Speaker Signals Recognition

TuanKhai Nguyen

tran.tuan.khai.nguyen@vanderbilt.edu

EECE 5356 – Digital Signal Processing

I. Overview

We built:

main.m – big script contain all the helper functions. Run main.m by *Run sections*, not full script, to get what we want.

createDatabase.m – create a matrix that concatenates training signals of 1 subject.

Input: NONE, but user have to choose folder with all voice signals of a subject when prompted.

Output: train matrix of that subject.

processVoice.m – Do all the Fourier transform, spectrogram, and normalization for 1 signal.

Input: file name for voice signal of 1 subject

Output: processed signal of 1 subject

calcScore.m – calculate the difference score between a voice signal and a voice matrix of 1 subject

Input: 1 unknown signal, 1 train matrix of a subject

Output: difference score

classify.m – classify sound signals of unknown subject in train set.

Input: a) All train matrices b) folder of unknown subject to classify

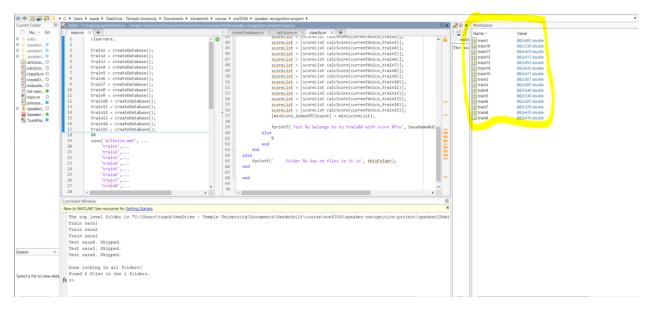
Output: Classification + score of each file.

classifyUnknown.m – similar to classify.m but for unknown subjects NOT in train set.

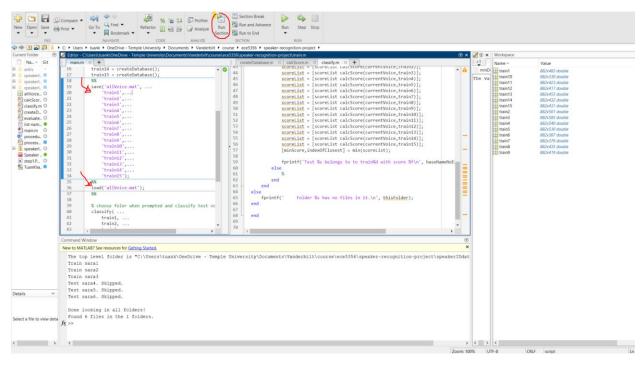
We design it this way since voice signals do not have the same lengths which did not allow concatenation / grouping of all processed voices into 1 big matrix. Every subject has their own training matrix.

II. Classify unknowns of subjects included in train set.

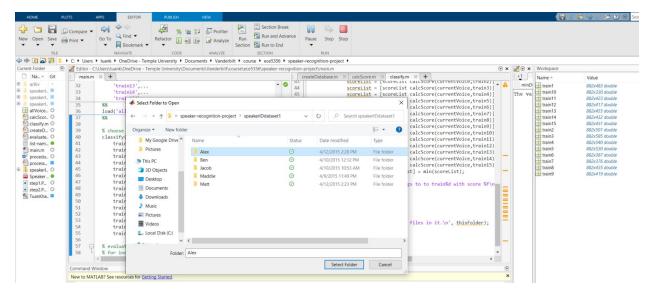
Step 1: Run first section of **main.m** to get all training matrices. We have 15 training subjects so 15 matrices to be obtained:



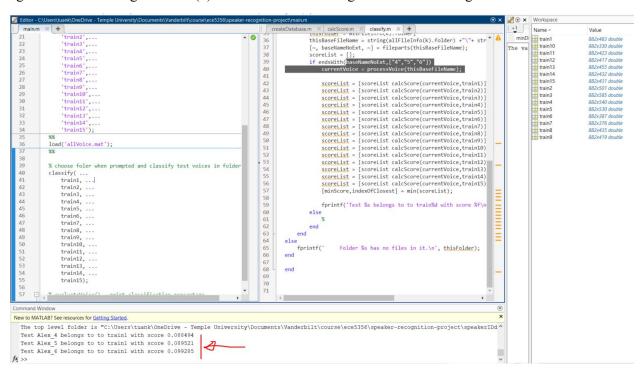
Step 2: We can save training data and reload for future use. Run the next section of main.m:



Step 3: Run the 'classify' section in **main.m**, which calls **classify.m** and prompts user to pick a folder containing the '.wav' files.



