), np.array(label_array)
[24]
Python
Code Markdown
train, val = np.split(df.sample(frac=1), [int(0.8 * len(df))])
print(len(train))
print(len(val))
[37]
Python
4896
1224
batch_size = 16
epoch_shuffle = True
weight_classes = True
epochs = 1
[26]
Python
0 18 0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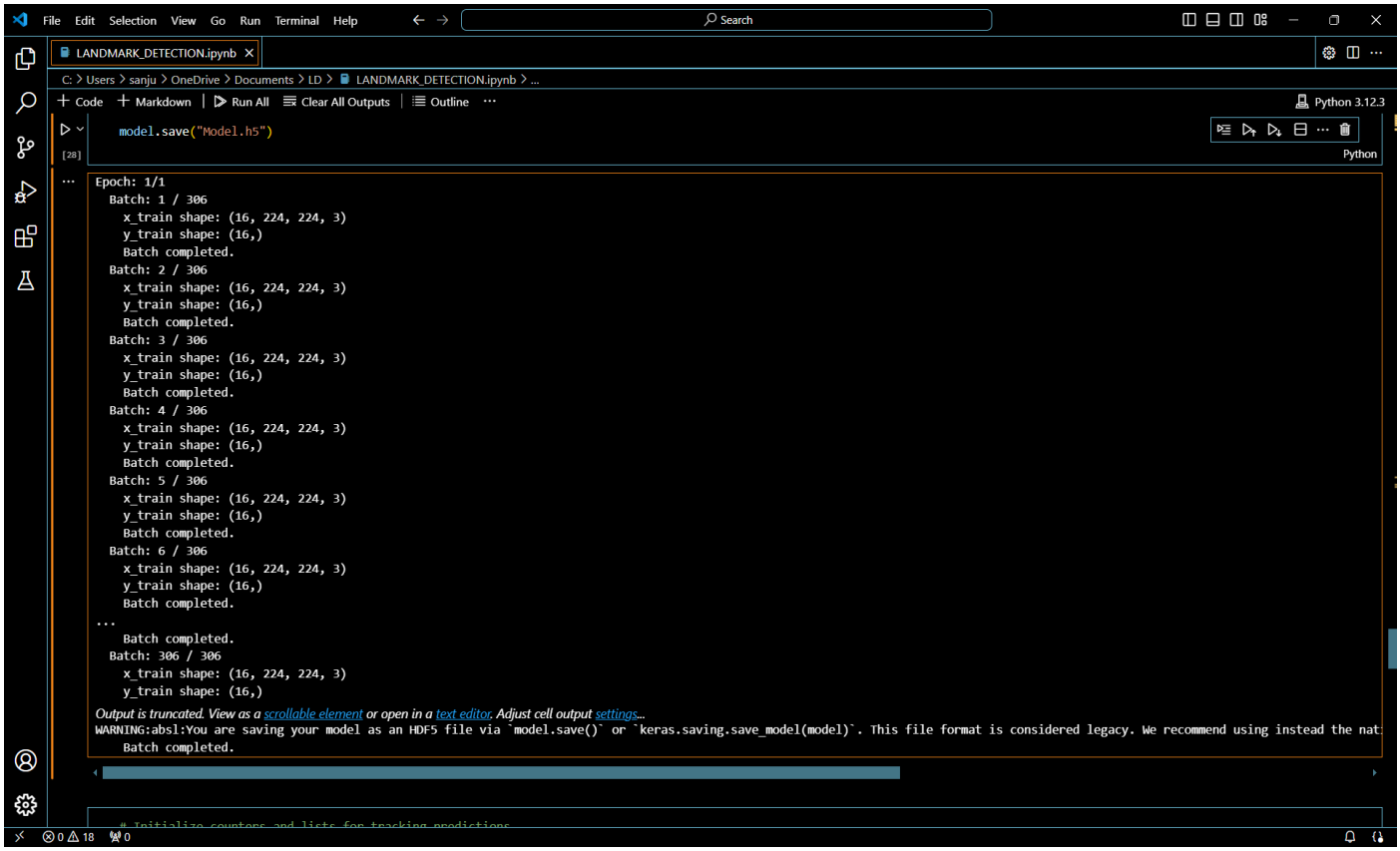
Code Markdown Run All Clear All Outputs Outline
Python 3.12.3
def train_step(x_batch, y_batch):
with tf.GradientTape() as tape:
predictions = model(x_batch, training=True)
loss = tf.keras.losses.sparse_categorical_crossentropy(y_batch, predictions)
gradients = tape.gradient(loss, model.trainable_variables)
optim1.apply_gradients(zip(gradients, model.trainable_variables))
[27]
Python
# Train the model for the specified number of epochs
for e in range(epochs):
print("Epoch: " + str(e + 1) + "/" + str(epochs))
if epoch_shuffle:
train = train.sample(frac=1)
for it in range(int(np.ceil(len(train) / batch_size))):
print(" Batch:", it + 1, "/", int(np.ceil(len(train) / batch_size)))
x_train, y_train = get_batch(train, it * batch_size, batch_size)
x_train = tf.convert_to_tensor(x_train, dtype=tf.float32)
