```
In [1]:
# mounting drive
from google.colab import drive
drive.mount('/content/gdrive')
Mounted at /content/gdrive
In [13]:
# importing libraries
import os
import numpy as np
import pandas as pd
import cv2
import h5py
from keras import backend as K
from keras.models import Sequential
from keras.layers import Conv2D, BatchNormalization, Activation, MaxPooling2D
from keras.layers import Flatten, Dense
import tensorflow as tf
import tensorflow addons as tfa
from os import listdir
from os.path import isfile, join
import sys
import dlib
import moviepy.editor as mpy
import wave
import scipy.io.wavfile as wav
import contextlib
In [18]:
pip install speechpy
Collecting speechpy
 Downloading
https://files.pythonhosted.org/packages/8f/12/dbda397a998063d9541d9e149c4f523ed138a48824d20598e3763
3b1/speechpy-2.4-py2.py3-none-any.whl
Requirement already satisfied: numpy in /usr/local/lib/python3.6/dist-packages (from speechpy)
Requirement already satisfied: scipy in /usr/local/lib/python3.6/dist-packages (from speechpy)
(1.4.1)
Installing collected packages: speechpy
Successfully installed speechpy-2.4
4
In [19]:
import speechpy
#http://www.practicalcryptography.com/miscellaneous/machine-learning/guide-mel-frequency-cepstral-
coefficients-mfccs/
def audio processing(wav file, verbose):
    ''' takes audio file as input and creates mfcc features '''
    """To extract mfcc features of audio, clips 0.2 seconds in length each,
    i.e. of 20 MFCC features in each clip (acc. to syncnet paper)
    Output mfcc clips shape ==== (N, 12, 20, 1),
    where N = len(mfcc\_features) // 20
    11 11 11
    rate, sig = wav.read(wav_file)
    if verbose:
      print("Sig length: {}, sample rate: {}".format(len(sig), rate))
```

```
try:
       mfcc features = speechpy.feature.mfcc(sig, sampling frequency=rate, frame length=0.010, fra
me stride=0.010)
   except IndexError:
       raise ValueError ("ERROR: Index error occurred while extracting mfcc")
    if verbose:
       print("mfcc features shape:", mfcc features.shape)
    # Number of audio clips = len(mfcc features) // length of each audio clip
    number of audio clips = len(mfcc features) // AUDIO TIME STEPS
    if verbose:
       print("Number of audio clips:", number of audio clips)
    # Don't consider the first MFCC feature, only consider the next 12 (Checked in syncnet demo.m)
    # Also, only consider AUDIO_TIME_STEPS*number_of_audio_clips features
   mfcc features = mfcc features[:AUDIO TIME STEPS*number of audio clips, 1:]
    # Reshape mfcc features from (x, 12) to (x//20, 12, 20, 1)
   mfcc features = np.expand dims(np.transpose(np.split(mfcc features, number of audio clips), (0,
2, 1)), axis=-1)
   if verbose:
       print("Final mfcc features shape:", mfcc features.shape)
    return mfcc features
```

# In [5]:

```
def make rect shape square(rect):
   # Rect: (x, y, x+w, y+h)
   x = rect[0]
   y = rect[1]
    w = rect[2] - x
   h = rect[3] - v
    # If width > height
   if w > h:
       new x = x
       new_y = int(y - (w-h)/2)
       new w = w
       new h = w
    # Else (height > width)
       new x = int(x - (h-w)/2)
       new y = y
       new w = h
       new h = h
    return [new_x, new_y, new_x + new_w, new_y + new_h]
def expand rect(rect, scale, frame shape, scale w=1.5, scale h=1.5):
    if scale is not None:
       scale w = scale
       scale h = scale
    \# Rect: (x, y, x+w, y+h)
    x = rect[0]
    y = rect[1]
    w = rect[2] - x
    h = rect[3] - y
    # new_w, new_h
    new_w = int(w * scale w)
    new h = int(h * scale h)
    # new x
    new x = int(x - (new w - w)/2)
    if new x < 0:
       new w = new x + new w
       new x = 0
    elif new_x + new_w > (frame_shape[1] - 1):
       new_w = (frame_shape[1] - 1) - new_x
    # new_y
    new_y = int(y - (new_h - h)/2)
    if new y < 0:
      new h = new v + new h
```

```
new_y = 0
    elif new_y + new_h > (frame_shape[0] - 1):
       new_h = (frame_shape[0] - 1) - new_y
    return [new x, new y, new x + new w, new y + new h]
def detect mouth in frame (frame, detector, predictor, prevFace, verbose):
    ''' takes frames as input and detect face and mouth from it, then return it with proper coordi
nates '''
    # Detect all faces
    faces = detector(frame, 1)
    # If no faces are detected
    if len(faces) == 0:
        if verbose:
           print("No faces detected, using prevFace", prevFace, "(detect mouth in frame)")
        faces = [prevFace]
