

UNIVERSITY OF WASHINGTON
AMATH 482 A Wi 20: COMPUTATIONAL METHODS FOR
DATA ANALYSIS

Homework 4

Abstract

The goal of this project is to analyze and sort different audio signals with machine learning.

We take music from different genres and analyze their frequencies. We take different properties of the frequency function and try to find similarities for the same genres. Now we can take those similarities and use them as data for training our program to look for these properties in new test data to classify their genres.

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1 Introduction and Overview

To deconstruct a signal we can use a Fourier transform and look at the frequencies produced by such. These frequencies can be compared and used to make differences between different genres of music. The properties obtained from the frequencies can be used to find clusters in a multidimensional function. To analyze and classify sections we can use Principal component analysis (PCA) and Linear Discriminant Analysis (LDA).

2 Theoretical Background

2.1 Fourier Transform

The general idea behind the Fourier Transform is to obtain a spectrum of a given function. The most common use is to analyze a signal over time and transform it into the frequency space to find all frequencies which build that signal.

2.1.1 Continuous Fourier Transform

Definition of a Fourier Transform for a given function

$$\hat{f}(k) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} f(x) e^{-ikx} dx$$

and can be inverted back with

$$f(x) = \frac{1}{\sqrt{2\pi}} \int_{-\infty}^{\infty} \hat{f}(k) e^{ikx} dk .$$

Instead of transforming the given function it can be decomposed in *sin* and *cos* terms with **Fourier coefficients (Fourier series)**

$$f(x) = \frac{a_0}{2} \sum_{k=1}^{\infty} [a_k \cos(kx) + b_k \sin(kx)]$$

with

$$a_k = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \cos(kx) dx \quad k \geq 0$$
$$b_k = \frac{1}{\pi} \int_{-\pi}^{\pi} f(x) \sin(kx) dx \quad k > 0 .$$

2.1.2 Discrete Fourier Transform

To calculate our function we have to discretize our space:

$$x \in \mathbb{R} \rightarrow x \in \{x_0, x_1, x_2, \dots, x_{N-1}\}$$

this gives us new terms for the Fourier transform

$$\hat{x}_k = \sum_{n=0}^{N-1} x_n e^{-\frac{2\pi i k n}{N}}$$
$$x_k = \sum_{n=0}^{N-1} \hat{x}_k e^{\frac{2\pi i k n}{N}}$$

2.2 Principal component analysis (PCA)

The PCA helps us to structure, simplify and illustrate extensive data sets by approximating a large number of statistical variables by using a smaller number of meaningful linear combinations (the “main components”). The underlying data set typically has the structure of a matrix: p characteristics were measured on n subjects or objects. Such a data set can be illustrated as a set of n points in p -dimensional space \mathbb{R}^p . The PCA aims to project these data points into a q -dimensional subspace \mathbb{R}^q ($q < p$) in such a way that as little information as possible is lost and existing redundancy is summarized in the form of correlation in the data points.

A main axis transformation is carried out mathematically: The correlation of multidimensional features is minimized by transferring them to a vector space with a new basis. The main axis transformation can be specified by an orthogonal matrix, which is formed from the eigenvectors of the covariance matrix. The rotation of the coordinate system is carried out in such a way that the covariance matrix is diagonalized.

2.3 Linear Discriminant Analysis (LDA)

LDA is a method that assigns a score to each observation in the discriminant analysis. The group membership of each observation and the boundaries between the groups are determined from the score. If the observations are known to belong to a group, the feature variables are combined into a single discriminant variable with minimal loss of information.

Given N d -dimensional feature vectors x , of which n_1 belong to class C_1 and n_2 belong to class C_2 . A discriminant function now describes the equation of a hyperplane that optimally separates the classes. Depending on the separability of the classes, there are linear and non-linear.

2.4 Classification

The mentioned methods were used to analyze the given train data and chose barriers for the given music genres (Hip Hop, Jazz and Electro) in a 3D space. With these given barriers a set of test data was used to find out if the genres are classified correctly.

3 Algorithm Implementation and Development

At first the songs are loaded into the file. Multiple samples from different songs are used as training data set. These audio signals are separated into different properties to calculate their Fourier transform. The Frequencies are analyzed and the best options for properties are picked to distinguish different music genres. In this case we take a look at the average height of the intensity of the frequencies, the average absolute frequency value of the function and the number of frequency values which hit the $\frac{1}{1000}$ mark of the maximum intensity. These properties are used as the three dimensional variables in the 3D space. These 'clusters' of data points are portrayed together with the lines along the greatest variance, calculated with PCA methods. With these information 'barriers' are chosen to build sections in the 3D space to separate the different genres. With a new set of data with known genre these sections are tested for their accuracy.

4 Computational Results

The trained data already showed qualitatively good clusters. These data points are portrayed in Figure 1.

