



SPEECH ANALYSIS II



版本與套件

- Python 3.6.8
- Install [Visual Studio 2019 C++ Build Tools](#) (Windows)
- `pip install tensorflow` #用於模型建構 ≥ 2
- `pip install sklearn` #使用sklearn的函式分割出訓練集與測試集
- `pip install librosa` #用於提取語音的特徵

Visual Studio 2019 C++ Build Tools(1)

- <https://visualstudio.microsoft.com/zh-hant/downloads/>

所有下載

全部展開 全部摺疊

Visual Studio 2019

> Visual Studio 2019 的工具

Build Tools for Visual Studio
2019

這些 Build Tools 可讓您從命令列介面建置 Visual Studio 專案。支援的專案包括：ASP.NET、Azure、C++ Desktop、ClickOnce、容器、.NET Core、.NET Desktop、Node.js、Office 和 SharePoint、Python、TypeScript、單元測試、UWP、WCF 以及 Xamarin。

下載



Visual Studio 2019 C++ Build Tools(2)



檔案介紹

<https://github.com/manashmandal/DeadSimpleSpeechRecognizer>

- data – 是資料集
 - *bed*
 - *cat*
 - *happy*
- bed.npy / cat.npy / happ.npy 是上述音檔的 mfcc 特徵存檔
- ASR.h5 - 訓練好的模型
- preprocess.py – 語音前處理程式
- train.py – 訓練程式
- test.py – 測試程式

資料集介紹

- bed 語音共有1,713筆資料
- cat 語音共有1,733筆資料
- happy 語音共有1,742筆資料

載入函式庫

```
1 import librosa
2 import os
3 from sklearn.model_selection import train_test_split
4 from tensorflow.keras.utils import to_categorical
5 import numpy as np
6
7 DATA_PATH = "./data/"
```

取得語音檔的標籤

使用 one hot encoding 將標籤 ['bed', 'cat', 'happy'] 轉換成類別 [0, 1, 2]

```
9  # Input: Folder Path
10 # Output: Tuple (Label, Indices of the labels, one-hot encoded labels)
11 def get_labels(path=DATA_PATH):
12     labels = os.listdir(path)
13     label_indices = np.arange(0, len(labels))
14     return labels, label_indices, to_categorical(label_indices)
```


資料前處理

- 前處理上，聲音是由一串不固定頻率之波譜組成的而其中每個區段的又可能是由不同頻率的小波譜疊加而成，而從時域上是無法發現各類頻率的，所以聲音資料通常都需要藉由傅立葉轉換將其轉變為頻域進行分析
- 通常是透過librosa套件中的函數進行特徵擷取
<https://librosa.github.io/librosa/>
- 常用的librosa函數mfcc()
- mfcc :使用於類人聽覺

取得mfcc特徵

- Sample_rate - sr是多少毫秒取一次
- mfcc()將剛剛取得之時域陣列轉換為頻域

```
17 # Handy function to convert wav2mfcc
18 ▼ def wav2mfcc(file_path, max_pad_len=11):
19     wave, sr = librosa.load(file_path, mono=True, sr=None)
20     #wave = wave[::3]
21     wave = np.ascontiguousarray(wave[::3])
22     mfcc = librosa.feature.mfcc(wave, sr=16000)
23     pad_width = max_pad_len - mfcc.shape[1]
24     mfcc = np.pad(mfcc, pad_width=((0, 0), (0, pad_width)), mode='constant')
25     return mfcc
```

將每個音檔的 mfcc 特徵存成 npy 檔案

```
28 def save_data_to_array(path=DATA_PATH, max_pad_len=11):
29     labels, _, _ = get_labels(path)
30
31     for label in labels:
32         # Init mfcc vectors
33         mfcc_vectors = []
34
35         wavfiles = [path + label + '/' + wavfile for wavfile in os.listdir(path + '/' + label)]
36         for wavfile in wavfiles:
37             mfcc = wav2mfcc(wavfile, max_pad_len=max_pad_len)
38             mfcc_vectors.append(mfcc)
39         np.save(label + '.npy', mfcc_vectors)
```

將語音資料切成80%訓練集20%測試集

```
42 def get_train_test(split_ratio=0.8, random_state=42):
43     # Get available labels
44     labels, indices, _ = get_labels(DATA_PATH)
45
46     save_data_to_array(DATA_PATH)
47
48     # Getting first arrays
49     X = np.load(labels[0] + '.npy')
50     y = np.zeros(X.shape[0])
51
52     # Append all of the dataset into one single array, same goes for y
53     for i, label in enumerate(labels[1:]):
54         x = np.load(label + '.npy')
55         X = np.vstack((X, x))
56         y = np.append(y, np.full(x.shape[0], fill_value= (i + 1)))
57
58     assert X.shape[0] == len(y)
59
60     return train_test_split(X, y, test_size= (1 - split_ratio), random_state=random_state, shuffle=True)
```