    # Note first face (ASSUMING FIRST FACE IS THE REQUIRED ONE!)
    face = faces[0]
    # Predict facial landmarks
    shape = predictor(frame, face)
    # Note all mouth landmark coordinates
   mouthCoords = np.array([[shape.part(i).x, shape.part(i).y] for i in range(48, 68)])
    # Mouth Rect: x, y, x+w, y+h
    mouthRect = [np.min(mouthCoords[:, 1]), np.min(mouthCoords[:, 0]),
                 np.max(mouthCoords[:, 1]), np.max(mouthCoords[:, 0])]
    # Make mouthRect square
    mouthRect = make rect shape square(mouthRect)
    # Expand mouthRect square
    expandedMouthRect = expand rect(mouthRect, scale=(MOUTH TO FACE RATIO * face.width() / mouthRec
t[2]), frame shape=(frame.shape[0], frame.shape[1]))
    mouth = frame[expandedMouthRect[1]:expandedMouthRect[3],
                  expandedMouthRect[0]:expandedMouthRect[2]]
    # # Resize to 120x120
    # resizedMouthImage = np.round(resize(mouth, (120, 120), preserve range=True)).astype('uint8')
    # Return mouth
    return mouth, face
def video processing(video):
  ''' takes video as input and returns array for the detected mouth '''
 predictor path = '/content/gdrive/My Drive/shape_predictor_68_face_landmarks.dat'
 detector = dlib.get frontal face detector()
 predictor = dlib.shape predictor(predictor path)
 cap = cv2.VideoCapture(video)
  # Default face rect
  face = dlib.rectangle(30, 30, 220, 220)
  lip model input = []
  frame index = 0
 while(cap.isOpened()):
          frames = []
          for i in range(5):
              _, frame = cap.read()
              frame_index += 1
              # print("Frame", frame index+1, "of", frameCount, end="\r")
              # If no frame is read, break
              if frame is None:
                  break
              # Detect mouth in the frame
              mouth, _ = detect_mouth_in_frame(frame, detector, predictor, prevFace=face, verbose=F
alse)
              # Convert mouth to grayscale
              mouth = cv2.cvtColor(mouth, cv2.COLOR BGR2GRAY)
```

```
# Resize mouth to syncnet input shape
mouth = cv2.resize(mouth, (MOUTH_W, MOUTH_H))

# Subtract 110 from all mouth values (Checked in syncnet_demo.m)
mouth = mouth - 110.