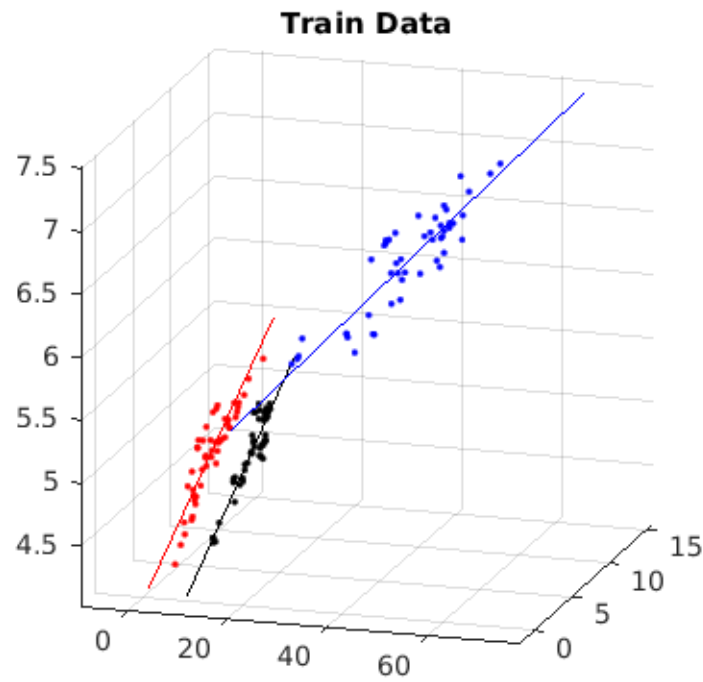


Figure 1: This shows the data sets of the training data (blue for Hip Hop, red for Jazz and black for Electro). The points are the data points for the different properties. The lines represent the direction of the highest variance.

The test data showed good results for two music genres:

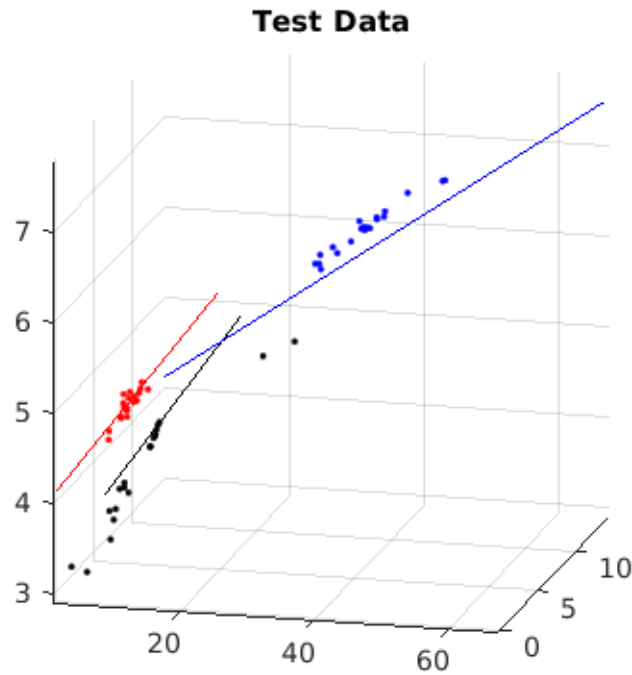


Figure 2: This shows the data sets of the tested data (blue for Hip Hop, red for Jazz and black for Electro). The points are the data points for the different properties. The lines represent the direction of the highest variance of the training data. Hip Hop and Jazz show good results since the data points are close to the trained lines. Electro has a high spread of points, which we didn't had before. This indicates some errors the code might make.

5 Summary and Conclusions

The accuracy for Hip Hop and Jazz were 100% for Electro it was 60%

6 Appendix A: MATLAB functions used and brief implementation explanation

6.1 Cell Array

Cell Array is a data type which can be indexed with k , where k lets us access any kind of data (a number, another array or a matrix e.g.) and use it in a loop.

6.2 Scatter3

Scatter3 lets us display dots in a 3D space with given x, y and z

6.3 Function: point_to_line_distance

This function was used to calculate the barriers. The used 'distance' was a mixture of distance (given by this function) between data point and the line along the direction of the highest variance of the training data and the distance between the mean of the training data and data point.

7 Appendix B: MATLAB codes

clear all, clc, close all

`samplesper_song = 10;`

`numberof_songs = 5;`

`numberof_samples = samplesper_song * numberof_songs;`

`sample = cell(samplesper_song, 1);`

`for k = 1:samplesper_song`

`samplek = [1500000+((k-1)*225000) 1500000+(k*225000)];`

`end`

`yotis = cell(numberof_samples); Fsotis = cell(numberof_samples);`

`for k = 1:samplesper_song`

`[yotisk, Fsotisk] = audioread("BehindClosedDoors(otis).mp3", samplek);`

`[yotisk + 1 * samplesper_song, Fsotisk + 1 * samplesper_song] = audioread("LaLaLa(otis).mp3", samplek);`

`[yotisk + 2 * samplesper_song, Fsotisk + 2 * samplesper_song] = audioread("MightyFine(otis).mp3", samplek);`

`[yotisk + 3 * samplesper_song, Fsotisk + 3 * samplesper_song] = audioread("OtisMcMusic(otis).mp3", samplek);`

