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1. How to run the code, how to use the system, functionalities of each program file

Double click the jar file to run the program. Don't take the jar file out of the Assignment4 folder. Running the Jar file will create a data file that the system will use when run. The program makes use of the GUI used for the previous assignment and has 40 sound files and four different data mining techniques available for the user to click on. The user can view the music files on the first page and audio files on the second page. The user can also click on the music or audio file and listen to its sound. We use four methods of analyzing the audio files data. The four methods (classifiers) are J48, ZeroR, Naive Bayes, and SMO (Sequential Minimal Optimization). J48 uses a decision tree and ZeroR uses a 0-R classifier and predicts the mode and mean. The Naive Bayes creates precision values that is based on training data. SMO uses the sequential minimal optimization algorithm with support vectors.

2. List and briefly introduce libraries/tools/techniques you used in your development

The tool we used for this assignment is called WEKA. We extract the features and data of the audio files and write this data to the .arff file. Once the data is written to the .arff file then the WEKA data mining program can begin its functionality. We also use the java API musicg to categorize the data within the audio files.

3. List features and their values for the audio files and show what files are used as training data, what are testing.

From the audio files we are getting features like byte rate, channels, frames per second, maximum amplitude, minimum amplitude, and other features that are included in the output below. We put all this data in one file and then use WEKA'S training methods.

4. Show comparison between model output and ground truth label (as discussed in 2.4) and display the precision and recall value of your model on the testing data.

J48:
J48 pruned tree
Chunk Size <= 128034: MUSIC (8.0)

```
Chunk Size > 128034

| Chunk Size <= 128036

| Maximum Amplitude <= 2749: SPEECH (6.0)

| Maximum Amplitude > 2749

| Mean <= 0.000064: SPEECH (13.0/5.0)

| Mean > 0.000064: MUSIC (3.0)

| Chunk Size > 128036
```

| | Mean <= -0.0003: SPEECH (5.0) | | Mean > -0.0003: MUSIC (5.0/1.0)

Number of Leaves: 6

Size of the tree: 11

Time taken to build model: 0.01 seconds

Time taken to test model on training data: 0 seconds

=== Error on training data ===

Correctly Classified Instances 34 85 % Incorrectly Classified Instances 6 15 %

Kappa statistic 0.7

Mean absolute error0.1938Root mean squared error0.3113Relative absolute error38.7692 %Root relative squared error62.2649 %

Total Number of Instances 40

### === Detailed Accuracy By Class ===

TP Rate FP Rate Precision Recall F-Measure ROC Area Class 0.75 0.05 0.938 0.75 0.833 0.933 MUSIC 0.95 0.25 0.792 0.95 0.864 0.933 SPEECH Weighted Avg. 0.85 0.15 0.865 0.85 0.848 0.932

### === Confusion Matrix ===

a b <-- classified as</li>15 5 | a = MUSIC1 19 | b = SPEECH

### === Stratified cross-validation ===

Correctly Classified Instances 25 62.5 % Incorrectly Classified Instances 15 37.5 %

Kappa statistic 0.25

Mean absolute error0.4047Root mean squared error0.5503Relative absolute error80.9405 %Root relative squared error110.0605 %

Total Number of Instances 40

### === Detailed Accuracy By Class ===

TP Rate FP Rate Precision Recall F-Measure ROC Area Class 0.55 0.3 0.647 0.55 0.595 0.631 MUSIC 0.7 0.45 0.609 0.7 0.651 0.631 SPEECH Weighted Avg. 0.625 0.375 0.628 0.625 0.623 0.631

=== Confusion Matrix ===

a b <-- classified as</li>11 9 | a = MUSIC6 14 | b = SPEECH

### SMO:

Options: -C 1.0 -L 0.001 -P 1.0E-12 -N 0 -V -1 -W 1

SMO

Kernel used:

Linear Kernel:  $K(x,y) = \langle x,y \rangle$ 

Classifier for classes: MUSIC, SPEECH

BinarySMO

Machine linear: showing attribute weights, not support vectors.

- 1.0441 \* (normalized) Chunk Size
- + -1.2636 \* (normalized) Maximum Amplitude
- + -0.2505 \* (normalized) Minimum Amplitutde
- + 0.2132 \* (normalized) Mean
- + 0.3153 \* (normalized) Zero Crossing Rate
- + 0.4379 \* (normalized) Standard Deviation
- + -1.3181 \* (normalized) Spectral Centroid
- + 0.826

Number of kernel evaluations: 306 (69.308% cached)

Time taken to build model: 0.04 seconds

Time taken to test model on training data: 0 seconds

## === Error on training data ===

Correctly Classified Instances 28 70 % Incorrectly Classified Instances 12 30 %

Kappa statistic 0.4

Mean absolute error 0.3

Root mean squared error 0.5477
Relative absolute error 60 %
Root relative squared error 109.5445 %

Total Number of Instances 40

#### === Confusion Matrix ===

a b <-- classified as</li>14 6 | a = MUSIC6 14 | b = SPEECH

### === Stratified cross-validation ===

Correctly Classified Instances 24 60 % Incorrectly Classified Instances 16 40 %

Kappa statistic 0.2 Mean absolute error 0.4 Root mean squared error 0.6325
Relative absolute error 80 %
Root relative squared error 126.4911 %
Total Number of Instances 40

