

## Appendix:

../app.m

**startup**

```
y = dataset(:, 1);
X = dataset(:, 3:end);

X_full = [y X];
% Export full dataset
save('dataset_full', 'X_full');

[train, ~] = data_partition(X, y);
train_X = train(:, 2:end);
train_y = train(:, 1);

% Feature selection -----
N_feature = [2 3 4 5 6 7 8 9 10 11 12 13];
for n = N_feature
    [~, ~, best_features] = Sequential_Feature_Selection(train_X', train_y', ...
        ['Forward', num2str(n), 'LS', []]);
    X_new = [y X(:, best_features)];
    save(['dataset_', num2str(n), '_features', '.mat'], 'X_new');
end

% Export dataset with PCA dimension reduction -----
% chosen dimensions: [1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13]
M = [1 2 3 4 5 6 7 8 9 10 11 12 13];
for m=M
    [~,~,~,W] = PCA(train_X', [], m);
    X_pca = [y (W * X)'];

    save(['dataset_pca_', num2str(m), '.mat'], 'X_pca');
end

% Plot 2D selected feature test dataset -----
feature_selection_2-plot();

% Plot 2D projected test dataset -----
pca_2-plot();

% Experiment with Neural Nets with PCA and FS projected data -----
display('_');
display('Run_neural_networks_experiment_Press_any_key_to_continue...');
pause();

display('PCA_');
% alpha <- empirically optimized learning rates
alpha = [4 2 3 3 2 2 1 2 1 1 1 1 1];
Err_pca = zeros(1, 13);
for i = 1:13
    load(['dataset_pca_', num2str(i), '.mat']);

    X = X_pca(:, 2:end);
    y = X_pca(:, 1);

    [train, test] = data_partition(X, y);

    train_x = train(:, 2:end);
    train_y = train(:, 1);
    [r, d] = size(train_x);
    C = unique(train_y)';
    train_y = (train_y * (1 ./ C) == ones(r, length(C)));
    H = round(length(train_x) / (length(C) + d) * (length(train_x) / length(X)));

    test_x = test(:, 2:end);
    test_y = test(:, 1);
    [r, ~] = size(test_x);
    test_y = (test_y * (1 ./ C) == ones(r, length(C)));

    % normalize
    [train_x, mu, sigma] = zscore(train_x);
```

```

test_x = normalize(test_x, mu, sigma);

rand('state', 0); % fix the initial weight

nn = nnsetup([d H length(C)]); % nn structure [input, hidden, ..., hidden, output]
nn.activation_function = 'tanh_opt'; % 'sigm' (sigmoid) or 'tanh_opt' (optimal tanh).
nn.learningRate = alpha(i); % Learning rate
nn.scaling_learningRate = 0.999; % Scaling factor for the learning rate (each epoch)
% nn.momentum = 0.5;

opts.numepochs = 1000;
opts.batchsize = 20; % [10, 14, 20]
[nn, L] = nntrain(nn, train_x, train_y, opts);

[er, bad] = nntest(nn, test_x, test_y);
display(['er = ' num2str(er) ' \n(' num2str(i) 'd_PCA)' ...
    sprintf('\t\t[H=%d, \alpha=%d]', H, alpha(i))]);
Err_pca(i) = er;
end

display('Feature_Selection_____');
% alpha <- empirically optimized learning rates
alpha = [0 4 6 1 2 1 2 1 2 1 1 1 6 1];
Err_fs = zeros(1, 13);
for i = 2:13
    load(['dataset_', num2str(i), '_features.mat']);

    X = X_new(:, 2:end);
    y = X_new(:, 1);

    [train, test] = data_partition(X, y);

    train_x = train(:, 2:end);
    train_y = train(:, 1);
    [r, d] = size(train_x);
    C = unique(train_y);
    train_y = (train_y * (1 ./ C) == ones(r, length(C)));
    H = round(length(train_x) / (length(C) + d) * (length(train_x) / length(X)));

    test_x = test(:, 2:end);
    test_y = test(:, 1);
    [r, ~] = size(test_x);
    test_y = (test_y * (1 ./ C) == ones(r, length(C)));

    % normalize
    [train_x, mu, sigma] = zscore(train_x);
    test_x = normalize(test_x, mu, sigma);

    rand('state', 0); % fix the initial weight

    nn = nnsetup([d H length(C)]); % nn structure [input, hidden, ..., hidden, output]
    nn.activation_function = 'tanh_opt';
    nn.learningRate = alpha(i); % Should decrease over time.
    nn.scaling_learningRate = 0.999;

    opts.numepochs = 1000;
    opts.batchsize = 20;
    [nn, L] = nntrain(nn, train_x, train_y, opts);

    [er, bad] = nntest(nn, test_x, test_y);
    display(['er = ' num2str(er) ' \n(' num2str(i) 'd_features)' ...