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[y_otisk + 4 * samples_per_song, Fs_otisk + 4 * samples_per_song] = audioread("Sneaking_on_september(otisk)");
end
signal_otis = cell(number_of_samples, 1);
for k = 1:number_of_samples
    signal_otisk = y_otisk(:, 1)';
end
data_points_otis = cell(number_of_samples, 1); time_otis = cell(number_of_samples, 1);
for k = 1:number_of_samples
    data_points_otisk = length(signal_otisk); time_otisk = data_points_otisk / Fs_otisk;
end
data_vector_otis = cell(number_of_samples, 1); time_vector_otis = cell(number_of_samples, 1);
for k = 1:number_of_samples
    data_vector_otisk = 1 : data_points_otisk; time_vector_otisk = data_vector_otisk / Fs_otisk;
end
figure(1)
for k = 1:number_of_samples
    subplot(number_of_samples, 1, k) plot(time_vector_otisk, signal_otisk); axis off
end
fft_otis = cell(number_of_samples, 1); frequencies_space_otis = cell(number_of_samples, 1); frequencies_space_otis = cell(number_of_samples, 1);
for k = 1:number_of_samples
    fft_otisk = fft(signal_otisk);
    frequencies_space_otisk = (2 * pi / time_otisk * [0 : (data_points_otisk / 2) - data_points_otisk / 2 : -1]);
    frequencies_space_shifted_otisk = fftshift(frequencies_space_otisk);
end
fourier_otis = cell(number_of_samples, 1);
spread_factor = 1000;
spread_variable = 5;
for k = 1:number_of_samples
    fourier_otisk(1, :) = frequencies_space_shifted_otisk; fourier_otisk(2, :) = fftshift(abs(fft_otisk));
end
length_fourier_otis = cell(number_of_samples, 1);
sum_fourier_otis = cell(number_of_samples, 1);
max_fourier_otis = cell(number_of_samples, 1);
mean_fourier_otis = cell(number_of_samples, 1);
spread_fourier_otis = cell(number_of_samples, 1);
for j = 1 : number_of_samples
    length_fourier_otisj = length(fourier_otisj);
    max_fourier_otisj = max(abs(fourier_otisj(1, j)));
    sum_fourier_otisj = 0;
    mean_fourier_otisj = 0;
end

```



```

spreadfourierotisj = 0;
for k = 1 : lengthfourierotisj
sumfourierotisj = sumfourierotisj + fourierotisj(2,k);
meanfourierotisj = meanfourierotisj + abs(fourierotisj(1,k)) * fourierotisj(2,k) / maxfourierotisj;
if fourierotisj(2,k) > (maxfourierotisj / spreadfactor)
spreadfourierotisj = spreadfourierotisj + 1;
end
end
sumfourierotisj = sumfourierotisj / lengthfourierotisj;
meanfourierotisj = meanfourierotisj / lengthfourierotisj;
spreadfourierotisj = (spreadfourierotisj)(1/spreadvariable);
end
yjammy = cell(numberofsamples); Fsjammy = cell(numberofsamples);
for k = 1:samplespersong
[yjammyk, Fsjammyk] = audioread("HappyBirthday(jammy).mp3", samplek);
[yjammyk + 1 * samplespersong, Fsjammyk + 1 * samplespersong] = audioread("MapleLeafRag(jammy)");
[yjammyk + 2 * samplespersong, Fsjammyk + 2 * samplespersong] = audioread("MinorBluesforBoo");
[yjammyk + 3 * samplespersong, Fsjammyk + 3 * samplespersong] = audioread("PresentDay(jammy)");
[yjammyk + 4 * samplespersong, Fsjammyk + 4 * samplespersong] = audioread("WhenJohnnyGoesMarch");
end
signaljammy = cell(numberofsamples, 1);
for k = 1:numberofsamples
signaljammyk = yjammyk(:, 1)';
end
datapointsjammy = cell(numberofsamples, 1); timejammy = cell(numberofsamples, 1);
for k = 1:numberofsamples
datapointsjammyk = length(signaljammyk); timejammyk = datapointsjammyk / Fsjammyk;
end
datavectorjammy = cell(numberofsamples, 1); timevectorjammy = cell(numberofsamples, 1);
for k = 1:numberofsamples
datavectorjammyk = 1 : datapointsjammyk; timevectorjammyk = datavectorjammyk / Fsjammyk;
end
figure(2)
for k = 1:numberofsamples
subplot(numberofsamples, 1, k) plot(timevectorjammyk, signaljammyk); axis off
end
fftjammy = cell(numberofsamples, 1); frequenciespacejammy = cell(numberofsamples, 1); frequen
cell(numberofsamples, 1);
for k = 1:numberofsamples
fftjammyk = fft(signaljammyk);

```

```

    frequenciesspacejammyk = (2 * pi / timejammyk * [0 : (datapointsjammyk / 2) -
datapointsjammyk / 2 : -1]); frequenciesspaceshiftedjammyk = fftshift(frequenciesspacejammyk);
    end
    fourierjammy = cell(numberofsamples, 1);
    for k = 1:numberofsamples
        fourierjammyk(1,:) = frequenciesspaceshiftedjammyk; fourierjammyk(2,:) = fftshift(abs(fftjammyk));
    end
    lengthfourierjammy = cell(numberofsamples, 1);
    sumfourierjammy = cell(numberofsamples, 1);
    maxfourierjammy = cell(numberofsamples, 1);
    meanfourierjammy = cell(numberofsamples, 1);
    spreadfourierjammy = cell(numberofsamples, 1);
    for j = 1 : numberofsamples
        lengthfourierjammyj = length(fourierjammyj);
        maxfourierjammyj = max(abs(fourierjammyj(1,j)));
        sumfourierjammyj = 0;
        meanfourierjammyj = 0;
        spreadfourierjammyj = 0;
        for k = 1 : lengthfourierjammyj
            sumfourierjammyj = sumfourierjammyj + fourierjammyj(2,k);
            meanfourierjammyj = meanfourierjammyj + abs(fourierjammyj(1,k)) * fourierjammyj(2,k) / maxfourierjammyj;
            if fourierjammyj(2,k) > (maxfourierjammyj / spreadfactor)
                spreadfourierjammyj = spreadfourierjammyj + 1;
            end
        end
        sumfourierjammyj = sumfourierjammyj / lengthfourierjammyj;
        meanfourierjammyj = meanfourierjammyj / lengthfourierjammyj;
        spreadfourierjammyj = (spreadfourierjammyj)^(1/spreadvariable);
    end
    ymax = cell(numberofsamples); Fsmax = cell(numberofssamples);
    for k = 1:samplespersong
        [ymaxk, Fsmaxk] = audioread("All_I_Can_Do_It_This(max).mp3", samplek);
        [ymaxk + 1 * samplespersong, Fsmaxk + 1 * samplespersong] = audioread("Come_With_Some_Funk(max).mp3");
        [ymaxk + 2 * samplespersong, Fsmaxk + 2 * samplespersong] = audioread("Mom's_House(max).mp3");
        [ymaxk + 3 * samplespersong, Fsmaxk + 3 * samplespersong] = audioread("Sense_of_Humor(max).mp3");
        [ymaxk + 4 * samplespersong, Fsmaxk + 4 * samplespersong] = audioread("Waterfront_Property(max).mp3");
    end
    signalmax = cell(numberofsamples, 1);
    for k = 1:numberofsamples
        signalmaxk = ymaxk(:, 1)';
    end
end

```