frames.append(mouth)

if len(frames) == 5:
    stacked = np.stack(frames, axis=-1) #syncnet requires (112,112,5)
    lip_model_input.append(stacked)
else:
    break

return np.array(lip_model_input)
```

#### In [6]:

```
def syncnet lip model v4():
    ''' model layers for lip area from video '''
    # Image data format
   K.set image data format(IMAGE DATA FORMAT)
   input shape = ( MOUTH H, MOUTH W, SYNCNET VIDEO CHANNELS)
   lip model = Sequential()
                               # ( None, 112, 112, 5)
   # conv1 lip
   lip model.add(Conv2D(96, (3, 3), padding='valid', input shape=input shape, name='conv1 lip'))
# (None, 110, 110, 96)
    # bn1 lip
   lip model.add(BatchNormalization(name='bn1 lip'))
    # relu1 lip
   lip model.add(Activation('relu', name='relu1 lip'))
    # pool1 lip
   lip model.add(MaxPooling2D(pool size=(3, 3), strides=(2, 2), padding='valid', name='pool1 lip')
  # (None, 54, 54, 96)
   # conv2 lip
   lip_model.add(Conv2D(256, (5, 5), padding='valid', name='conv2_lip')) # (None, 256, 50, 50)
    # bn2 lip
   lip model.add(BatchNormalization(name='bn2 lip'))
    # relu2 lip
   lip model.add(Activation('relu', name='relu2 lip'))
    # pool2 lip
   lip model.add(MaxPooling2D(pool size=(3, 3), strides=(2, 2), padding='valid', name='pool2 lip')
   # (None, 24, 24, 256)
   # conv3 lip
   lip_model.add(Conv2D(512, (3, 3), padding='valid', name='conv3 lip')) # (None, 22, 22, 512)
   # bn3 lip
   lip model.add(BatchNormalization(name='bn3 lip'))
    # relu3 lip
   lip_model.add(Activation('relu', name='relu3_lip'))
    # conv4 lip
   lip model.add(Conv2D(512, (3, 3), padding='valid', name='conv4 lip')) # (None, 20, 20, 512)
   # bn4 lip
   lip model.add(BatchNormalization(name='bn4 lip'))
   lip_model.add(Activation('relu', name='relu4_lip'))
    # conv5 lip
   lip model.add(Conv2D(512, (3, 3), padding='valid', name='conv5_lip')) # (None, 18, 18, 512)
    # bn5 lip
   lip model.add(BatchNormalization(name='bn5 lip'))
    # relu5 lip
   lip_model.add(Activation('relu', name='relu5_lip'))
   # pool5 lip
   lip_model.add(MaxPooling2D(pool_size=(3, 3), strides=(3, 3), padding='valid', name='pool5_lip')
   # (None. 6. 6. 512)
```

```
# fc6_lip
lip_model.add(Flatten(name='flatten_lip'))
lip_model.add(Dense(256, name='fc6_lip'))  # (None, 256)
# bn6_lip
lip_model.add(BatchNormalization(name='bn6_lip'))
# relu6_lip
lip_model.add(Activation('relu', name='relu6_lip'))

# fc7_lip
lip_model.add(Dense(128, name='fc7_lip'))  # (None, 128)
# bn7_lip
lip_model.add(BatchNormalization(name='bn7_lip'))
# relu7_lip
lip_model.add(Activation('relu', name='relu7_lip'))

return_lip_model
```

### In [7]:

```
def syncnet audio model v4():
    ''' model layers for audio features '''
    # Audio input shape
   input shape = ( SYNCNET MFCC CHANNELS, AUDIO TIME STEPS, 1)
    audio model = Sequential() # (None, 12, 20, 1)
   # conv1 audio
   audio model.add(Conv2D(64, (3, 3), padding='same', name='conv1 audio', input shape=input shape)
  # (None, 12, 20, 64)
   # bnl audio
   audio model.add(BatchNormalization(name='bn1 audio'))
   audio model.add(Activation('relu', name='relu1 audio'))
    # conv2 audio
   audio model.add(Conv2D(128, (3, 3), padding='same', name='conv2 audio')) # (None, 12, 20, 128
   # bn2 audio
    audio model.add(BatchNormalization(name='bn2 audio'))
    # relu2_audio
   audio model.add(Activation('relu', name='relu2 audio'))
    # pool2 audio
   audio_model.add(MaxPooling2D(pool_size=(1, 3), strides=(1, 2), padding='valid', name='pool2_aud
io')) # (None, 12, 9, 128)
    # conv3 audio
    audio model.add(Conv2D(256, (3, 3), padding='same', name='conv3 audio')) # (None, 12, 9, 256)
    # bn3 audio
   audio model.add(BatchNormalization(name='bn3 audio'))
   # relu3 audio
   audio model.add(Activation('relu', name='relu3 audio'))
    # conv4 audio
    audio_model.add(Conv2D(256, (3, 3), padding='same', name='conv4_audio')) # (None, 12, 9, 256)
    # bn4_audio
    audio model.add(BatchNormalization(name='bn4 audio'))
    # relu4 audio
    audio model.add(Activation('relu', name='relu4 audio'))
    # conv5 audio
    audio model.add(Conv2D(256, (3, 3), padding='same', name='conv5 audio')) # (None, 12, 9, 256)
    # bn5 audio
    audio model.add(BatchNormalization(name='bn5 audio'))
    # relu5 audio
    audio_model.add(Activation('relu', name='relu5_audio'))