        sprintf('\t\t[H=%d, \alpha=%d]', H, alpha(i))]);
    Err_fs(i) = er;
end

figure;
bar([Err_pca' Err_fs']);
title('Feed-forward_neural_nets_error_rate');
xlabel('Dimensions');
ylabel('Error');
legend('PCA', 'Feature_Selection');
ylim();

```

```
% Experiment with Bayesian parameter estimation
% with 5 features dataset
load 'dataset_5-features.mat',
```

```
X = X_new(:, 2:end);
y = X_new(:, 1);

[train, ~] = data_partition(X, y);
train_x = train(:, 2:end);
train_y = train(:, 1);

save_bayesian_params(train_x, train_y, '5-features');
```

```
% with 5D PCA
load 'dataset_pca_5.mat'
```

```
X = X_pca(:, 2:end);
y = X_pca(:, 1);

[train, ~] = data_partition(X, y);
train_x = train(:, 2:end);
train_y = train(:, 1);

save_bayesian_params(train_x, train_y, '5-pca');
```

../startup.m

```
% Clean environment
clc; clear all; close all;

% Load Classification Toolbox
addpath(genpath('/opt/Classification-toolbox'));
```

```
% Load Neural Networks Toolbox
addpath(genpath('/opt/DeepLearnToolbox'));
```

```
% Load dataset
dataset = load('leaf.csv');
```

../perform\_knn\_on\_data.m

```
features = 14;
neighbors = 12;

accuracy_PCA = zeros(features-1, neighbors);
accuracy_features = zeros(features, neighbors);
```

```
dataset = load('leaf.csv');
y = dataset(:, 1);
```

```
%% Train and compute accuracies
```

```
for m=1:features
    %user feedback
    disp(['Performing KNN with ', num2str(m), '_features']);

    if(m<14)
        if(m>1)
            load(['dataset_', num2str(m), '_features.mat'], 'X_new');
            [X_new_train, X_new_test] = data_partition(X_new(:, 2:end), y);
        end
        load(['dataset_pca_', num2str(m), '.mat'], 'X_pca');
        [X_pca_train, X_pca_test] = data_partition(X_pca(:, 2:end), y);
    else
        [X_new_train, X_new_test] = data_partition(dataset(:, 3:end), y);
    end
    for(k=1:neighbors)
        if(m>1)
            learned_test_features_class = NearestNeighbor(X_new_train(:, 2:end)', ...
                X_new_train(:, 1)', X_new_test(:, 2:end)', k);
            true_test_class_features = X_new_test(:, 1);
            accuracy_features(m,k) = sum(learned_test_features_class == true_test_class_features) ...
                / length(true_test_class_features);
        end
    end
end
```

```

        if(m<14)
            learned_test_PCA_class = Nearest_Neighbor(X_pca_train(:, 2:end)', X_pca_train(:, 1)', ...
                X_pca_test(:, 2:end)', k);
            true_test_class_PCA = X_pca_test(:, 1);
            accuracy_PCA(m,k) = sum(learned_test_PCA_class' == true_test_class_PCA) ...
                / length(true_test_class_PCA);
        end
    end
end

%% Graphs
disp('generating_graphs')
figure
surf(1-accuracy_features)
set(gca, 'YDir', 'Reverse')
ylabel('features')
ylim([1 14])
xlabel('neighbors')
xlim([1 12])
title('Error_using_KNN_with_Forward_Feature_Selection')
zlabel('error')
zlim([0 1])
set(gcf, 'InvertHardCopy', 'off');
figure
surf(1-accuracy_PCA)
set(gca, 'YDir', 'Reverse')
ylabel('features')
ylim([1 14])
xlabel('neighbors')
xlim([1 12])
title('Error_using_KNN_with_Principal_Component_Analysis')
zlabel('error')
zlim([0 1])
set(gcf, 'InvertHardCopy', 'off');

%% eliminate temp variables
clear X_pca_train X_pca X_new X_new_train X_new_test
clear learned_test_PCA_class learned_test_features_class true_test_class_PCA true_test_class_features

disp('Accuracy_results_may_be_seen_in_accuracy_PCA_and_accuracy_features')

../data_partition.m

function [ train, test ] = data_partition( X, target )
% data_partition - Split dataset into train and test set

    C = unique(target)';

    train = [];
    test = [];
    for c = C
        Data_given_c = [target(target == c) X(target == c, :)];
        train = cat(1, train, Data_given_c(1:end-2, :));
        test = cat(1, test, Data_given_c(end-1:end, :));
    end
end