```

data_points_max = cell(number_of_samples,1); time_max = cell(number_of_samples,1);
for k = 1:number_of_samples
    data_points_maxk = length(signal_maxk); time_maxk = data_points_maxk/Fs_maxk;
end
data_vector_max = cell(number_of_samples,1); time_vector_max = cell(number_of_samples,1);
for k = 1:number_of_samples
    data_vector_maxk = 1 : data_points_maxk; time_vector_maxk = data_vector_maxk/Fs_maxk;
end
figure(3)
for k = 1:number_of_samples
    subplot(number_of_samples,1,k) plot(time_vector_maxk, signal_maxk); axis off
end
fft_max = cell(number_of_samples,1); frequencies_space_max = cell(number_of_samples,1); frequencies_p
cell(number_of_samples,1);
for k = 1:number_of_samples
    fft_maxk = fft(signal_maxk);
    frequencies_space_maxk = (2 * pi / time_maxk * [0 : (data_points_maxk/2) - data_points_maxk/2 :
-1]); frequencies_space_shifted_maxk = fftshift(frequencies_space_maxk);
end
fourier_max = cell(number_of_samples,1);
for k = 1:number_of_samples
    fourier_maxk(1,:) = frequencies_space_shifted_maxk; fourier_maxk(2,:) = fftshift(abs(fft_maxk));
end
length_fourier_max = cell(number_of_samples,1);
sum_fourier_max = cell(number_of_samples,1);
max_fourier_max = cell(number_of_samples,1);
mean_fourier_max = cell(number_of_samples,1);
spread_fourier_max = cell(number_of_samples,1);
for j = 1 : number_of_samples
    length_fourier_maxj = length(fourier_maxj);
    max_fourier_maxj = max(abs(fourier_maxj(1,j)));
    sum_fourier_maxj = 0;
    mean_fourier_maxj = 0;
    spread_fourier_maxj = 0;
    for k = 1 : length_fourier_maxj
        sum_fourier_maxj = sum_fourier_maxj + fourier_maxj(2,k);
        mean_fourier_maxj = mean_fourier_maxj + abs(fourier_maxj(1,k)) * fourier_maxj(2,k) / max_fourier_maxj;
        if fourier_maxj(2,k) > (max_fourier_maxj/spread_factor)
            spread_fourier_maxj = spread_fourier_maxj + 1;
        end
    end
end
end

```

```

sum_fourier_maxj = sum_fourier_maxj/length_fourier_maxj;
mean_fourier_maxj = mean_fourier_maxj/length_fourier_maxj;
spread_fourier_maxj = (spread_fourier_maxj)^(1/spread_variable);
end
figure(4)
sum_fourier_otis_plot = zeros(1,number_of_samples);
mean_fourier_otis_plot = zeros(1,number_of_samples);
spread_fourier_otis_plot = zeros(1,number_of_samples);
for k = 1:number_of_samples
sum_fourier_otis_plot(k) = sum_fourier_otisk;
mean_fourier_otis_plot(k) = mean_fourier_otisk;
spread_fourier_otis_plot(k) = spread_fourier_otisk;
end
scatter3(sum_fourier_otis_plot, mean_fourier_otis_plot, spread_fourier_otis_plot, 'blue') hold on axis vis3d
sum_fourier_jammy_plot = zeros(1,number_of_samples);
mean_fourier_jammy_plot = zeros(1,number_of_samples);
spread_fourier_jammy_plot = zeros(1,number_of_samples);
for k = 1:number_of_samples
sum_fourier_jammy_plot(k) = sum_fourier_jammyk;
mean_fourier_jammy_plot(k) = mean_fourier_jammyk;
spread_fourier_jammy_plot(k) = spread_fourier_jammyk;
end
scatter3(sum_fourier_jammy_plot, mean_fourier_jammy_plot, spread_fourier_jammy_plot, 'red')
sum_fourier_max_plot = zeros(1,number_of_samples);
mean_fourier_max_plot = zeros(1,number_of_samples);
spread_fourier_max_plot = zeros(1,number_of_samples);
for k = 1:number_of_samples
sum_fourier_max_plot(k) = sum_fourier_maxk;
mean_fourier_max_plot(k) = mean_fourier_maxk;
spread_fourier_max_plot(k) = spread_fourier_maxk;
end
scatter3(sum_fourier_max_plot, mean_fourier_max_plot, spread_fourier_max_plot, 'black')
mean_otis(1,1) = mean(sum_fourier_otis_plot);
mean_otis(1,2) = mean(mean_fourier_otis_plot);
mean_otis(1,3) = mean(spread_fourier_otis_plot);
scatter3(mean_otis(1,1), mean_otis(1,2), mean_otis(1,3), 'yellow')
mean_jammy(1,1) = mean(sum_fourier_jammy_plot);
mean_jammy(1,2) = mean(mean_fourier_jammy_plot);
mean_jammy(1,3) = mean(spread_fourier_jammy_plot);
scatter3(mean_jammy(1,1), mean_jammy(1,2), mean_jammy(1,3), 'yellow')
mean_max(1,1) = mean(sum_fourier_max_plot);

```