When chosen, **classify.m** will (1) pick out the files used for testing, (2) compute the difference score against all 15 training matrices (3) Print out which training set/matrix it belongs to:



We did the same for all other folders, results are shown below:

| Filename | Class/score | Filename | Class/score | Filename | Class/score |
|----------|---------------|----------|--------------|----------|----------------|
| Alex4 | Alex(train1)/ | Ben4 | Ben(train2)/ | Jacob4 | Jacob(train3)/ |
| | 0.088494 | | 0.080054 | | 0.121352 |
| Alex5 | Alex(train1)/ | Ben5 | Ben(train2)/ | Jacob5 | Jacob(train3)/ |
| | 0.089521 | | 0.084463 | | 0.125160 |

| Alex6 | Alex(train1)/ 0.099285 | Ben6 | Ben(train2)/ 0.070069 | Jacob6 | Jacob(train3)/ 0.111311 |
|---------|------------------------------|--------|-----------------------------|---------|-----------------------------|
| Maddie4 | Maddie(train4)/ 0.103010 | Matt4 | Matt(train5)/ 0.086573 | Akash4 | Akash (train6)/ 0.047665 |
| Maddie5 | Maddie(train4)/ 0.104005 | Matt5 | Matt(train5)/ 0.095349 | Akash5 | Akash (train6)/ 0.046104 |
| Maddie6 | Maddie(train4)/ 0.114670 | Matt6 | Matt(train5)/ 0.089152 | Akash6 | Akash (train6)/ 0.047501 |
| Daniel4 | Daniel(train7)/ 0.065633 | Eliza4 | Eliza(train8)/ 0.067229 | Google4 | Google(train9)/ 0.034247 |
| Daniel5 | Daniel(train7)/ 0.062741 | Eliza5 | Eliza(train8)/ 0.085958 | Google5 | Google(train9)/ 0.032982 |
| Daniel6 | Daniel(train7)/ 0.072744 | Eliza6 | Eliza(train8)/ 0.069994 | Google6 | Google(train9)/ 0.036938 |
| Steven4 | Steven(train10)/ 0.045543 | Brian4 | Brian(train11)/ 0.059301 | Comp4 | Comp(train12)/ 0.036301 |
| Steven5 | Steven(train10)/ 0.066062 | Brian5 | Brian(train11)/ 0.059043 | Comp5 | Comp(train12)/ 0.045199 |
| Steven6 | Steven(train10)/ 0.052815 | Brian6 | Brian(train11)/ 0.060871 | Comp6 | Comp(train12)/ 0.032081 |
| Grant4 | Grant(train13)/ 0.061090 | Jay4 | Jay(train14)/ 0.057707 | Sara4 | Sara(train15)/ 0.085842 |
| Grant5 | Grant(train13)/ 0.055018 | Jay5 | Jay(train14)/ 0.060371 | Sara5 | Sara(train15)/ 0.079005 |
| Grant6 | Grant(train13)/ 0.064005 | Jay6 | Jay(train14)/ 0.047832 | Sara6 | Sara(train15)/ 0.080588 |

Full log is displayed here:

(I went to Temple before Vanderbilt so the Temple OneDrive folder)

```
The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Alex 4 belongs to to train1 with score 0.088494
 Test Alex 5 belongs to to train1 with score 0.089521
 Test Alex 6 belongs to to train1 with score 0.099285
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Ben 4 belongs to to train2 with score 0.080054
 Test Ben 5 belongs to to train2 with score 0.084463
 Test Ben 6 belongs to to train2 with score 0.070069
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Jacob 4 belongs to to train3 with score 0.121352
 Test Jacob 5 belongs to to train3 with score 0.125160
  Test Jacob 6 belongs to to train3 with score 0.111311
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Maddie 4 belongs to to train4 with score 0.103010
 Test Maddie 5 belongs to to train4 with score 0.104005
 Test Maddie 6 belongs to to train4 with score 0.114670
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Matt 4 belongs to to train5 with score 0.086573
 Test Matt 5 belongs to to train5 with score 0.095349
 Test Matt 6 belongs to to train5 with score 0.089152
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Akash4 belongs to to train6 with score 0.047665
 Test Akash5 belongs to to train6 with score 0.046104
 Test Akash6 belongs to to train6 with score 0.047501
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Daniel4 belongs to to train7 with score 0.065633
 Test Daniel5 belongs to to train7 with score 0.062741
 Test Daniel6 belongs to to train7 with score 0.072744
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Eliza4 belongs to to train8 with score 0.067229
 Test Eliza5 belongs to to train8 with score 0.085958
 Test Eliza6 belongs to to train8 with score 0.069994
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
. Test Google4 belongs to to train9 with score 0.034247
```

```
Test Google4 belongs to to train9 with score 0.034247
 Test Google5 belongs to to train9 with score 0.032982
 Test Google6 belongs to to train9 with score 0.036938
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Steven4 belongs to to train10 with score 0.045543
 Test Steven5 belongs to to train10 with score 0.066062
 Test Steven6 belongs to to train10 with score 0.052815
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test Brian4 belongs to to train11 with score 0.059301
 Test Brian5 belongs to to train11 with score 0.059043
 Test Brian6 belongs to to train11 with score 0.060871
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test comp4 belongs to to train12 with score 0.036301
 Test comp5 belongs to to train12 with score 0.045199
 Test comp6 belongs to to train12 with score 0.032081
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test grant4 belongs to to train13 with score 0.061090
 Test grant5 belongs to to train13 with score 0.055018
 Test grant6 belongs to to train13 with score 0.064005
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test jay4 belongs to to train14 with score 0.057707
 Test jay5 belongs to to train14 with score 0.060371
 Test jay6 belongs to to train14 with score 0.047832
 The top level folder is "C:\Users\tuank\OneDrive - Temple Universi
 Test sara4 belongs to to train15 with score 0.085842
 Test sara5 belongs to to train15 with score 0.079005
 Test sara6 belongs to to train15 with score 0.080588
:>>
```

III. Classify unknowns of subjects NOT included in train set.

Some initial experiments show that our classification method from **part I.** produces relatively consistent results on which train set where subjects, NOT coming from the train set, are the closest to, except for the variance for <u>DavidR</u>.

We can come up with a simple way that make use of the scoring function developed from part I.

| Alex (train1) | 0.092433± | Ben (train2) | 0.078195± | Jacob (train3) | 0.119274± |
|------------------|----------------|-----------------|----------------|-----------------|---------------|
| | 0.005956 | | 0.007375 | | 0.007155 |
| Maddie (train4) | 0.107228± | Matt (train5) | $0.090358 \pm$ | Akash (train6) | $0.047090\pm$ |
| | 0.006464 | | 0.004511 | | 0.000858 |
| Daniel (train7) | $0.067039\pm$ | Eliza (train8) | $0.074394 \pm$ | Google (train9) | 0.034723± |
| | 0.005148 | | 0.010110 | | 0.002020 |
| Steven (train10) | $0.054807 \pm$ | Brian (train11) | 0.059739± | Comp (train12) | 0.037860± |
| · | 0.010404 | | 0.000990 | | 0.006696 |
| Grant (train13) | $0.060038 \pm$ | Jay (train14) | $0.055303 \pm$ | Sara (train15) | $0.081812\pm$ |
| | 0.004585 | | 0.006606 | | 0.003579 |

The table shows the mean and standard deviation of the score of 3 test samples from part 1 computed against their respective train matrix. For example, jay4, jay5, jay6 has a mean score of 0.055303 and standard deviation 0.006606 to the big Jay train matrix, as shown in table.

Thus, alternatively, we can view **a score** as the **distance** from the center of a cluster (ex: Jay) to a point of voice sound. This distance has the mean and standard deviation of the score. This distance (with standard deviation) can be viewed as a radius of a sphere representing the cluster if we choose to visualize in 3D but it can be at higher dimensions.