    # pool5 audio
    audio model add/MayPooling?D/nool size=(3 3) strides=(2 2) nadding='walid' name='nool5 aud
```

```
audio_model.add(maxiooting2b(poot_size=(0, 0), stitues=(2, 2), padding= vaitd , name= poots_add
io')) # (None, 5, 4, 256)
    # fc6_audio
    audio model.add(Flatten(name='flatten audio'))
    audio_model.add(Dense(256, name='fc6_audio'))
                                                    # (None, 256)
    # bn6 audio
    audio model.add(BatchNormalization(name='bn6 audio'))
    # relu6 audio
    audio model.add(Activation('relu', name='relu6 audio'))
    # fc7 audio
    audio model.add(Dense(128, name='fc7 audio')) # (None, 128)
    # bn7_audio
    audio model.add(BatchNormalization(name='bn7 audio'))
    # relu7 audio
    audio_model.add(Activation('relu', name='relu7_audio'))
    return audio model
```

## In [8]:

```
def load syncnet model(mode, verbose):
    ''' loading the syncnet model '''
    if mode == 'lip' or mode == 'both':
     # Load frontal model
     syncnet_lip_model = syncnet_lip_model_v4()
    if mode == 'audio' or mode == 'both':
      # Load frontal model
     syncnet audio model = syncnet audio model v4()
    if mode == 'lip':
       syncnet model = syncnet lip model
    elif mode == 'audio':
       syncnet_model = syncnet_audio_model
    elif mode == 'both':
       syncnet model = [syncnet audio model, syncnet lip model]
    return syncnet model
# https://github.com/voletiv/syncnet-in-keras/blob/master/syncnet-weights/syncnet-weights-
readme.md
def load syncnet weights( verbose):
    ''' reading and loading pre trained weights file '''
    syncnet weights file = '/content/gdrive/My Drive/lipsync v4 73.mat'
    if verbose:
        print("Loading syncnet weights from", syncnet weights file)
    if not os.path.isfile(syncnet weights file):
        raise ValueError(
            "\n\nERROR: synchet weight file missing!! File: " + synchet weights file + \
            "\nPlease specify correct file name in the synchet_params.py file and relaunch.\n")
    # Read weights file, with layer names
    with h5py.File(syncnet weights file, 'r') as f:
        syncnet_weights = [f[v[0]][:] for v in f['net/params/value']]
        syncnet_layer_names = [[chr(i) for i in f[n[0]]] \
                               for n in f['net/layers/name']]
    # Find the starting index of audio and lip layers
    audio found = False
    audio_start_idx = 0
    lip found = False
    lip start idx = 0
    # Join the chars of layer names to make them words
    for i in range(len(syncnet_layer_names)):
        syncnet_layer_names[i] = ''.join(syncnet_layer_names[i])
```

```
# Finding audio start idx
        if not audio found and 'audio' in syncnet_layer_names[i]:
           audio found = True
           if verbose:
               print("Found audio")
        elif not audio found and 'audio' not in syncnet layer names[i]:
           if 'conv' in synchet layer names[i]:
               audio start idx += 2
            elif 'bn' in syncnet layer names[i]:
               audio_start_idx += 3
           elif 'fc' in syncnet_layer_names[i]:
               audio start idx += 2
        # Finding lip start idx
        if not lip found and 'lip' in syncnet layer names[i]:
            lip_found = True
            if verbose:
               print("Found lip")
        elif not lip found and 'lip' not in syncnet layer names[i]:
            if 'conv' in syncnet_layer_names[i]:
               lip_start_idx += 2
           elif 'bn' in syncnet_layer_names[i]:
               lip_start_idx += 3
            elif 'fc' in syncnet_layer_names[i]:
               lip start idx += 2
        if verbose:
           print(" ", i, syncnet layer names[i])
   if verbose:
       print(" lip_start_idx =", lip_start_idx)
       print(" audio_start_idx =", audio_start_idx)
   return syncnet_weights, syncnet_layer_names, audio_start_idx, lip_start_idx
def set syncnet weights to syncnet model (syncnet model, syncnet weights, syncnet layer names, mode
, verbose):
   ''' loading pre trained weights into the syncnet model layers '''
   if verbose:
       print("Setting weights to model")
    # Video syncnet-related weights begin at 35 in syncnet weights
   if mode == 'lip':
       syncnet weights idx = 35
   else:
       syncnet_weights_idx = 0
   if mode == 'both':
       syncnet lip model = syncnet model[0]