```

meanmax(1,2) = mean(meanfouriermaxplot);
meanmax(1,3) = mean(spreadfouriermaxplot);
scatter3(meanmax(1,1),meanmax(1,2),meanmax(1,3),'yellow')
figure(5)
zeromeanotis(1,:) = sumfourierotisplot - meanotis(1,1);
zeromeanotis(2,:) = meanfourierotisplot - meanotis(1,2);
zeromeanotis(3,:) = spreadfourierotisplot - meanotis(1,3);
scatter3(zeromeanotis(1,:),zeromeanotis(2,:),zeromeanotis(3:),'blue')axisvis3d
covariancesumotis = cov(zeromeanotis(1,:));
covariancemeanotis = cov(zeromeanotis(2,:));
covariancespreadotis = cov(zeromeanotis(3,:));
figure(6)
zeromeanjammy(1,:) = sumfourierjammyplot - meanjammy(1,1);
zeromeanjammy(2,:) = meanfourierjammyplot - meanjammy(1,2);
zeromeanjammy(3,:) = spreadfourierjammyplot - meanjammy(1,3);
scatter3(zeromeanjammy(1,:),zeromeanjammy(2,:),zeromeanjammy(3:),'red')axisvis3d
covariancesumjammy = cov(zeromeanjammy(1,:));
covariancemeanjammy = cov(zeromeanjammy(2,:));
covariancespreadjammy = cov(zeromeanjammy(3,:));
figure(7)
zeromeanmax(1,:) = sumfouriermaxplot - meanmax(1,1);
zeromeanmax(2,:) = meanfouriermaxplot - meanmax(1,2);
zeromeanmax(3,:) = spreadfouriermaxplot - meanmax(1,3);
scatter3(zeromeanmax(1,:),zeromeanmax(2,:),zeromeanmax(3:),'black')axisvis3d
covariancesummax = cov(zeromeanmax(1,:));
covariancemeanmax = cov(zeromeanmax(2,:));
covariancespreadmax = cov(zeromeanmax(3,:));
figure(8)
[Uotis,Sotis,Votis] = svd(zeromeanotis);
[motis,notis] = size(zeromeanotis);
S2otis = Sotis(1:motis,1:motis);Valuesotis = S2otis2/notis;
Vectorsotis = Uotis;
Amplitudesotis = Sotis * conj(Votis');
scatterotis = [zeromeanotis(1,:) + meanotis(1,1);zeromeanotis(2,:) + meanotis(1,2);zeromeanotis(3,
) + meanotis(1,3)];
scatter3(scatterotis(1,:),scatterotis(2,:),scatterotis(3:),'b.');
```

holdonaxisvis3dtitle('TrainData');

```

line1otis = [(Valuesotis(1,1) * [0; Vectorsotis(1,1)] + meanotis(1,1))'; (Valuesotis(1,1) *
[0; Vectorsotis(2,1)] + meanotis(1,2))'; (Valuesotis(1,1) * [0; Vectorsotis(3,1)] + meanotis(1,3))'];
r1otis = [line1otis(1,2) - line1otis(1,1),line1otis(2,2) - line1otis(2,1),line1otis(3,2) -
line1otis(3,1)];
rotis = abs(r1otis);
```

```

potis(:,1) = meanotis' - 0.5 * rotis';
potis(:,2) = meanotis' + 0.5 * rotis';
plot3(potis(1,:), potis(2,:), potis(3,:),'b')
[Ujammy, Sjammy, Vjammy] = svd(zeromeanjammy);
[mjammy, njammy] = size(zeromeanjammy);
S2jammy = Sjammy(1 : mjammy, 1 : mjammy); Valuesjammy = S2jammy2 / njammy;
Vectorsjammy = Ujammy;
Amplitudesjammy = Sjammy * conj(Vjammy');
scatterjammy = [zeromeanjammy(1,:) + meanjammy(1,1); zeromeanjammy(2,:) +
meanjammy(1,2); zeromeanjammy(3,:) + meanjammy(1,3)];
scatter3(scatterjammy(1,:), scatterjammy(2,:), scatterjammy(3,:),'r');
line1jammy = [(Valuesjammy(1,1) * [0; Vectorsjammy(1,1)] + meanjammy(1,1))'; (Valuesjammy(1,1) *
[0; Vectorsjammy(2,1)] + meanjammy(1,2))'; (Valuesjammy(1,1) * [0; Vectorsjammy(3,1)] +
meanjammy(1,3))'];
r1jammy = [line1jammy(1,2) - line1jammy(1,1), line1jammy(2,2) - line1jammy(2,1), line1jammy(3,2) -
line1jammy(3,1)];
rjammy = abs(r1jammy);
pjammy(:,1) = meanjammy' - rjammy';
pjammy(:,2) = meanjammy' + rjammy';
plot3(pjammy(1,:), pjammy(2,:), pjammy(3,:),'r')
[Umax, Smax, Vmax] = svd(zeromeanmax);
[mmax, nmax] = size(zeromeanmax);
S2max = Smax(1 : mmax, 1 : mmax); Valuesmax = S2max2 / nmax;
Vectorsmax = Umax;
Amplitudesmax = Smax * conj(Vmax');
scattermax = [zeromeanmax(1,:) + meanmax(1,1); zeromeanmax(2,:) + meanmax(1,2); zeromeanmax(3,:) +
meanmax(1,3)];
scatter3(scattermax(1,:), scattermax(2,:), scattermax(3,:),'k');
line1max = [(Valuesmax(1,1) * [0; Vectorsmax(1,1)] + meanmax(1,1))'; (Valuesmax(1,1) *
[0; Vectorsmax(2,1)] + meanmax(1,2))'; (Valuesmax(1,1) * [0; Vectorsmax(3,1)] + meanmax(1,3))'];
line2max = [(Valuesmax(1,1) * [0; Vectorsmax(1,2)] + meanmax(1,1))'; (Valuesmax(1,1) *
[0; Vectorsmax(2,2)] + meanmax(1,2))'; (Valuesmax(1,1) * [0; Vectorsmax(3,2)] + meanmax(1,3))'];
r1max = [line1max(1,2) - line1max(1,1), line1max(2,2) - line1max(2,1), line1max(3,2) -
line1max(3,1)];
r2max = [line2max(1,2) - line2max(1,1), line2max(2,2) - line2max(2,1), line2max(3,2) -
line2max(3,1)];
rmax = abs(r1max);
pmax(:,1) = meanmax' - 1.5 * rmax';
pmax(:,2) = meanmax' + rmax';
plot3(pmax(1,:), pmax(2,:), pmax(3,:),'k')
weight1 = 10;

```