../feature_selection_2_plot.m

function feature_selection_2_plot()
% FEATURE_SELECTION_2_PLOT - generate 2d plot for
%     dataset from feature selection method

display('_');
display('Generating_plot_(feature_selection).Press_any_key_to_continue...');
pause();

load 'dataset_2_features.mat';

X = X_new(:, 2:end);
y = X_new(:, 1);

[~, test] = data_partition(X, y);

```

```

y = test(:, 1);
x1 = test(:, 2);
x2 = test(:, 3);

plot2(x1, x2, y, '2D_test_dataset_(Feature_selection)');

                                ../pca_2-plot.m

function pca_2-plot()
% PCA_2_PLOT - generate 2d plot for
%           dataset from PCA method

display('_');
display('Generating_plot_(PCA). _Press_any_key_to_continue... ');
pause();

load 'dataset_pca_2.mat';

X = X_pca(:, 2:end);
y = X_pca(:, 1);

[~, test] = data_partition(X, y);

y = test(:, 1);
x1 = test(:, 2);
x2 = test(:, 3);

plot2(x1, x2, y, '2D_test_dataset_(PCA)');

                                ../plot2.m

function plot2( x1, x2, y, plot_title )
% PLOT2 - draw 2D plot from leaf data

figure;
K = unique(y);
markers = '.ox+sdv^<>pd';
L = {}; % legend

for k = K'
    X1 = x1(y == k);
    X2 = x2(y == k);
    index = fix(1 + (length(markers)-1) * rand);
    marker = markers(index);

    scatter(X1, X2, marker); hold on
    L{end+1} = ['C', num2str(k)];
end
hold off
title(plot_title);
xlabel('x1');
ylabel('x2');
legend(L);

                                ../save_bayesian_params.m

function save_bayesian_params( train_x, train_y, output )
% SAVE_BAYESIAN_PARAMS - Save bayesian parameters to ".mat" file

[~, d] = size(train_x);
K = unique(train_y);
Sigma = zeros(length(K), d, d); % Covariance for each class
for i = 1:length(K)
    X_given_y = train_x(train_y == K(i),:);
    [~, Sigma(i, :, :)] = mle(X_given_y);
end

[mu, Sigma] = Bayesian_parameter_est(train_x', train_y', Sigma);

save(['mu_', output, '.mat'], 'mu');
save(['Sigma_', output, '.mat'], 'Sigma');

```

../Haidong\_Shen.m

```
clear all;clc;
%—load the dataset after the pca
dataset_pca_4=load('dataset_pca_4.mat');
dataset_pca_4=dataset_pca_4.X_pca;
%—for 4 dimension
class_mu=zeros(30,5);
class_sigma=zeros(120,5);
test_data=zeros(60,5);
sum1=0;sum2=0;sum3=0;sum4=0;sum5=0;sum6=0;sum7=0;sum8=0;sum9=0;sum10=0;
sum11=0;sum12=0;sum13=0;sum14=0;sum15=0;sum22=0;sum23=0;sum24=0;sum25=0;
sum26=0;sum27=0;sum28=0;sum29=0;sum30=0;sum31=0;sum32=0;sum33=0;sum34=0;
sum35=0;sum36=0;

w1=length(find(dataset_pca_4(:,1)==1))/60;
w2=length(find(dataset_pca_4(:,1)==2))/60;
w3=length(find(dataset_pca_4(:,1)==3))/60;
w4=length(find(dataset_pca_4(:,1)==4))/60;
w5=length(find(dataset_pca_4(:,1)==5))/60;
w6=length(find(dataset_pca_4(:,1)==6))/60;
w7=length(find(dataset_pca_4(:,1)==7))/60;
w8=length(find(dataset_pca_4(:,1)==8))/60;
w9=length(find(dataset_pca_4(:,1)==9))/60;
w10=length(find(dataset_pca_4(:,1)==10))/60;
w11=length(find(dataset_pca_4(:,1)==11))/60;
w12=length(find(dataset_pca_4(:,1)==12))/60;
w13=length(find(dataset_pca_4(:,1)==13))/60;
w14=length(find(dataset_pca_4(:,1)==14))/60;
w15=length(find(dataset_pca_4(:,1)==15))/60;
w22=length(find(dataset_pca_4(:,1)==22))/60;
w23=length(find(dataset_pca_4(:,1)==23))/60;
w24=length(find(dataset_pca_4(:,1)==24))/60;
w25=length(find(dataset_pca_4(:,1)==25))/60;
w26=length(find(dataset_pca_4(:,1)==26))/60;
w27=length(find(dataset_pca_4(:,1)==27))/60;
w28=length(find(dataset_pca_4(:,1)==28))/60;
w29=length(find(dataset_pca_4(:,1)==29))/60;
w30=length(find(dataset_pca_4(:,1)==30))/60;
w31=length(find(dataset_pca_4(:,1)==31))/60;
w32=length(find(dataset_pca_4(:,1)==32))/60;
w33=length(find(dataset_pca_4(:,1)==33))/60;
w34=length(find(dataset_pca_4(:,1)==34))/60;
w35=length(find(dataset_pca_4(:,1)==35))/60;
w36=length(find(dataset_pca_4(:,1)==36))/60;
for num_class=1:15
    %—find dataset of different classes
    dataset_pca_4_num_class=dataset_pca_4...