模型構成

- 模型採用CNN網路架設
- CNN --https://brohrer.mcknote.com/zh-Hant/how_machine_learning_works/how_convolutional_neural_networks_work.html
- 卷積層 4層
- 激活函數 選用RELU 解決梯度消失 增加收斂速度
- Dropout(0.25) 降低過度學習，每次隨機暫停25%神經元

訓練結果

- 執行train.py進行模型訓練 會產生一個ASR.h5的模型權重檔

```
1 # 導入函式庫
2 from preprocess import *
3 import tensorflow
4 from tensorflow.keras.models import Sequential
5 from tensorflow.keras.layers import Dense, Dropout, Flatten, Conv2D, MaxPooling2D
6 from tensorflow.keras.utils import to_categorical
7
8 # 載入 data 資料夾的訓練資料，並自動分為『訓練組』及『測試組』
9 X_train, X_test, y_train, y_test = get_train_test()
10 X_train = X_train.reshape(X_train.shape[0], 20, 11, 1)
11 X_test = X_test.reshape(X_test.shape[0], 20, 11, 1)
12
13 # 類別變數轉為one-hot encoding
14 y_train_hot = to_categorical(y_train)
15 y_test_hot = to_categorical(y_test)
16 print("X_train.shape=", X_train.shape)
```

訓練結果

- 執行train.py進行模型訓練 會產生一個ASR.h5的模型權重檔

```
18 # 建立簡單的線性執行的模型
19 model = Sequential()
20 # 建立卷積層, filter=32,即 output size, Kernal Size: 2x2, activation function 採用 relu
21 model.add(Conv2D(32, kernel_size=(2, 2), activation='relu', input_shape=(20, 11, 1)))
22 # 建立池化層, 池化大小=2x2, 取最大值
23 model.add(MaxPooling2D(pool_size=(2, 2)))
24 # Dropout層隨機斷開輸入神經元, 用於防止過度擬合, 斷開比例:0.25
25 model.add(Dropout(0.25))
26 # Flatten層把多維的輸入一維化, 常用在從卷積層到全連接層的過渡。
27 model.add(Flatten())
28 # 全連接層: 128個output
29 model.add(Dense(128, activation='relu'))
30 model.add(Dropout(0.25))
31 # Add output layer
32 model.add(Dense(3, activation='softmax'))
33 # 編譯: 選擇損失函數、優化方法及成效衡量方式
34 model.compile(loss=tensorflow.keras.losses.categorical_crossentropy,
35               optimizer=tensorflow.keras.optimizers.Adadelta(),
36               metrics=['accuracy'])
```

訓練結果

- 執行train.py進行模型訓練 會產生一個ASR.h5的模型權重檔

```
38 # 進行訓練，訓練過程會存在 train_history 變數中
39 model.fit(X_train, y_train_hot, batch_size=100, epochs=200, verbose=1, validation_data=(X_test, y_test_hot))
40
41
42 X_train = X_train.reshape(X_train.shape[0], 20, 11, 1)
43 X_test = X_test.reshape(X_test.shape[0], 20, 11, 1)
44 score = model.evaluate(X_test, y_test_hot, verbose=1)
45
46 # 模型存檔
47 from tensorflow.keras.models import load_model
48 model.save('ASR.h5') # creates a HDF5 file 'model.h5'
```


訓練結果

- 執行train.py進行模型訓練 會產生一個ASR.h5的模型權重檔

```
命令提示字元
42/42 [=====] - 0s 7ms/step - loss: 6.2613 - accuracy: 0.4851 - val_loss: 1.2417 - val_accuracy: 0.7004
Epoch 190/200
42/42 [=====] - 0s 7ms/step - loss: 5.9795 - accuracy: 0.5010 - val_loss: 1.2359 - val_accuracy: 0.7033
Epoch 191/200
42/42 [=====] - 0s 7ms/step - loss: 5.9365 - accuracy: 0.4973 - val_loss: 1.2303 - val_accuracy: 0.7042
Epoch 192/200
42/42 [=====] - 0s 6ms/step - loss: 6.1598 - accuracy: 0.5014 - val_loss: 1.2309 - val_accuracy: 0.7042
Epoch 193/200
42/42 [=====] - 0s 6ms/step - loss: 6.0303 - accuracy: 0.4846 - val_loss: 1.2231 - val_accuracy: 0.7033
Epoch 194/200
42/42 [=====] - 0s 6ms/step - loss: 5.8888 - accuracy: 0.4925 - val_loss: 1.2213 - val_accuracy: 0.7023
Epoch 195/200
42/42 [=====] - 0s 6ms/step - loss: 6.0161 - accuracy: 0.4853 - val_loss: 1.2212 - val_accuracy: 0.7071
Epoch 196/200
42/42 [=====] - 0s 6ms/step - loss: 5.8184 - accuracy: 0.5063 - val_loss: 1.2186 - val_accuracy: 0.7071
Epoch 197/200
42/42 [=====] - 0s 6ms/step - loss: 5.9035 - accuracy: 0.4976 - val_loss: 1.2141 - val_accuracy: 0.7081
Epoch 198/200
42/42 [=====] - 0s 6ms/step - loss: 5.7483 - accuracy: 0.4928 - val_loss: 1.2054 - val_accuracy: 0.7052
Epoch 199/200
42/42 [=====] - 0s 6ms/step - loss: 5.9470 - accuracy: 0.4896 - val_loss: 1.2029 - val_accuracy: 0.7071
Epoch 200/200
42/42 [=====] - 0s 6ms/step - loss: 5.6944 - accuracy: 0.4867 - val_loss: 1.1940 - val_accuracy: 0.7071
33/33 [=====] - 0s 1ms/step - loss: 1.1940 - accuracy: 0.7071
labels= (['bed', 'cat', 'happy'], array([0, 1, 2]), array([[1., 0., 0.],
        [0., 1., 0.],
        [0., 0., 1.]], dtype=float32))
predict= 1
```