```

weight2 = 1;
dotisrright = pointtolineddistance(scatterotis', potis(:,1)', potis(:,2)');
for k = 1: length(dotisrright)
    dotisrright(k,:) = weight1 * dotisrright(k,:) + weight2 * norm(abs(scatterotis(:,k)' -
meanotis));
end
dotiswrong1 = pointtolineddistance(scatterjammy', potis(:,1)', potis(:,2)');
dotiswrong2 = pointtolineddistance(scattermax', potis(:,1)', potis(:,2)');
dotiswrong = zeros(length(dotiswrong1) + length(dotiswrong2), 1);
for k = 1 : length(dotiswrong1)
    dotiswrong(k,1) = weight1 * dotiswrong1(k) + weight2 * norm(abs(scatterjammy(:
,k)' - meanotis));
end
for k = 1 : k
    dotiswrong(k + length(dotiswrong1), 1) = weight1 * dotiswrong2(k) + weight2 *
norm(abs(scattermax(:,k)' - meanotis));
end
sectorotis = max(dotisrright);
nextsectorotis = min(dotiswrong);
djammyright = pointtolineddistance(scatterjammy', pjammy(:,1)', pjammy(:,2)');
for k = 1: length(djammyright)
    djammyright(k,:) = weight1 * djammyright(k,:) + weight2 * norm(abs(scatterjammy(:
,k)' - meanjammy));
end
djammywrong1 = pointtolineddistance(scatterotis', pjammy(:,1)', pjammy(:,2)');
djammywrong2 = pointtolineddistance(scattermax', pjammy(:,1)', pjammy(:,2)');
djammywrong = zeros(length(djammywrong1) + length(djammywrong2), 1);
for k = 1 : length(djammywrong1)
    djammywrong(k,1) = weight1 * djammywrong1(k) + weight2 * norm(abs(scatterotis(:
,k)' - meanjammy));
end
for k = 1 : k
    djammywrong(k + length(djammywrong1), 1) = weight1 * djammywrong2(k) + weight2 *
norm(abs(scattermax(:,k)' - meanjammy));
end
sectorjammy = max(djammyright);
nextsectorjammy = min(djammywrong);
dmaxrright = pointtolineddistance(scattermax', pmax(:,1)', pmax(:,2)');
for k = 1 : length(dmaxrright)
    dmaxrright(k,:) = weight1 * dmaxrright(k,:) + weight2 * norm(abs(scattermax(:,k)' -
meanmax));
end

```

```

end
d_max_wrong1 = point_toline_distance(scatter_otis', p_max(:,1)', p_max(:,2)');
d_max_wrong2 = point_toline_distance(scatter_jammy', p_max(:,1)', p_max(:,2)');
d_max_wrong = zeros(length(d_max_wrong1) + length(d_max_wrong2), 1);
for k = 1 : length(d_max_wrong1)
    d_max_wrong(k,1) = weight1 * d_max_wrong1(k) + weight2 * norm(abs(scatter_otis(:,k)' - mean_max));
end
for k = 1 : k
    d_max_wrong(k + length(d_max_wrong1), 1) = weight1 * d_max_wrong2(k) + weight2 * norm(abs(scatter_jammy(:,k)' - mean_max));
end
sector_max = max(d_max_right);
next_sector_max = min(d_max_wrong);
next_sector = [next_sector_otis, next_sector_jammy, next_sector_max];
border_otis = (sector_otis + next_sector_otis);
border_jammy = (sector_jammy + next_sector_jammy) / 2;
border_max = (sector_max + next_sector_max);
samples_per_song = 10;
number_of_songs = 6;
number_of_samples_per_genre = samples_per_song * 2;
number_of_samples = samples_per_song * number_of_songs;
sample = cell(samples_per_song, 1);
for k = 1:samples_per_song
    samplek = [2000000+((k-1)*225000) 2000000+(k*225000)];
end
y_test = cell(number_of_samples); Fs_test = cell(number_of_samples);
for k = 1:samples_per_song
    [y_testk, Fs_testk] = audioread("Complicated(hiphop).mp3", samplek);
    [y_testk + 1 * samples_per_song, Fs_testk + 1 * samples_per_song] = audioread("HereIfYoureGoing(hiphop).mp3", samplek);
    [y_testk + 2 * samples_per_song, Fs_testk + 2 * samples_per_song] = audioread("PresentDay(jazz).mp3", samplek);
    [y_testk + 3 * samples_per_song, Fs_testk + 3 * samples_per_song] = audioread("TangoBango(jazz).mp3", samplek);
    [y_testk + 4 * samples_per_song, Fs_testk + 4 * samples_per_song] = audioread("CosmicLove(Electro).mp3", samplek);
    [y_testk + 5 * samples_per_song, Fs_testk + 5 * samples_per_song] = audioread("TiredBreak(Electro).mp3", samplek);
end
signal_test = cell(number_of_samples, 1);
for k = 1:number_of_samples
    signal_testk = y_testk(:, 1)';
end
data_points_test = cell(number_of_samples, 1); time_test = cell(number_of_samples, 1);
for k = 1:number_of_samples

```



