

RECOGNIZE SPEECH EMOTIONS WITH LIBROSA

NOVEMBER 9





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- Over 250 free workshops done
- ASSEMBLY: HACK - Embedded systems, IoT and hardware
- ASSEMBLY: CODE - Software projects - APIs, frameworks, apps
- Age range: 16-60 - students, professionals, entrepreneurs
- Focus on smart technology and practical applications
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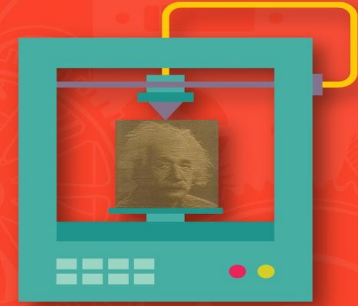
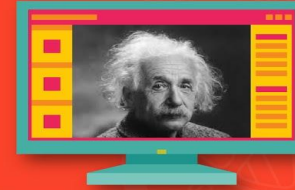
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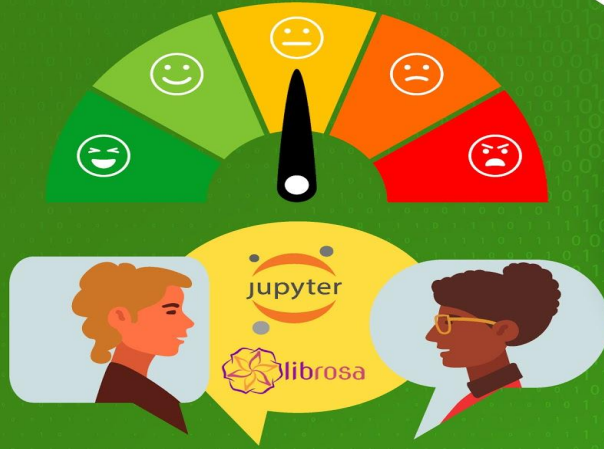
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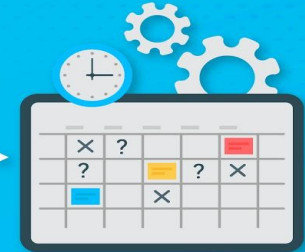