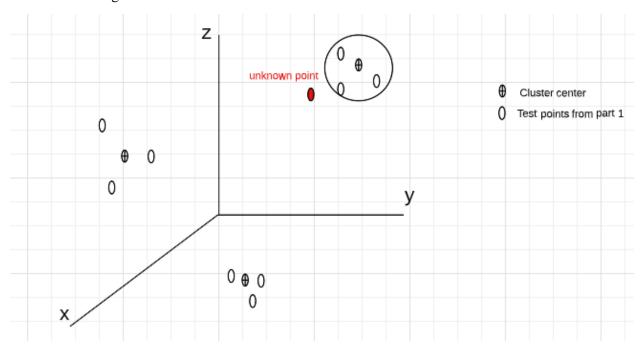


Figure 1. Simple illustration of distance-from-cluster-center idea.

- 1. So we can reuse the **score** function, determine the minimum score and assign it to a train set. This score will be the distance of the point to the center of the train set.
- 2. Run the section in from **main.m** with classifyUnknown to get the scores for unknown sounds in speakerDataSet7.

3. Then, we check if it is within the radius of the sphere i.e. belongs to the cluster, using the mean and standard deviation of the distance from each cluster's center (from the table above).

We try out with WillR's, which the algorithm from part 1 classifies them to belong to Jay cluster.

```
Test WillR1 belongs to to train14 with score 0.069054
Test WillR2 belongs to to train14 with score 0.062083
Test WillR3 belongs to to train14 with score 0.059400
Test WillR4 belongs to to train14 with score 0.062403
Test WillR5 belongs to to train14 with score 0.061385
Test WillR6 belongs to to train14 with score 0.057387
```

Figure 2. We have 50% of these scores are inside Jay's cluster (train14) with radius $0.055303 \pm 0.006606 = [0.048697 \quad 0.061909]$. Accuracy 50%

Results for other subjects and accuracy of classifying whether it belongs to the cluster is shown below:

```
Test DavidL1 belongs to to train14 with score 0.081652
Test DavidL2 belongs to to train14 with score 0.067163
Test DavidL3 belongs to to train14 with score 0.067524
Test DavidL4 belongs to to train14 with score 0.071634
Test DavidL5 belongs to to train14 with score 0.067569
Test DavidL6 belongs to to train14 with score 0.069029
```

Figure 3. We have NONE of these scores are inside $0.055303 \pm 0.006606 = [0.048697 \quad 0.061909]$. So all are outside of Jay's cluster (train14). Accuracy 100%

```
Test BrandiC1 belongs to to train8 with score 0.105219
Test BrandiC2 belongs to to train8 with score 0.098107
Test BrandiC3 belongs to to train8 with score 0.106954
Test BrandiC4 belongs to to train8 with score 0.094350
Test BrandiC5 belongs to to train8 with score 0.089878
Test BrandiC6 belongs to to train8 with score 0.085990
```

Figure 4. BrandiC got classified as belonging to Eliza (train8), radius $0.074394 \pm 0.010110 = [0.064248 \ 0.084504]$. So NONE of BrandiC sounds are inside the sphere. Accuracy 100%.

```
Test ErinL1 belongs to to train8 with score 0.092700 Test ErinL2 belongs to to train8 with score 0.092875 Test ErinL3 belongs to to train8 with score 0.090152 Test ErinL4 belongs to to train8 with score 0.079122 Test ErinL5 belongs to to train8 with score 0.087649 Test ErinL6 belongs to to train8 with score 0.082004
```

Figure 5. ErinL classified as belonging to Eliza (train8), radius $0.074394 \pm 0.010110 = [0.064248 \ 0.084504]$. So 2 of ErinL sounds are inside the sphere. Accuracy 66.6%.

```
Test DavidR1 belongs to to train14 with score 0.087115
Test DavidR2 belongs to to train13 with score 0.087557
Test DavidR3 belongs to to train13 with score 0.086772
Test DavidR4 belongs to to train13 with score 0.084373
Test DavidR5 belongs to to train13 with score 0.081351
Test DavidR6 belongs to to train14 with score 0.082727
```

Figure 6. DavidR classified as belonging to Grant (train13) radius 0.060038 ± 0.004585 , with max radius 0.064623 and Jay (train14) radius 0.055303 ± 0.006606 with max radius 0.061909. So NONE of DavidR sounds are inside any of these 2 spheres. Accuracy 100%.