```

data_points_testk = length(signal_testk); time_testk = data_points_testk / Fs_testk;
end
data_vector_test = cell(number_of_samples, 1); time_vector_test = cell(number_of_samples, 1);
for k = 1:number_of_samples
data_vector_testk = 1 : data_points_testk; time_vector_testk = data_vector_testk / Fs_testk;
end
fft_test = cell(number_of_samples, 1); frequencies_space_test = cell(number_of_samples, 1); frequencies_space_test =
cell(number_of_samples, 1);
for k = 1:number_of_samples
fft_testk = fft(signal_testk);
frequencies_space_testk = (2 * pi / time_testk * [0 : (data_points_testk / 2) - data_points_testk / 2 :
-1]); frequencies_space_shifted_testk = fftshift(frequencies_space_testk);
end
fourier_test = cell(number_of_samples, 1);
spread_factor = 1000;
spread_variable = 5;
for k = 1:number_of_samples
fourier_testk(1,:) = frequencies_space_shifted_testk; fourier_testk(2,:) = fftshift(abs(fft_testk));
end
length_fourier_test = cell(number_of_samples, 1);
sum_fourier_test = cell(number_of_samples, 1);
max_fourier_test = cell(number_of_samples, 1);
mean_fourier_test = cell(number_of_samples, 1);
spread_fourier_test = cell(number_of_samples, 1);
for j = 1 : number_of_samples
length_fourier_testj = length(fourier_testj);
max_fourier_testj = max(abs(fourier_testj(1,j)));
sum_fourier_testj = 0;
mean_fourier_testj = 0;
spread_fourier_testj = 0;
for k = 1 : length_fourier_testj
sum_fourier_testj = sum_fourier_testj + fourier_testj(2,k);
mean_fourier_testj = mean_fourier_testj + abs(fourier_testj(1,k)) * fourier_testj(2,k) / max_fourier_testj;
if fourier_testj(2,k) > (max_fourier_testj / spread_factor)
spread_fourier_testj = spread_fourier_testj + 1;
end
end
sum_fourier_testj = sum_fourier_testj / length_fourier_testj;
mean_fourier_testj = mean_fourier_testj / length_fourier_testj;
spread_fourier_testj = (spread_fourier_testj)^(1/spread_variable);
end

```

```

figure(9)
plot3(p_otis(1,:), p_otis(2,:), p_otis(3,:),'b')holdontitle('TestData')plot3(p_jammy(1,:), p_jammy(2,:), p_jammy(3,:),'r')plot3(p_max(1,:), p_max(2,:), p_max(3,:),'k')
sum_fourier_test_plot = zeros(1, number_of_samples);
mean_fourier_test_plot = zeros(1, number_of_samples);
spread_fourier_test_plot = zeros(1, number_of_samples);
for k = 1:number_of_samples
sum_fourier_test_plot(k) = sum_fourier_testk;
mean_fourier_test_plot(k) = mean_fourier_testk;
spread_fourier_test_plot(k) = spread_fourier_testk;
end
for k = 1 : number_of_samples_per_genre
scatter3(sum_fourier_test_plot(k), mean_fourier_test_plot(k), spread_fourier_test_plot(k),'b.')
end
for k = 1 : number_of_samples_per_genre
scatter3(sum_fourier_test_plot(k + number_of_samples_per_genre), mean_fourier_test_plot(k + number_of_samples_per_genre), spread_fourier_test_plot(k + number_of_samples_per_genre),'r.')
end
for k = 1 : number_of_samples_per_genre
scatter3(sum_fourier_test_plot(k + 2 * number_of_samples_per_genre), mean_fourier_test_plot(k + 2 * number_of_samples_per_genre), spread_fourier_test_plot(k + 2 * number_of_samples_per_genre),'k.')
end
axis vis3d
scatter_hiphop = zeros(3, number_of_samples_per_genre);
scatter_jazz = zeros(3, number_of_samples_per_genre);
scatter_electro = zeros(3, number_of_samples_per_genre);
for k = 1 : number_of_samples_per_genre
scatter_hiphop(:,k) = [sum_fourier_test_plot(k); mean_fourier_test_plot(k); spread_fourier_test_plot(k)];
end
for k = 1 : number_of_samples_per_genre
scatter_jazz(:,k) = [sum_fourier_test_plot(k + number_of_samples_per_genre); mean_fourier_test_plot(k + number_of_samples_per_genre); spread_fourier_test_plot(k + number_of_samples_per_genre)];
end
for k = 1 : number_of_samples_per_genre
scatter_electro(:,k) = [sum_fourier_test_plot(k + 2 * number_of_samples_per_genre); mean_fourier_test_plot(k + 2 * number_of_samples_per_genre); spread_fourier_test_plot(k + 2 * number_of_samples_per_genre)];
end
hiphop_right = 0;
hiphop_wrong = 0;
not_hiphop_right = 0;
not_hiphop_wrong = 0;

```