NOVEMBER 2019



NOV 9 - in5 TECH

RECOGNIZE SPEECH EMOTIONS WITH LIBROSA & JUPYTERLAB



NOV 23 - in5 TECH

MANAGE TASKS WITH RFID & GOOGLE SHEETS



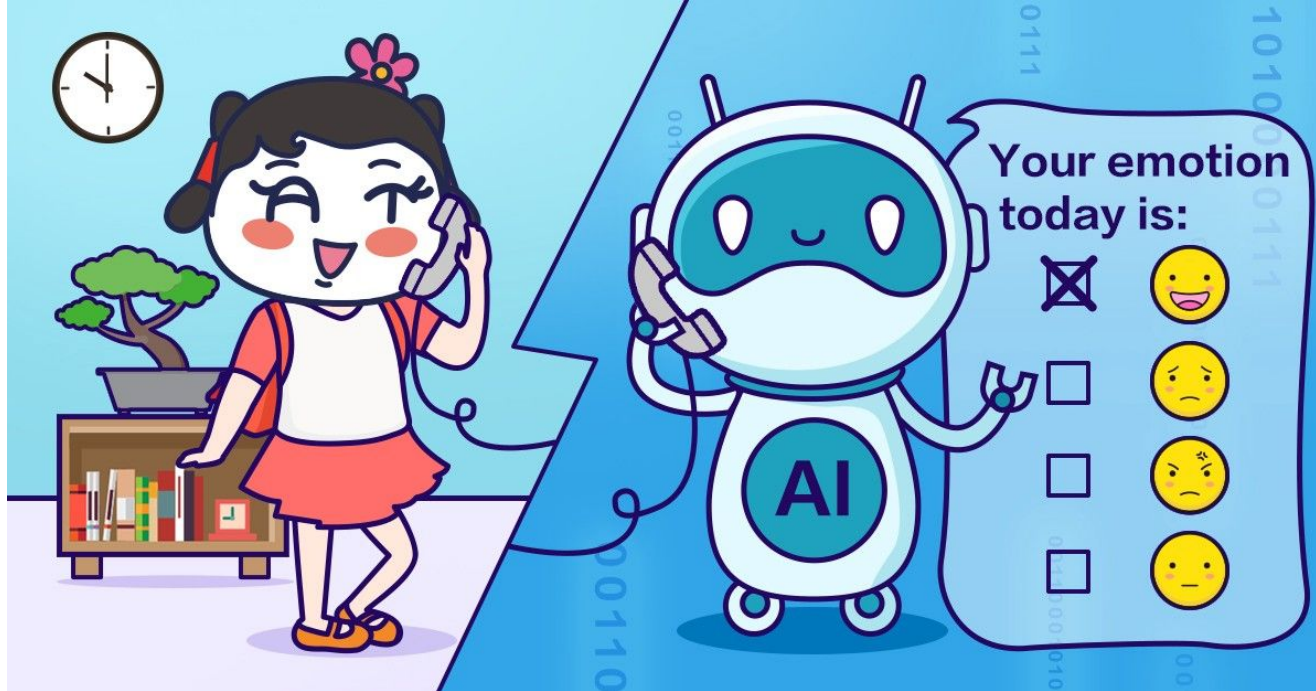
Introduction

In this workshop we are going to:

- Learn about SER (Speech Emotion Recognition)
- Discuss some of the use cases for SER
- Talk about Librosa and Scikit Learn libraries
- Build and train an SER model
- Test out the model by feeding our own input

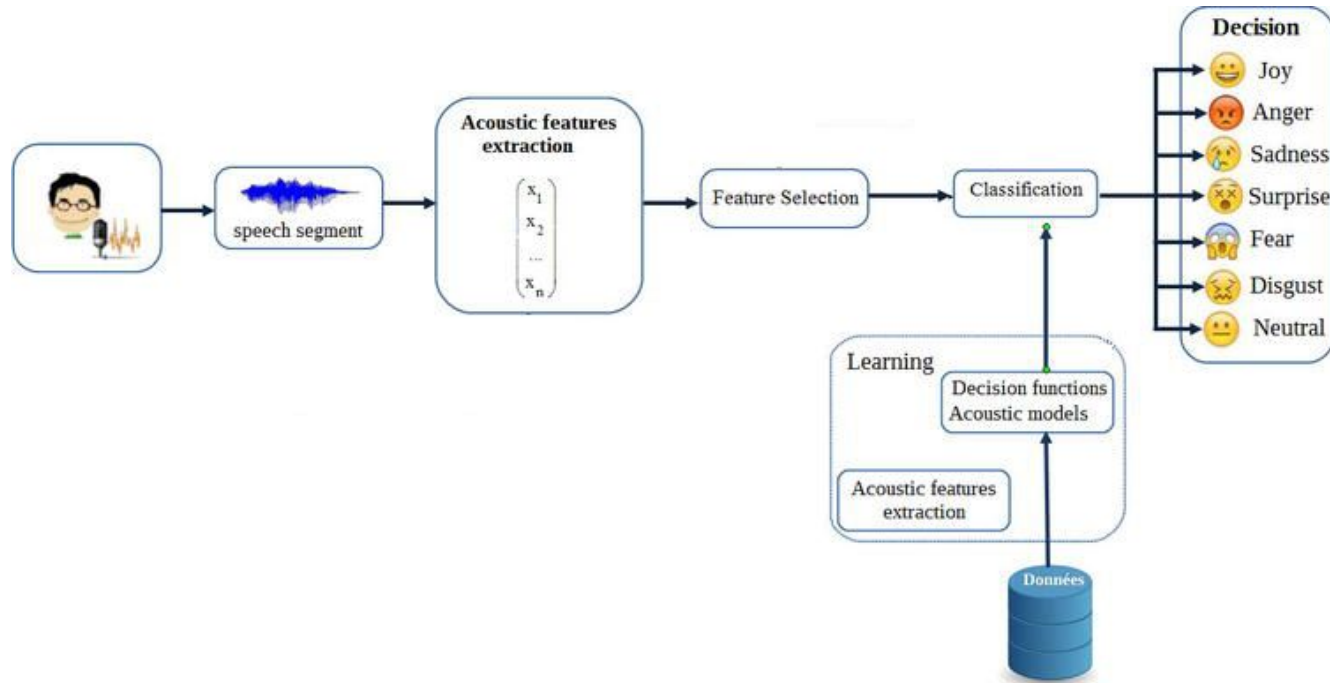


Speech Emotion Recognition (SER)