y_train = tf.convert_to_tensor(y_train, dtype=tf.int64)
print("   x_train shape:", x_train.shape)
print("   y_train shape:", y_train.shape)
train_step(x_train, y_train)
print("   Batch completed.")
model.save("Model.h5")
[28]
Python
Epoch: 1/1
Batch: 1 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 2 / 306
x_train shape: (16, 224, 224, 3)
0 18 0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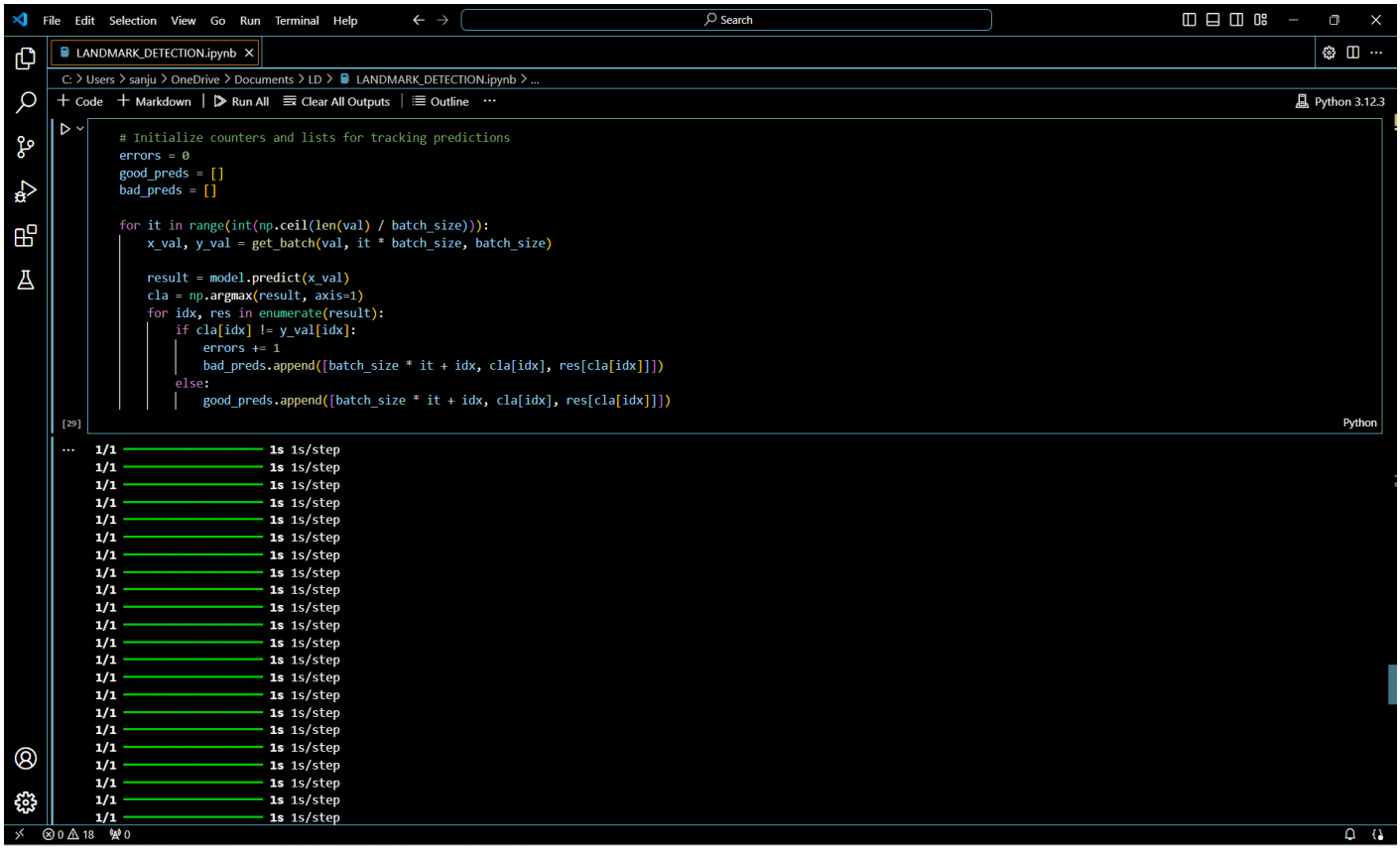
Python 3.12.3
model.save("Model.h5")
[28]
Python
Epoch: 1/1
Batch: 1 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 2 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 3 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 4 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 5 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
Batch: 6 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Batch completed.
...
Batch completed.
Batch: 306 / 306
x_train shape: (16, 224, 224, 3)
y_train shape: (16,)
Output is truncated. View as a scrollable element or open in a text editor. Adjust cell output settings...