=== Confusion Matrix ===

a b <-- classified as 14 6 | a = MUSIC 10 10 | b = SPEECH

### Zero R:

ZeroR predicts class value: MUSIC

Time taken to build model: 0 seconds

Time taken to test model on training data: 0 seconds

=== Error on training data ===

Correctly Classified Instances 20 50 % % Incorrectly Classified Instances 20 50 0 Kappa statistic Mean absolute error 0.5 Root mean squared error 0.5 % Relative absolute error 100 Root relative squared error 100 % Total Number of Instances 40

=== Confusion Matrix ===

a b <-- classified as</li>20 0 | a = MUSIC20 0 | b = SPEECH

=== Stratified cross-validation ===

Correctly Classified Instances 20 50 % Incorrectly Classified Instances 20 50 %

Kappa statistic	0	
Mean absolute error	0.5	
Root mean squared error	0.5	5
Relative absolute error	100	%
Root relative squared error	100	%
Total Number of Instances	40	

## === Confusion Matrix ===

a b <-- classified as</li>20 0 | a = MUSIC20 0 | b = SPEECH

# **Naive Bayes:**

Naive Bayes Classifier

Class
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Attribute MUSIC SPEECH

(0.5) (0.5)

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# Audio Format

mean	1	1
std. dev.	0.0017	0.0017
weight sum	20	20
precision	0.01	0.01

# Sample Rate

•		
mean	16000	16000
std. dev.	0.0017	0.0017
weight sum	20	20
precision	0.01	0.01

# Bits Per Sample

mean	16	16
std. dev.	0.0017	0.0017
weight sum	20	20
precision	0.01	0.01

# Block Align

mean	2	2
std. dev.	0.0017	0.0017

weight sum precision	20 0.01	20 0.01
Byte Rate mean std. dev. weight sum precision	32000 0.0017 20 0.01	32000 0.0017 20 0.01
Channels mean std. dev. weight sum precision	1 0.0017 20 0.01	1 0.0017 20 0.01
Chunk Size mean std. dev. weight sum precision	128076 52 5 20 65	128089 59.5735 20 65
FFT Sample Size mean std. dev. weight sum precision	1024 0.0017 20 0.01	1024 0.0017 20 0.01
Frames Per Second mean std. dev. weight sum precision	15 0.0017 20 0.01	15 0.0017 20 0.01
Number of Frames mean std. dev. weight sum precision	62 0.0017 20 0.01	62 0.0017 20 0.01
Number of Frequency I mean std. dev. weight sum	Jnits 512 0.0017 20	512 0.0017 20

precision	0.01 0.01
Unit Frequency mean std. dev. weight sum	15.62 15.62 0.0017 0.0017 20 20
precision	0.01 0.01
Time Step	0.4
mean	0.1 0.1
std. dev.	0.0017 0.0017 20 20
weight sum precision	0.01 0.01
precision	0.01 0.01
Maximum Amplitude	
mean	36255.6154 23181.1346
std. dev.	17116.4732 19820.3669
weight sum	20 20
precision	1604.2308 1604.2308
Minimum Amplitutde	
mean	25402.2282 18070.3897
std. dev.	19319.4585 16236.3217
weight sum	20 20
precision	1481.1795 1481.1795
Mean	
mean	0 0.0013
std. dev.	0.0004 0.0032
weight sum	20 20
precision	0.0003 0.0003
Zero Crossing Rate	
mean	7841.2115 8127.8795
std. dev.	3470.4242 2799.2282
weight sum	20 20
precision	337.2564 337.2564
Standard Deviation	
mean	0.0909 0.1389
std. dev.	0.061 0.1339
weight sum	20 20
precision	0.0103 0.0103

## Spectral Centroid

 mean
 33210.5895
 30841.2252

 std. dev.
 2305.6538
 3222.4419

 weight sum
 20
 20

 precision
 394.894
 394.894

Time taken to build model: 0.01 seconds

Time taken to test model on training data: 0.01 seconds

## === Error on training data ===

Correctly Classified Instances 25 62.5 % Incorrectly Classified Instances 15 37.5 %

Kappa statistic 0.25

Mean absolute error0.3649Root mean squared error0.5464Relative absolute error72.9809 %Root relative squared error109.285 %

Total Number of Instances 40

### === Detailed Accuracy By Class ===

TP Rate FP Rate Precision Recall F-Measure ROC Area Class 0.9 0.65 0.581 0.9 0.706 0.783 MUSIC 0.35 0.1 0.778 0.35 0.483 0.783 SPEECH Weighted Avg. 0.625 0.375 0.679 0.625 0.594 0.783

### === Confusion Matrix ===

a b <-- classified as</li>18 2 | a = MUSIC13 7 | b = SPEECH

### === Stratified cross-validation ===

Correctly Classified Instances 20 50 %

Incorrectly Classified Instances 20 50 %

Kappa statistic 0

Mean absolute error 0.4693

Root mean squared error 0.6256

Relative absolute error 93.8554 %

Root relative squared error 125.127 %

Total Number of Instances 40

# === Detailed Accuracy By Class ===

TP Rate FP Rate Precision Recall F-Measure ROC Area Class 0.7 0.7 0.5 0.7 0.583 0.555 MUSIC 0.3 0.3 0.5 0.555 SPEECH 0.3 0.375 Weighted Avg. 0.5 0.5 0.479 0.5 0.5 0.555

## === Confusion Matrix ===

a b <-- classified as</li>14 6 | a = MUSIC14 6 | b = SPEECH