測試方法

- 執行test.py將訓練後的模型讀入並丟入一個音檔進行預測

```
1  # 導入函式庫
2  from preprocess import *
3  # 模型讀檔
4  from tensorflow.keras.models import load_model
5  model = load_model('ASR.h5') # load a HDF5 file 'model.h5'
6
7
8  # 預測(prediction)
9  mfcc = wav2mfcc('./data/cat/00b01445_nohash_0.wav')
10 mfcc_resaped = mfcc.reshape(1, 20, 11, 1)
11 print("labels=", get_labels())
12 print("predict=", np.argmax(model.predict(mfcc_resaped)))
```

測試方法

- 執行test.py將訓練後的模型讀入並丟入一個音檔進行預測

```
命令提示字元
.
from numba.decorators import jit as optional_jit
2020-05-22 02:06:19.277102: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cudart64_101.dll'; dLError: cudart64_101.dll not found
2020-05-22 02:06:19.281768: I tensorflow/stream_executor/cuda/cudart_stub.cc:29] Ignore above cudart dLError if you do not have a GPU set up on your machine.
2020-05-22 02:06:20.762001: I tensorflow/stream_executor/platform/default/dso_loader.cc:44] Successfully opened dynamic library nvcuda.dll
2020-05-22 02:06:20.852441: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1561] Found device 0 with properties:
pciBusID: 0000:01:00.0 name: GeForce GTX 1060 6GB computeCapability: 6.1
coreClock: 1.7085GHz coreCount: 10 deviceMemorySize: 6.00GiB deviceMemoryBandwidth: 178.99GiB/s
2020-05-22 02:06:20.860191: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cudart64_101.dll'; dLError: cudart64_101.dll not found
2020-05-22 02:06:20.865235: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cublas64_10.dll'; dLError: cublas64_10.dll not found
2020-05-22 02:06:20.869324: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cufft64_10.dll'; dLError: cufft64_10.dll not found
2020-05-22 02:06:20.874628: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'curand64_10.dll'; dLError: curand64_10.dll not found
2020-05-22 02:06:20.880422: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cusolver64_10.dll'; dLError: cusolver64_10.dll not found
2020-05-22 02:06:20.885185: W tensorflow/stream_executor/platform/default/dso_loader.cc:55] Could not load dynamic library 'cusparses64_10.dll'; dLError: cusparses64_10.dll not found
2020-05-22 02:06:20.897292: I tensorflow/stream_executor/platform/default/dso_loader.cc:44] Successfully opened dynamic library cudnn64_7.dll
2020-05-22 02:06:20.901328: W tensorflow/core/common_runtime/gpu/gpu_device.cc:1598] Cannot dlopen some GPU libraries. Please make sure the missing libraries mentioned above are installed properly if you would like to use GPU. Follow the guide at https://www.tensorflow.org/install/gpu for how to download and setup the required libraries for your platform.
Skipping registering GPU devices...
2020-05-22 02:06:20.911764: I tensorflow/core/platform/cpu_feature_guard.cc:143] Your CPU supports instructions that this TensorFlow binary was not compiled to use: AVX2
2020-05-22 02:06:20.922961: I tensorflow/compiler/xla/service/service.cc:168] XLA service 0x2453fd9b810 initialized for platform Host (this does not guarantee that XLA will be used).
Devices:
2020-05-22 02:06:20.929353: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor device (0): Host, Default Version
2020-05-22 02:06:20.932514: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1102] Device interconnect StreamExecutor with strength 1 edge matrix:
2020-05-22 02:06:20.937108: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1108]
labels= (['bed', 'cat', 'happy'], array([0, 1, 2]), array([[1., 0., 0.],
[0., 1., 0.],
[0., 0., 1.]], dtype=float32))
predict= 1
```

參考文獻

- <https://ithelp.ithome.com.tw/articles/10195763>