        (find(dataset_pca_4(:,1)==num_class),2:5);
    %—let the last two data to be the test data and the rest will be the
    %training data
    [row,~]=size(dataset_pca_4_num_class);
    train_data_pca_4=dataset_pca_4_num_class(1:row-2,:);
    test_data_pca_4=dataset_pca_4_num_class(row-1:row,:);
    test_data(2*num_class-1:2*num_class,1)=num_class;
    test_data(2*num_class-1:2*num_class,2:5)=...
        test_data_pca_4; %—all the test data
    %—compute the mean and covariance of each class
    class_mu_ing=mean(train_data_pca_4);
    class_sigma_ing=cov(train_data_pca_4);
    class_mu(num_class,1)=num_class;
    class_mu(num_class,2:5)=class_mu_ing;
    class_sigma(num_class*4-3:num_class*4,1)=num_class;
    class_sigma(num_class*4-3:num_class*4,2:5)=class_sigma_ing;
end
for num_class=22:36
    %—find dataset of different classes
    dataset_pca_4_num_class=dataset_pca_4(find(...
        dataset_pca_4(:,1)==num_class),2:5);
    %—let the last two data to be the test data and the rest will be the
    %training data
    [row,~]=size(dataset_pca_4_num_class);
    train_data_pca_4=dataset_pca_4_num_class(1:row-2,:);
    test_data_pca_4=dataset_pca_4_num_class(row-1:row,:);
```

```

test_data(2*num_class-13:2*num_class-12,1)=num_class;
test_data(2*num_class-13:2*num_class-12,2:5)=test_data_pca_4;
%— all the test data
%—compute the mean and covariance of each class
class_mu_ing=mean(train_data_pca_4);
class_sigma_ing=cov(train_data_pca_4);
class_mu(num_class-6,1)=num_class;
class_mu(num_class-6,2:5)=class_mu_ing;
class_sigma(4*num_class-27:4*num_class-24,1)=num_class;
class_sigma(4*num_class-27:4*num_class-24,2:5)=class_sigma_ing;
end
for num_test=1:60
x=test_data(num_test,2:5);
%— build classification function
g1=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==1),2:5))^0.5...
*exp((-0.5)*(x-class_mu(1,2:5))*class_sigma(find(class_sigma...
(:,1))==1),2:5)^(-1)*(x-class_mu(1,2:5))')*w1;
g2=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==2),2:5))^0.5...
*exp((-0.5)*(x-class_mu(2,2:5))*class_sigma(find(class_sigma(:,...
1))==2),2:5)^(-1)*(x-class_mu(2,2:5))')*w2;
g3=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==3),2:5))^0.5...
*exp((-0.5)*(x-class_mu(3,2:5))*class_sigma(find(class_sigma(...
(:,1))==3),2:5)^(-1)*(x-class_mu(3,2:5))')*w3;
g4=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==4),2:5))^...
0.5)*exp((-0.5)*(x-class_mu(4,2:5))*class_sigma(find(...
class_sigma(:,1))==4),2:5)^(-1)*(x-class_mu(4,2:5))')*w4;
g5=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==5),2:5))^...
0.5)*exp((-0.5)*(x-class_mu(5,2:5))*class_sigma(find(...
class_sigma(:,1))==5),2:5)^(-1)*(x-class_mu(5,2:5))')*w5;
g6=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==6),2:5))...
^0.5)*exp((-0.5)*(x-class_mu(6,2:5))*class_sigma(find(...
class_sigma(:,1))==6),2:5)^(-1)*(x-class_mu(6,2:5))')*w6;
g7=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==7),2:5))...
^0.5)*exp((-0.5)*(x-class_mu(7,2:5))*class_sigma(find(...
class_sigma(:,1))==7),2:5)^(-1)*(x-class_mu(7,2:5))')*w7;
g8=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==8),2:5))...
^0.5)*exp((-0.5)*(x-class_mu(8,2:5))*class_sigma(find(...
class_sigma(:,1))==8),2:5)^(-1)*(x-class_mu(8,2:5))')*w8;
g9=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==9),2:5))...
^0.5)*exp((-0.5)*(x-class_mu(9,2:5))*class_sigma(find(...
class_sigma(:,1))==9),2:5)^(-1)*(x-class_mu(9,2:5))')*w9;
g10=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==10),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(10,2:5))*class_sigma(...
find(class_sigma(:,1))==10),2:5)^(-1)*(x-class_mu(10,2:5))')*w10;
g11=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==11),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(11,2:5))*class_sigma(...
find(class_sigma(:,1))==11),2:5)^(-1)*(x-class_mu(11,2:5))')*w11;
g12=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==12),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(12,2:5))*class_sigma(...
find(class_sigma(:,1))==12),2:5)^(-1)*(x-class_mu(12,2:5))')*w12;
g13=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==13),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(13,2:5))*class_sigma(...
find(class_sigma(:,1))==13),2:5)^(-1)*(x-class_mu(13,2:5))')*w13;
g14=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==14),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(14,2:5))*class_sigma(...
find(class_sigma(:,1))==14),2:5)^(-1)*(x-class_mu(14,2:5))')*w14;
g15=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==15),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(15,2:5))*class_sigma(...
find(class_sigma(:,1))==15),2:5)^(-1)*(x-class_mu(15,2:5))')*w15;
%— data from 16 to 21 is missing
g22=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==22),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(16,2:5))*class_sigma(...
find(class_sigma(:,1))==22),2:5)^(-1)*(x-class_mu(16,2:5))')*w22;
g23=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==23),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(17,2:5))*class_sigma(...
find(class_sigma(:,1))==23),2:5)^(-1)*(x-class_mu(17,2:5))')*w23;
g24=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==24),...
2:5))^0.5)*exp((-0.5)*(x-class_mu(18,2:5))*class_sigma...
(find(class_sigma(:,1))==24),2:5)^(-1)*(x-class_mu(18,2:5))')*w24;
g25=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==25),2:5))...