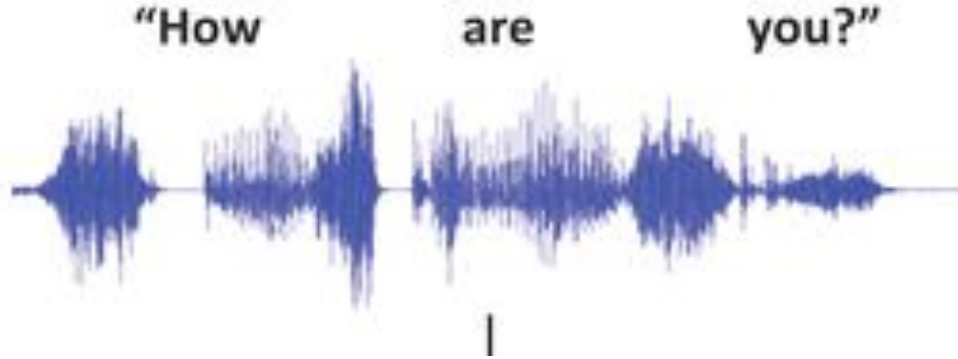


Traditional SER Algorithm





Use cases for SER





The Dataset

We'll use the RAVDESS dataset; this is the Ryerson Audio-Visual Database of Emotional Speech and Song dataset, and is free to download. This dataset has 7356 files rated by 247 individuals 10 times on emotional validity, intensity, and genuineness.



How To Download The Dataset?

The following link will give the download link;

<https://drive.google.com/file/d/1wWsrN2Ep7x6lWqOXfr4rpKGYrJhWc8z7/view>



PREREQUISITES

1. We need to install the Programming language Python first.
2. <https://www.python.org/doc/essays/blurb/>
3. Go to Downloads, Based on your Device (Mac OS or Windows)
4. Scroll Down, Download Python Version (3.6.9)



PREREQUISITES

Link; <https://www.anaconda.com/distribution/>

Windows | macOS | Linux

Anaconda 2019.10 for Windows Installer

Python 3.7 version

[Download](#)

64-Bit Graphical Installer (462 MB)
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✓ _tflo_select	○		2.3.0
✓ absl-py	○	Abseil python common libraries, s...	0.8.0
✓ alabaster	○	Configurable, python 2+3 compatible sphinx theme.	0.7.0
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LIBRARIES

https://github.com/The-Assembly/emotion_speech_recognition/

Go to Command Prompt (CD)-
pip install -r REQUIREMENTS.txt



Librosa Audio and Music Signal Analysis

Librosa is a *Python library* for analyzing audio and music. It has a flatter package layout, standardized interfaces and names, backwards compatibility, modular functions, and readable code.





SCIKIT-LEARN

Scikit-learn (formerly **scikits.learn** and also known as **sklearn**) is a **free software machine learning library** for the **Python** programming language. It features various **classification, regression and clustering** algorithms including **support vector machines, random forests, gradient boosting, k-means** and **DBSCAN**, and is designed to interoperate with the Python numerical and scientific libraries **NumPy** and **SciPy**.





PYAUDIO

PyAudio provides Python bindings for **PortAudio**, the cross-platform audio I/O library. With PyAudio, you can easily use Python to play and record audio on a variety of platforms, such as GNU/Linux, Microsoft Windows, and Apple Mac OS X / macOS.





What is Jupyterlab?

JupyterLab is an open-source, web-based UI for Project Jupyter and it has all basic functionalities of the Jupyter Notebook, like notebooks, terminals, text editors, file browsers, rich outputs, and more. However, it also provides improved support for third party extensions.