        syncnet_audio_model = syncnet_model[1]
    # Init syncnet layer idx, to be incremented only at 'lip' layers
   syncnet_layer_idx = -1
    # Load weights layer-by-layer
   for i in synchet layer names:
        # Skip the irrelevant layers
       if mode == 'lip' and 'lip' not in i:
           continue
       elif mode == 'audio' and 'audio' not in i:
           continue
        \# Increment the index on the model
       synchet layer idx += 1
        if verbose:
           print(" SyncNet Layer", syncnet layer idx, ":", i, "; weight index :",
syncnet weights idx)
        # Convolutional layer
       if 'conv' in i:
           syncnet model.layers[syncnet layer idx].set weights(
               [np.transpose(syncnet weights[syncnet weights idx], (2, 3, 1, 0)),
                np.squeeze(syncnet_weights[syncnet_weights_idx + 1])])
            armanat radiahta ida 1-
```

```
synchet_weights_tax += Z
        # Batch Normalization layer
        elif 'bn' in i:
            syncnet model.layers[syncnet layer idx].set weights(
                [np.squeeze(syncnet_weights[syncnet_weights_idx]),
                 np.squeeze(syncnet_weights[syncnet_weights_idx + 1]),
                 syncnet weights[syncnet weights idx + 2][0],
                 syncnet_weights[syncnet_weights_idx + 2][1]])
            syncnet weights idx += 3
        # ReLU layer
        elif 'relu' in i:
            continue
        # Pooling layer
        elif 'pool' in i:
            continue
        # Dense (fc) layer
        elif 'fc' in i:
            # Skip Flatten layer
            if 'flatten' in syncnet_model.layers[syncnet_layer_idx].name:
                syncnet layer idx += 1
            # Set weight to Dense layer
            syncnet model.layers[syncnet layer idx].set weights(
                [np.reshape(
                    np.transpose(syncnet weights[syncnet weights idx],
                        (2, 3, 1, 0)),
                     (syncnet weights[syncnet weights idx].shape[2]*\
                     syncnet weights[syncnet weights idx].shape[3]*\
                     syncnet weights[syncnet weights idx].shape[1],
                     syncnet_weights[syncnet_weights_idx].shape[0])),
                np.squeeze(syncnet_weights[syncnet_weights_idx + 1])])
            synchet weights idx += 2
def load pretrained synchet model(mode, verbose):
    ''' final function to call loading functions here and prepare the final model'''
    # mode = {lip, audio, both}
    if mode not in {'lip', 'audio', 'both'}:
    print("\n\nERROR: 'mode' not defined properly! Expected one of {'lip', 'audio', 'both'}, g
ot:", mode, "\n")
       return
    try:
        # Load syncnet model
        syncnet_model = load_syncnet_model(mode=mode, verbose=verbose)
        if verbose:
            print("Loaded syncnet model")
        # Read weights and layer names
        syncnet weights, syncnet layer names, audio start idx, lip start idx = load syncnet weights
(verbose=verbose)
        if werhose.
            print("Loaded syncnet weights.")
        # Set lip weights to syncnet model
        if mode != 'both':
            set_syncnet_weights_to_syncnet_model(syncnet_model=syncnet_model,
                                                   \verb|syncnet_weights=syncnet_weights|,
                                                   syncnet layer names=syncnet layer names,
                                                   mode=mode,
                                                   verbose=verbose)
        else:
            # Audio
            set_syncnet_weights_to_syncnet_model(syncnet_model=syncnet model[0],
                                                   syncnet weights=syncnet weights,
                                                   syncnet_layer_names=syncnet_layer_names,
                                                   mode='audio',
                                                   verbose=verbose)
            set syncnet weights to syncnet model(syncnet model=syncnet model[1],
                                                   syncnet_weights=syncnet_weights,
```

```
synchet layer names=synchet layer names,
                                                  mode='lip',
                                                  verbose=verbose)
        if verbose:
            print("Set syncnet weights.")