^0.5)*exp((-0.5)*(x-class_mu(19,2:5))*class_sigma(find(...
class_sigma(:,1))==25),2:5)^(-1)*(x-class_mu(19,2:5))')*w25;
g26=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==26),...

```

```

2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(20,2:5))*class_sigma(...
    find(class_sigma(:,1)==26),2:5)^(-1)*(x-class_mu(20,2:5)))' * w26;
g27=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==27),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(21,2:5))*class_sigma(...
    find(class_sigma(:,1)==27),2:5)^(-1)*(x-class_mu(21,2:5)))' * w27;
g28=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==28),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(22,2:5))*class_sigma(...
    find(class_sigma(:,1)==28),2:5)^(-1)*(x-class_mu(22,2:5)))' * w28;
g29=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==29),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(23,2:5))*class_sigma(...
    find(class_sigma(:,1)==29),2:5)^(-1)*(x-class_mu(23,2:5)))' * w29;
g30=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==30),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(24,2:5))*class_sigma(...
    find(class_sigma(:,1)==30),2:5)^(-1)*(x-class_mu(24,2:5)))' * w30;
g31=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==31),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(25,2:5))*class_sigma(...
    find(class_sigma(:,1)==31),2:5)^(-1)*(x-class_mu(25,2:5)))' * w31;
g32=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==32),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(26,2:5))*class_sigma(...
    find(class_sigma(:,1)==32),2:5)^(-1)*(x-class_mu(26,2:5)))' * w32;
g33=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==33),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(27,2:5))*class_sigma(...
    find(class_sigma(:,1)==33),2:5)^(-1)*(x-class_mu(27,2:5)))' * w33;
g34=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==34),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(28,2:5))*class_sigma(...
    find(class_sigma(:,1)==34),2:5)^(-1)*(x-class_mu(28,2:5)))' * w34;
g35=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==35),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(29,2:5))*class_sigma(...
    find(class_sigma(:,1)==35),2:5)^(-1)*(x-class_mu(29,2:5)))' * w35;
g36=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==36),...
    2:5)) ^ 0.5) * exp((-0.5)*(x-class_mu(30,2:5))*class_sigma(...
    find(class_sigma(:,1)==36),2:5)^(-1)*(x-class_mu(30,2:5)))' * w36;
result=[g1,g2,g3,g4,g5,g6,g7,g8,g9,g10,g11,g12,g13,g14,g15,g22...
    ,g23,g24,g25,g26,g27,g28,g29,g30,g31,g32,g33,g34,g35,g36];
[~,index]=max(result);
if index==1
    sum1=sum1+1;
elseif index==2
    sum2=sum2+1;
elseif index==3
    sum3=sum3+1;
elseif index==4
    sum4=sum4+1;
elseif index==5
    sum5=sum5+1;
elseif index==6
    sum6=sum6+1;
elseif index==7
    sum7=sum7+1;
elseif index==8
    sum8=sum8+1;
elseif index==9
    sum9=sum9+1;
elseif index==10
    sum10=sum10+1;
elseif index==11
    sum11=sum11+1;
elseif index==12
    sum12=sum12+1;
elseif index==13
    sum13=sum13+1;
elseif index==14
    sum14=sum14+1;
elseif index==15
    sum15=sum15+1;
elseif index==16
    sum22=sum22+1;
elseif index==17
    sum23=sum23+1;
elseif index==18
    sum24=sum24+1;
elseif index==19
    sum25=sum25+1;

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elseif index==20
    sum26=sum26+1;
elseif index==21
    sum27=sum27+1;
elseif index==22
    sum28=sum28+1;
elseif index==23
    sum29=sum29+1;
elseif index==24
    sum30=sum30+1;
elseif index==25
    sum31=sum31+1;
elseif index==26
    sum32=sum32+1;
elseif index==27
    sum33=sum33+1;
elseif index==28
    sum34=sum34+1;
elseif index==29
    sum35=sum35+1;
elseif index==30
    sum36=sum36+1;
end
end
table=zeros(30,2);
table(1:15,1)=1:15;
table(16:30,1)=22:36;
table(1:30,2)=[sum1,sum2,sum3,sum4,sum5,sum6,sum7,sum8,sum9,sum10,...
    sum11,sum12,sum13,sum14,sum15,...
    sum22,sum23,sum24,sum25,sum26,sum27,sum28,sum29,sum30,...
    sum31,sum32,sum33,sum34,sum35,sum36];

save('confusion_table_4_PCA.mat','table');

clear all;clc;
%—load the dataset after the pca
dataset_pca_3=load('dataset_3_features.mat');
dataset_pca_3=dataset_pca_3.X_new;
%—for 4 dimension
class_mu=zeros(30,4);
class_sigma=zeros(90,4);
test_data=zeros(60,4);
sum1=0;sum2=0;sum3=0;sum4=0;sum5=0;sum6=0;sum7=0;sum8=0;sum9=0;sum10=0;
sum11=0;sum12=0;sum13=0;sum14=0;sum15=0;sum22=0;sum23=0;sum24=0;...
    sum25=0;sum26=0;
sum27=0;sum28=0;sum29=0;sum30=0;sum31=0;sum32=0;sum33=0;sum34=0;...