JUPYTER LAB

Can use it to explain their reasoning, show their work, and draw connections between their classwork and the world outside. Scientists, journalists, and researchers can use it to open up their data, share the stories behind their computations, and enable future collaboration and innovation.

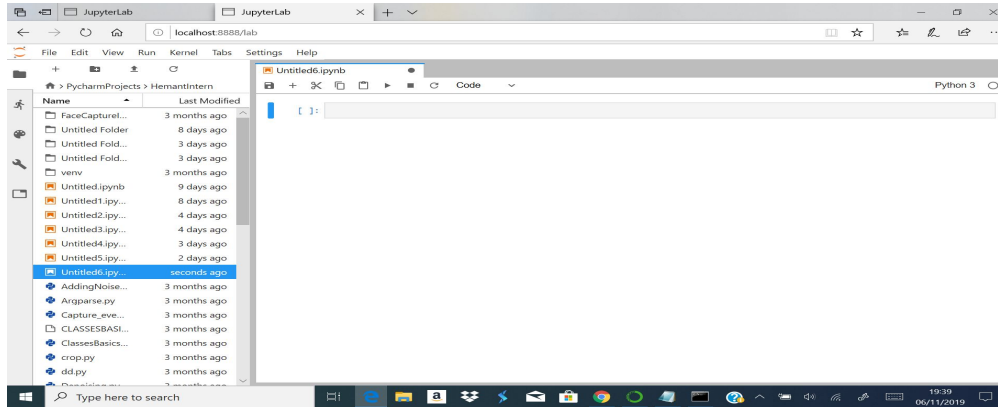




JUPYTER NOTEBOOK

Go to Command Prompt (CD)- Jupyter Lab

*Once this command is written,Jupyter Lab will open in a new Internet Tab





CODE STRUCTURE

1) Import the required libraries

The screenshot shows a JupyterLab window with a browser address bar at localhost:8888/lab. The interface includes a menu bar (File, Edit, View, Run, Kernel, Tabs, Settings, Help) and a sidebar with icons for files, search, and other tools. The main area contains a code cell labeled 'Console 8' with the following content:

```
Python 3.7.3 (default, Apr 24 2019, 15:29:51) [MSC v.1915 64 bit (AMD64)]
Type 'copyright', 'credits' or 'license' for more information
IPython 7.6.1 -- An enhanced Interactive Python. Type '?' for help.

[1]: #DataLair - Make necessary imports
import librosa
import soundfile
import os, glob, pickle
import numpy as np
from sklearn.model_selection import train_test_split
from sklearn.neural_network import MLPClassifier
from sklearn.metrics import accuracy_score
```



CODE STRUCTURE

2) Extracting the features from the librosa library; We have to extract the mfcc, chroma and mel features from the sound file. This function takes 4 Parameters – the file name and three Boolean parameters for the three features.

- mfcc: Mel Frequency Cepstral Coefficient, represents the short-term power spectrum of a sound.
- chroma: Pertains to the 12 different pitch classes.
- mel: Mel Spectrogram Frequency.



CODE STRUCTURE

- Extraction of the features from each sound file happens.
- After Extraction we store in `np.hstack(Horizontal)`
- `np.mean` is used to get the arithmetic mean of the features which is added to the `hstack`



CODE STRUCTURE

Screenshot:

```
[2]: #DataFlair - Extract features (mfcc, chroma, mel) from a sound file
def extract_feature(file_name, mfcc, chroma, mel):
    with soundfile.SoundFile(file_name) as sound_file:
        X = sound_file.read(dtype="float32")
        sample_rate=sound_file.samplerate
        if chroma:
            stft=np.abs(librosa.stft(X))
            result=np.array([])
        if mfcc:
            mfccs=np.mean(librosa.feature.mfcc(y=X, sr=sample_rate, n_mfcc=40).T, axis=0)
            result=np.hstack((result, mfccs))
        if chroma:
            chroma=np.mean(librosa.feature.chroma_stft(S=stft, sr=sample_rate).T,axis=0)
            result=np.hstack((result, chroma))
        if mel:
            mel=np.mean(librosa.feature.melspectrogram(X, sr=sample_rate).T,axis=0)
            result=np.hstack((result, mel))
    return result
```



CODE STRUCTURE

Let's define a *dictionary* to hold numbers and the emotions available in the RAVDESS dataset, and a list to hold those we want- calm, happy, fearful, disgust.