WARNING:absl:You are saving your model as an HDF5 file via `model.save()` or `keras.saving.save_model(model)`. This file format is considered legacy. We recommend using instead the nat
Batch completed.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Python 3.12.3
# Initialize counters and lists for tracking predictions
errors = 0
good_preds = []
bad_preds = []
for it in range(int(np.ceil(len(val) / batch_size))):
x_val, y_val = get_batch(val, it * batch_size, batch_size)
result = model.predict(x_val)
cla = np.argmax(result, axis=1)
for idx, res in enumerate(result):
if cla[idx] != y_val[idx]:
errors += 1
bad_preds.append([batch_size * it + idx, cla[idx], res[cla[idx]]])
else:
good_preds.append([batch_size * it + idx, cla[idx], res[cla[idx]]])
[29]
Python
1/1 1s 1s/step


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Python 3.12.3
1/1 1s 1s/step
1/1 1s 1s/step
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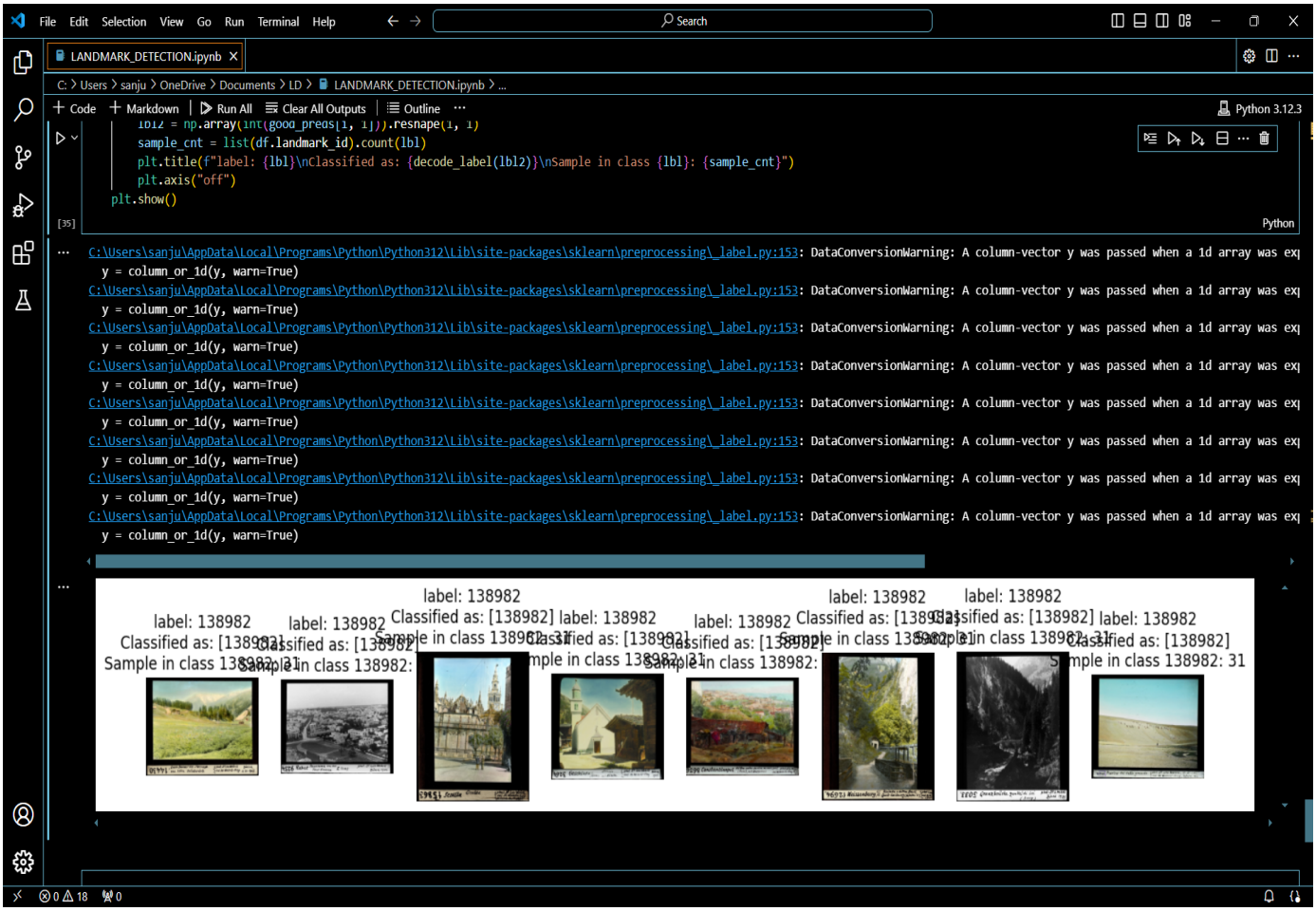
...
1/1 1s 1s/step
1/1 1s 1s/step
1/1 1s 1s/step
1/1 1s 665ms/step
Output is truncated. View as a scrollable element or open in a text editor. Adjust cell output settings...
good_preds = np.array(good_preds)