    sum35=0;sum36=0;
w1=length(find(dataset_pca_3(:,1)==1))/60;
w2=length(find(dataset_pca_3(:,1)==2))/60;
w3=length(find(dataset_pca_3(:,1)==3))/60;
w4=length(find(dataset_pca_3(:,1)==4))/60;
w5=length(find(dataset_pca_3(:,1)==5))/60;
w6=length(find(dataset_pca_3(:,1)==6))/60;
w7=length(find(dataset_pca_3(:,1)==7))/60;
w8=length(find(dataset_pca_3(:,1)==8))/60;
w9=length(find(dataset_pca_3(:,1)==9))/60;
w10=length(find(dataset_pca_3(:,1)==10))/60;
w11=length(find(dataset_pca_3(:,1)==11))/60;
w12=length(find(dataset_pca_3(:,1)==12))/60;
w13=length(find(dataset_pca_3(:,1)==13))/60;
w14=length(find(dataset_pca_3(:,1)==14))/60;
w15=length(find(dataset_pca_3(:,1)==15))/60;
w22=length(find(dataset_pca_3(:,1)==22))/60;
w23=length(find(dataset_pca_3(:,1)==23))/60;
w24=length(find(dataset_pca_3(:,1)==24))/60;
w25=length(find(dataset_pca_3(:,1)==25))/60;
w26=length(find(dataset_pca_3(:,1)==26))/60;
w27=length(find(dataset_pca_3(:,1)==27))/60;
w28=length(find(dataset_pca_3(:,1)==28))/60;
w29=length(find(dataset_pca_3(:,1)==29))/60;

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w30=length(find(dataset_pca_3(:,1)==30))/60;
w31=length(find(dataset_pca_3(:,1)==31))/60;
w32=length(find(dataset_pca_3(:,1)==32))/60;
w33=length(find(dataset_pca_3(:,1)==33))/60;
w34=length(find(dataset_pca_3(:,1)==34))/60;
w35=length(find(dataset_pca_3(:,1)==35))/60;
w36=length(find(dataset_pca_3(:,1)==36))/60;
for num_class=1:15
    %—find dataset of different classes
    dataset_pca_3_num_class=dataset_pca_3(find(...
        dataset_pca_3(:,1)==num_class),2:4);
    %—let the last two data to be the test data and the rest will be the
    %training data
    [row,~]=size(dataset_pca_3_num_class);
    train_data_pca_3=dataset_pca_3_num_class(1:row-2,:);
    test_data_pca_3=dataset_pca_3_num_class(row-1:row,:);
    test_data(2*num_class-1:2*num_class,1)=num_class;
    test_data(2*num_class-1:2*num_class,2:4)=test_data_pca_3;
    %—all the test data
    %—compute the mean and covariance of each class
    class_mu_ing=mean(train_data_pca_3);
    class_sigma_ing=cov(train_data_pca_3);
    class_mu(num_class,1)=num_class;
    class_mu(num_class,2:4)=class_mu_ing;
    class_sigma(num_class*3-2:num_class*3,1)=num_class;
    class_sigma(num_class*3-2:num_class*3,2:4)=class_sigma_ing;
end
for num_class=22:36
    %—find dataset of different classes
    dataset_pca_3_num_class=dataset_pca_3(find(...
        dataset_pca_3(:,1)==num_class),2:4);
    %—let the last two data to be the test data and the rest will be the
    %training data
    [row,~]=size(dataset_pca_3_num_class);
    train_data_pca_3=dataset_pca_3_num_class(1:row-2,:);
    test_data_pca_3=dataset_pca_3_num_class(row-1:row,:);
    test_data(2*num_class-13:2*num_class-12,1)=num_class;
    test_data(2*num_class-13:2*num_class-12,2:4)=test_data_pca_3;
    %—all the test data
    %—compute the mean and covariance of each class
    class_mu_ing=mean(train_data_pca_3);
    class_sigma_ing=cov(train_data_pca_3);
    class_mu(num_class-6,1)=num_class;
    class_mu(num_class-6,2:4)=class_mu_ing;
    class_sigma(3*num_class-18-2:3*num_class-18,1)=num_class;
    class_sigma(3*num_class-18-2:3*num_class-18,2:4)=class_sigma_ing;
end
for num_test=1:60
    x=test_data(num_test,2:4);
    %— build classification function
    g1=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==1),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(1,2:4))*class_sigma(...
        (find(class_sigma(:,1))==1),2:4)^(-1)*(x-class_mu(1,2:4))')*w1;
    g2=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==2),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(2,2:4))*class_sigma(...
        find(class_sigma(:,1))==2),2:4)^(-1)*(x-class_mu(2,2:4))')*w2;
    g3=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==3),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(3,2:4))*class_sigma(...
        (find(class_sigma(:,1))==3),2:4)^(-1)*(x-class_mu(3,2:4))')*w3;
    g4=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==4),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(4,2:4))*class_sigma(...
        (find(class_sigma(:,1))==4),2:4)^(-1)*(x-class_mu(4,2:4))')*w4;
    g5=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==5),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(5,2:4))*class_sigma(...