    except ValueError as err:
        print(err)
        return
    except KeyboardInterrupt:
       print("\n\nCtrl+C was pressed!\n")
        return
    return synchet model
In [9]:
# calling function to load model with weights
mode = 'both'
model=load pretrained syncnet model ( mode=mode, verbose=False)
Out[9]:
[<tensorflow.python.keras.engine.sequential.Sequential at 0x7f3d0fac7550>,
 <tensorflow.python.keras.engine.sequential.Sequential at 0x7f3cdf82fa58>]
In [10]:
# distance functions in tf
def euclidean_distance_loss(y_true, y_pred):
    ''' using tensorflow implementation to calculate distance '''
    dists = tf.linalg.norm(y pred - y true, axis=1)
    return dists
def distance euc tf(feat1, feat2, vshift=15):
  ''' takes 2 tensors as input and return euclidian distance between those '''
  win size = vshift*2+1
 paddings = tf.constant([[vshift, vshift+1,], [0, 0]])
  feat2p = tf.pad(feat2, paddings, "CONSTANT")
                                                             # padding for feat2
  if len(feat2p) < len(feat1)+win size:</pre>
   # after padding in feat2, if still not getting enough rows to calculate distance in below for
loop, we have to pad 'n' more rows
    n = len(feat1)+win size-len(feat2p)
    padd = tf.constant([[0, n,], [0, 0]])
    feat2p = tf.pad(feat2p, padd, "CONSTANT")
  dists = []
  # we have to create pairwise distance, so running below for loop so it'll calculate distance of
every row of feat1 with every 31 rows sample of feat2p
  for i in range(0,len(feat1)):
    a=tf.repeat([feat1[i,:]], win size, axis=0)
    b=feat2p[i:i+win size,:]
    dists.append(euclidean distance loss(a, b))
  mdist = np.mean(np.stack(dists,1),1)
                                          # mdist will be array of 31 values
  mdist = tf.convert_to_tensor(mdist)
  return mdist
In [11]:
def loss_function(y_true, pred_dist):
```

''' calculates contrastive loss between true and predictive values '''

```
e=0
for i in range(31):
    e = e + (y_true[i]*(pred_dist[i])**2) + ((1-y_true[i])*max(1-pred_dist[i],0)**2)
loss = e/(2*31)
return loss
```

# In [24]:

```
def final fun 1(video):
   MOUTH H = 112
   MOUTH W = 112
   FACE H = 224
   FACE W = 224
   MOUTH TO FACE RATIO = 0.65
    SYNCNET VIDEO FPS = 25
    SYNCNET VIDEO CHANNELS = int(0.2 * SYNCNET VIDEO FPS) # 5
    SYNCNET MFCC CHANNELS = 12
    AUDIO TIME STEPS = 20
   IMAGE DATA FORMAT = 'channels last'
   user=video.split(' ')[2]
   user=user.split('/')[1]
   au=video.split('_')[-1]
   au=au.split('.')[0]
   video_fea=video_processing(video)
   audio_fea=audio_processing('/content/gdrive/My Drive/VIDTIMIT/'+user+'/audio/'+au+'.wav',False
    #print('video and audio features respectively :',video_fea.shape,audio_fea.shape)
    audio pred = model[0].predict(audio fea)
    lip pred = model[1].predict(video fea)
    return lip pred, audio pred
def final_fun_2(lip_pred, audio_pred, y_true):
   d = distance_euc_tf(lip_pred, audio_pred)
    #print('distance :',d)
    conf = np.median(d)-min(d)
    if conf>3.5:
     print ('video is real')
   else:
     print ('video is fake')
    l=loss function(y true,d)
    return 1
```

### In [25]:

```
# calling final function

video='/content/gdrive/My Drive/vidtimit_videos/tampered/fadg0_sal.mp4'

lip_pred, audio_pred = final_fun_1(video)  # calling function 1

print('video predicted shape',lip_pred.shape)

print('audio predicted shape',audio_pred.shape)

y_true=[0 for i in range(31)]
loss = final_fun_2(lip_pred, audio_pred, y_true)  # calling function 2

print('loss is :', loss)

video predicted shape (23, 128)
audio predicted shape (23, 128)
video is fake
loss is : tf.Tensor(72.666695, shape=(), dtype=float32)
In []:
```