Screenshot:

```
[3]: #DataFlair - Emotions in the RAVDESS dataset
emotions={
    '01':'neutral',
    '02':'calm',
    '03':'happy',
    '04':'sad',
    '05':'angry',
    '06':'fearful',
    '07':'disgust',
    '08':'surprised'
}

#DataFlair - Emotions to observe
observed_emotions=['calm', 'happy', 'fearful', 'disgust']
```




CODE STRUCTURE

Let's load the data with a function `load_data()` – this takes in the relative size of the test set as parameter. `x` and `y` are empty lists; we'll use the `glob()` function from the `glob` module to get all the pathnames for the sound files in our dataset. The pattern we use for this is: “directory location\\Actor **.wav”. This is because our dataset looks like this:



RAVDESS Dataset Folder

his PC > Local Disk (D:) > DataFlair > ravdess data >

Name	Date modified	Type
Actor_01	9/4/2019 12:14 PM	File folder
Actor_02	9/4/2019 12:14 PM	File folder
Actor_03	9/4/2019 12:14 PM	File folder
Actor_04	9/4/2019 12:14 PM	File folder
Actor_05	9/4/2019 12:14 PM	File folder
Actor_06	9/4/2019 12:14 PM	File folder
Actor_07	9/4/2019 12:14 PM	File folder
Actor_08	9/4/2019 12:14 PM	File folder
Actor_09	9/4/2019 12:14 PM	File folder
Actor_10	9/4/2019 12:14 PM	File folder
Actor_11	9/4/2019 12:14 PM	File folder
Actor_12	9/4/2019 12:14 PM	File folder
Actor_13	9/4/2019 12:14 PM	File folder
Actor_14	9/4/2019 12:14 PM	File folder
Actor_15	9/4/2019 12:14 PM	File folder
Actor_16	9/4/2019 12:14 PM	File folder
Actor_17	9/4/2019 12:14 PM	File folder
Actor_18	9/4/2019 12:14 PM	File folder
Actor_19	9/4/2019 12:14 PM	File folder
Actor_20	9/4/2019 12:14 PM	File folder
Actor_21	9/4/2019 12:14 PM	File folder



his PC > Local Disk (D:) > DataFlair > ravdess data > Actor_01

Name	#	Title	Co
03-01-01-01-01-01			
03-01-01-01-01-02-01			
03-01-01-01-02-01-01			
03-01-01-01-02-02-01			
03-01-02-01-01-01-01			
03-01-02-01-01-02-01			
03-01-02-01-02-01-01			



CODE STRUCTURE

Using our emotions dictionary, this number is turned into an emotion, and our function checks whether this emotion is in our list of observed_emotions; if not, it continues to the next file. It makes a call to extract_feature and stores what is returned in 'feature'. Then, it appends the feature to x and the emotion to y. So, the list x holds the features and y holds the emotions. We call the function train_test_split with these, the test size, and a random state value, and return that.

```
def load_data(test_size=0.2):  
    x,y=[],[]  
    for file in glob.glob("D:\\DataFlair\\ravdess data\\Actor_.*\\.wav"):  
        file_name=os.path.basename(file)  
        emotion=emotions[file_name.split("-")[2]]  
        if emotion not in observed_emotions:  
            continue  
        feature=extract_feature(file, mfcc=True, chroma=True, mel=True)  
        x.append(feature)  
        y.append(emotion)  
    return train_test_split(np.array(x), y, test_size=test_size, random_state=9)
```



CODE STRUCTURE

Time to split the dataset into training and testing sets, keep the test set 25% of everything and use the `load_data` function for this.

```
#DataFlair - Split the dataset  
x_train,x_test,y_train,y_test=load_data(test_size=0.25)
```



CODE STRUCTURE

Observe the shape of the training and testing datasets;

```
#DataFlair - Get the shape of the training and testing  
datasets  
print((x_train.shape[0], x_test.shape[0]))
```