        (find(class_sigma(:,1))==5),2:4)^(-1)*(x-class_mu(5,2:4))')*w5;
    g6=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==6),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(6,2:4))*class_sigma(...
        find(class_sigma(:,1))==6),2:4)^(-1)*(x-class_mu(6,2:4))')*w6;
    g7=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==7),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(7,2:4))*class_sigma(...
        find(class_sigma(:,1))==7),2:4)^(-1)*(x-class_mu(7,2:4))')*w7;
    g8=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==8),...
        2:4))^0.5*exp((-0.5)*(x-class_mu(8,2:4))*class_sigma(...

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    find(class_sigma(:,1)==8),2:4)^(-1)*(x-class_mu(8,2:4))')*w8;
g9=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==9),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(9,2:4))*class_sigma...
    (find(class_sigma(:,1)==9),2:4)^(-1)*(x-class_mu(9,2:4))')*w9;
g10=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==10),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(10,2:4))*class_sigma...
    find(class_sigma(:,1)==10),2:4)^(-1)*(x-class_mu(10,2:4))')*w10;
g11=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==11),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(11,2:4))*class_sigma...
    (find(class_sigma(:,1)==11),2:4)^(-1)*(x-class_mu(11,2:4))')*w11;
g12=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==12),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(12,2:4))*class_sigma...
    find(class_sigma(:,1)==12),2:4)^(-1)*(x-class_mu(12,2:4))')*w12;
g13=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==13),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(13,2:4))*class_sigma...
    (find(class_sigma(:,1)==13),2:4)^(-1)*(x-class_mu(13,2:4))')*w13;
g14=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==14),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(14,2:4))*class_sigma...
    find(class_sigma(:,1)==14),2:4)^(-1)*(x-class_mu(14,2:4))')*w14;
g15=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==15),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(15,2:4))*class_sigma...
    find(class_sigma(:,1)==15),2:4)^(-1)*(x-class_mu(15,2:4))')*w15;
%— data from 16 to 21 is missing
g22=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==22),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(16,2:4))*class_sigma...
    find(class_sigma(:,1)==22),2:4)^(-1)*(x-class_mu(16,2:4))')*w22;
g23=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==23),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(17,2:4))*class_sigma...
    find(class_sigma(:,1)==23),2:4)^(-1)*(x-class_mu(17,2:4))')*w23;
g24=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==24),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(18,2:4))*class_sigma...
    find(class_sigma(:,1)==24),2:4)^(-1)*(x-class_mu(18,2:4))')*w24;
g25=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==25),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(19,2:4))*class_sigma...
    find(class_sigma(:,1)==25),2:4)^(-1)*(x-class_mu(19,2:4))')*w25;
g26=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==26),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(20,2:4))*class_sigma...
    find(class_sigma(:,1)==26),2:4)^(-1)*(x-class_mu(20,2:4))')*w26;
g27=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==27),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(21,2:4))*class_sigma...
    find(class_sigma(:,1)==27),2:4)^(-1)*(x-class_mu(21,2:4))')*w27;
g28=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==28),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(22,2:4))*class_sigma...
    (find(class_sigma(:,1)==28),2:4)^(-1)*(x-class_mu(22,2:4))')*w28;
g29=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==29),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(23,2:4))*class_sigma...
    find(class_sigma(:,1)==29),2:4)^(-1)*(x-class_mu(23,2:4))')*w29;
g30=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==30),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(24,2:4))*class_sigma...
    (find(class_sigma(:,1)==30),2:4)^(-1)*(x-class_mu(24,2:4))')*w30;
g31=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==31),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(25,2:4))*class_sigma...
    (find(class_sigma(:,1)==31),2:4)^(-1)*(x-class_mu(25,2:4))')*w31;
g32=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==32),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(26,2:4))*class_sigma...
    find(class_sigma(:,1)==32),2:4)^(-1)*(x-class_mu(26,2:4))')*w32;
g33=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==33),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(27,2:4))*class_sigma...
    (find(class_sigma(:,1)==33),2:4)^(-1)*(x-class_mu(27,2:4))')*w33;
g34=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==34),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(28,2:4))*class_sigma...
    (find(class_sigma(:,1)==34),2:4)^(-1)*(x-class_mu(28,2:4))')*w34;
g35=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==35),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(29,2:4))*class_sigma...
    (find(class_sigma(:,1)==35),2:4)^(-1)*(x-class_mu(29,2:4))')*w35;
g36=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==36),...
    2:4))^0.5)*exp((-0.5)*(x-class_mu(30,2:4))*class_sigma...
    (find(class_sigma(:,1)==36),2:4)^(-1)*(x-class_mu(30,2:4))')*w36;
result=[g1,g2,g3,g4,g5,g6,g7,g8,g9,g10,g11,g12,g13,g14,g15,...