good_preds = np.array(sorted(good_preds, key=lambda x: x[2], reverse=True))
[30] Python
print(len(good_preds))
[31] Python
8
len(good_preds)
[32] Python
8
# Plot the images corresponding to the good predictionsp
fig = plt.figure(figsize=(16, 16))
for i in range(len(good_preds)):
n = int(good_preds[i, 0])
img, lbl = get_image_from_numbers(n, val)
img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
fig.add_subplot(1, len(good_preds), i + 1)
plt.imshow(img)
lbl2 = np.array(int(good_preds[i, 1])).reshape(1, 1)
sample_cnt = list(df.landmark_id).count(lbl)
0 18 0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Python 3.12.3
lbl2 = np.array(int(good_preds[i, 1])).reshape(1, 1)
sample_cnt = list(df.landmark_id).count(lbl)
plt.title(f"label: {lbl}\nClassified as: {decode_label(lbl2)}\nSample in class {lbl}: {sample_cnt}")
plt.axis("off")
plt.show()
[35] Python
C:\Users\sanju\AppData\Local\Programs\Python\Python312\Lib\site-packages\sklearn\preprocessing_label.py:153: DataConversionWarning: A column-vector y was passed when a 1d array was exp
y = column_or_1d(y, warn=True)
label: 138982
Classified as: [138982]
Sample in class 138982: 31
0 18 0