CODE STRUCTURE

Get the number of features extracted;

Output Screenshot:

```
[7]: #DataFlair - Get the number of features extracted  
print(f'Features extracted: {x_train.shape[1]}')  
  
Features extracted: 180
```




CODE STRUCTURE

- Initialize an MLPClassifier. This is a Multi-layer Perceptron Classifier.
- The MLPClassifier has an internal neural network for the purpose of classification. This is a feedforward ANN model.

```
#DataFlair - Initialize the Multi Layer Perceptron  
Classifier  
model=MLPClassifier(alpha=0.01, batch_size=256, epsilon=1e-  
08, hidden_layer_sizes=(300,), learning_rate='adaptive',  
max_iter=500)
```



CODE STRUCTURE

Let's predict the values for the test set. This gives us `y_pred` (the predicted emotions for the features in the test set).

Screenshot:

```
[10]: #DataFlair - Predict for the test set  
      y_pred=model.predict(x_test)
```



CODE STRUCTURE

To calculate the accuracy of our model, we'll call up the `accuracy_score()` function we imported from [sklearn](#). Finally, we'll round the accuracy to 2 decimal places and print it out.

Output Screenshot:

```
[11]: #DataFlair - Calculate the accuracy of our model
      accuracy=accuracy_score(y_true=y_test, y_pred=y_pred)

      #DataFlair - Print the accuracy
      print("Accuracy: {:.2f}%".format(accuracy*100))

      Accuracy: 72.40%
```



CODE STRUCTURE

Create a directory called result and save the trained model as “.model” file.

```
# now we save the model
# make result directory if doesn't exist yet
if not os.path.isdir("result"):
    os.mkdir("result")

pickle.dump(model, open("result/mlp_classifier.model", "wb"))
```



Installation: Pyaudio

Installing pyaudio from the github repository, open the file:

- PyAudio-0.2.11-cp37-cp37m-win_amd64.whl
- `pip install PyAudio-0.2.11-cp37-cp37m-win_amd64.whl`
- Also download the utils.py script



Testing the trained model : CODE STRUCTURE

- Testing the Trained Model, Install the library Pyaudio
- Install the other required libraries

```
1 import pyaudio
2 import os
3 import wave
4 import pickle
5 from sys import byteorder
6 from array import array
7 from struct import pack
8 from sklearn.neural_network import MLPClassifier
9
10 from utils import extract_feature
11
```



Testing the trained model : CODE STRUCTURE

- We are creating different functions which are used to clean the

```
51     # Trim to the right
52     snd_data.reverse()
53     snd_data = _trim(snd_data)
54     snd_data.reverse()
55     return snd_data
56
57 def add_silence(snd_data, seconds):
58     "Add silence to the start and end of 'snd_data' of length 'seconds' (float)"
59     r = array('h', [0 for i in range(int(seconds*RATE))])
60     r.extend(snd_data)
61     r.extend([0 for i in range(int(seconds*RATE))])
62     return r
63
64 def record():
65     """
66     Record a word or words from the microphone and
67     return the data as an array of signed shorts.
68
69     Normalizes the audio, trims silence from the
70     start and end, and pads with 0.5 seconds of
71     blank sound to make sure VLC et al can play
72     it without getting chopped off.
73     """
74     p = pyaudio.PyAudio()
75     stream = p.open(format=FORMAT, channels=1, rate=RATE,
76                     input=True, output=True,
77                     frames_per_buffer=CHUNK_SIZE)
78
79     num_silent = 0
```



Testing the trained model : CODE STRUCTURE

- Once the testing of the trained model is done we give in the desired input

```
if __name__ == "__main__":  
    # Load the saved model (after training)  
    model = pickle.load(open("result/mlp_classifier.model", "rb"))  
    print("Please talk")  
    filename = "test.wav"  
    # record the file (start talking)  
    record_to_file(filename)  
    # extract features and reshape it  
    features = extract_feature(filename, mfcc=True, chroma=True, mel=True).reshape(1, -1)  
    # predict  
    result = model.predict(features)[0]  
    # show the result !  
    print("result:", result)
```

Please talk
result: happy