```

for k = 1 : number_of_samples_per_genre
    d_otis_right(k,:) = weight1 * point_to_line_distance(scatter_hiphop(:,k)', p_otis(:,1)', p_otis(:,2)') + weight2 * norm(abs(scatter_hiphop(:,k)' - mean_otis));
    if d_otis_right(k,:) <= border_otis
        hiphop_right = hiphop_right + 1;
    else
        hiphop_wrong = hiphop_wrong + 1;
    end
    d_otis_wrong1(k,:) = weight1 * point_to_line_distance(scatter_jazz(:,k)', p_otis(:,1)', p_otis(:,2)') + weight2 * norm(abs(scatter_jazz(:,k)' - mean_otis));
    if d_otis_wrong1(k,:) > border_otis
        not_hiphop_right = not_hiphop_right + 1;
    else
        not_hiphop_wrong = not_hiphop_wrong + 1;
    end
    d_otis_wrong2(k,:) = weight1 * point_to_line_distance(scatter_electro(:,k)', p_otis(:,1)', p_otis(:,2)') + weight2 * norm(abs(scatter_electro(:,k)' - mean_otis));
    if d_otis_wrong2(k,:) > border_otis
        not_hiphop_right = not_hiphop_right + 1;
    else
        not_hiphop_wrong = not_hiphop_wrong + 1;
    end
end
jazz_right = 0;
jazz_wrong = 0;
not_jazz_right = 0;
not_jazz_wrong = 0;
for k = 1 : number_of_samples_per_genre
    d_jammy_right(k,:) = weight1 * point_to_line_distance(scatter_jazz(:,k)', p_jammy(:,1)', p_jammy(:,2)') + weight2 * norm(abs(scatter_jazz(:,k)' - mean_jammy));
    if d_jammy_right(k,:) <= border_jammy
        jazz_right = jazz_right + 1;
    else
        jazz_wrong = jazz_wrong + 1;
    end
    d_jammy_wrong1(k,:) = weight1 * point_to_line_distance(scatter_hiphop(:,k)', p_jammy(:,1)', p_jammy(:,2)') + weight2 * norm(abs(scatter_hiphop(:,k)' - mean_jammy));
    if d_jammy_wrong1(k,:) > border_jammy
        not_jazz_right = not_jazz_right + 1;
    else
        not_jazz_wrong = not_jazz_wrong + 1;
    end
end

```

```

end
d_jammy_wrong2(k,:) = weight1 * point_to_line_distance(scatter_electro(:,k)', p_jammy(:,1)', p_jammy(:,2)') + weight2 * norm(abs(scatter_electro(:,k)' - mean_jammy));
if d_jammy_wrong2(k,:) > border_jammy
not_jazz_right = not_jazz_right + 1;
else
not_jazz_wrong = not_jazz_wrong + 1;
end
end
electro_right = 0;
electro_wrong = 0;
not_electro_right = 0;
not_electro_wrong = 0;
for k = 1 : number_of_samples_per_genre
d_max_right(k,:) = weight1 * point_to_line_distance(scatter_electro(:,k)', p_max(:,1)', p_max(:,2)') + weight2 * norm(abs(scatter_electro(:,k)' - mean_max));
if d_max_right(k,:) <= border_max
electro_right = electro_right + 1;
else
electro_wrong = electro_wrong + 1;
end
d_max_wrong1(k,:) = weight1 * point_to_line_distance(scatter_hiphop(:,k)', p_max(:,1)', p_max(:,2)') + weight2 * norm(abs(scatter_hiphop(:,k)' - mean_max));
if d_max_wrong1(k,:) > border_max
not_electro_right = not_electro_right + 1;
else
not_electro_wrong = not_electro_wrong + 1;
end
d_max_wrong2(k,:) = weight1 * point_to_line_distance(scatter_jazz(:,k)', p_max(:,1)', p_max(:,2)') + weight2 * norm(abs(scatter_jazz(:,k)' - mean_max));
if d_max_wrong2(k,:) > border_max
not_electro_right = not_electro_right + 1;
else
not_electro_wrong = not_electro_wrong + 1;
end
end
quote_hiphop_right = hiphop_right / number_of_samples_per_genre
quote_not_hiphop_right = not_hiphop_right / (2 * number_of_samples_per_genre)
quote_jazz_right = jazz_right / number_of_samples_per_genre
quote_not_jazz_right = not_jazz_right / (2 * number_of_samples_per_genre)
quote_electro_right = electro_right / number_of_samples_per_genre

```

```

quotenotelectroright = notelectroright / (2 * numberofsamplespergenre)
function distance=pointtolinedistance(pt,v1,v2)
if nargin==3 error('HJW:pointtolineddistance : nargin',... 'Incorrect number of inputs, expected 3. '); endi
[23] || any(size(pt) == 0) error('HJW : pointtolineddistance : pttypesize',... 'First input (pt) is not numeric
size(pt,2) error('HJW : pointtolineddistance : vtypesize',... ['Second input (v1) is not numeric or has an incorr
size(pt,2) error('HJW : pointtolineddistance : vtypesize', ['Third input (v2)',... 'is not numeric or has an incor
v1(:)'; if length(v1) == 2, v1(3) = 0; end v2 = v2(:)'; if length(v2) == 2, v2(3) =
0; end if size(pt,2) == 2, pt(1,3) = 0; end v1= repmat(v1, size(pt,1), 1); v2= repmat(v2, size(pt,1), 1);
a = v1-v2; b = pt-v2; distance = sqrt(sum(cross(a,b,2).^2,2))./sqrt(sum(a.^2,2));
end

```