    g22,g23,g24,g25,g26,g27,g28,g29,g30,g31,g32,g33,g34,g35,g36];
[~,index]=max(result);
if index==1
    sum1=sum1+1;

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```

elseif index==2
    sum2=sum2+1;
elseif index==3
    sum3=sum3+1;
elseif index==4
    sum4=sum4+1;
elseif index==5
    sum5=sum5+1;
elseif index==6
    sum6=sum6+1;
elseif index==7
    sum7=sum7+1;
elseif index==8
    sum8=sum8+1;
elseif index==9
    sum9=sum9+1;
elseif index==10
    sum10=sum10+1;
elseif index==11
    sum11=sum11+1;
elseif index==12
    sum12=sum12+1;
elseif index==13
    sum13=sum13+1;
elseif index==14
    sum14=sum14+1;
elseif index==15
    sum15=sum15+1;
elseif index==16
    sum22=sum22+1;
elseif index==17
    sum23=sum23+1;
elseif index==18
    sum24=sum24+1;
elseif index==19
    sum25=sum25+1;
elseif index==20
    sum26=sum26+1;
elseif index==21
    sum27=sum27+1;
elseif index==22
    sum28=sum28+1;
elseif index==23
    sum29=sum29+1;
elseif index==24
    sum30=sum30+1;
elseif index==25
    sum31=sum31+1;
elseif index==26
    sum32=sum32+1;
elseif index==27
    sum33=sum33+1;
elseif index==28
    sum34=sum34+1;
elseif index==29
    sum35=sum35+1;
elseif index==30
    sum36=sum36+1;
end
end
table=zeros(30,2);
table(1:15,1)=1:15;
table(16:30,1)=22:36;
table(1:30,2)=[sum1,sum2,sum3,sum4,sum5,sum6,sum7,sum8,sum9,sum10...
    ,sum11,sum12,sum13,sum14,sum15,...
    sum22,sum23,sum24,sum25,sum26,sum27,sum28,sum29,sum30,...
    sum31,sum32,sum33,sum34,sum35,sum36];
save('confusion_table_3_feature_selection.mat','table');

clc;clear all;
mu_5_features=load('mu_5_features.mat');

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```

mu_5_features=mu_5_features.mu;
sigma_5_feature=load('Sigma_5_features.mat');
sigma_5_feature=sigma_5_feature.Sigma;
test_data_fs=load('testdata_feature_selection.mat');
test_data_fs=test_data_fs.test_data;
test_data=test_data_fs;
class_sigma=zeros(150,6);
sum1=0;sum2=0;sum3=0;sum4=0;sum5=0;sum6=0;sum7=0;sum8=0;sum9=0;sum10=0;
sum11=0;sum12=0;sum13=0;sum14=0;sum15=0;...
    sum22=0;sum23=0;sum24=0;sum25=0;sum26=0;
sum27=0;sum28=0;sum29=0;sum30=0;sum31=0;...
    sum32=0;sum33=0;sum34=0;sum35=0;sum36=0;
pw=load('pw.mat');
w1=pw.w1;
w2=pw.w2;
w3=pw.w3;
w4=pw.w4;
w5=pw.w5;
w6=pw.w6;
w7=pw.w7;
w8=pw.w8;
w9=pw.w9;
w10=pw.w10;
w11=pw.w11;
w12=pw.w12;
w13=pw.w13;
w14=pw.w14;
w15=pw.w15;
w22=pw.w22;
w23=pw.w23;
w24=pw.w24;
w25=pw.w25;
w26=pw.w26;
w27=pw.w27;
w28=pw.w28;
w29=pw.w29;
w30=pw.w30;
w31=pw.w31;
w32=pw.w32;
w33=pw.w33;
w34=pw.w34;
w35=pw.w35;
w36=pw.w36;
for i=1:15
    sigma_feature=squeeze(sigma_5_feature(i,:,:));
    class_sigma(i*5-4:i*5,1)=i;
    class_sigma(i*5-4:i*5,2:6)=sigma_feature;
end
for i=16:30
    sigma_feature=squeeze(sigma_5_feature(i,:,:));
    class_sigma(i*5-4:i*5,1)=i+6;
    class_sigma(i*5-4:i*5,2:6)=sigma_feature;
end
class_mu=mu_5_features;
for num_test=1:60
    x=test_data(num_test,2:6);
    %— build classification function
    g1=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==1),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(1,1:5))*class_sigma(...
        find(class_sigma(:,1))==1),2:6)^(-1)*(x-class_mu(1,1:5))'*w1;
    g2=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==2),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(2,1:5))*class_sigma(...
        find(class_sigma(:,1))==2),2:6)^(-1)*(x-class_mu(2,1:5))'*w2;
    g3=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==3),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(3,1:5))*class_sigma(...
        find(class_sigma(:,1))==3),2:6)^(-1)*(x-class_mu(3,1:5))'*w3;
    g4=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==4),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(4,1:5))*class_sigma(...
        find(class_sigma(:,1))==4),2:6)^(-1)*(x-class_mu(4,1:5))'*w4;
    g5=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==5),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(5,1:5))*class_sigma(...
        find(class_sigma(:,1))==5),2:6)^(-1)*(x-class_mu(5,1:5))'*w5;
    g6=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==6),...

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,2:6))^0.5)*exp((-0.5)*(x-class_mu(6,1:5))*class_sigma...
(find(class_sigma(:,1)==6),2:6)^(-1)*(x-class_mu(6,1:5)))'*w6;
g7=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==7)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(7,1:5))*class_sigma...
(find(class_sigma(:,1))==7),2:6)^(-1)*(x-class_mu(7,1:5)))'*w7;
g8=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==8)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(8,1:5))*class_sigma...
(find(class_sigma(:,1))==8),2:6)^(-1)*(x-class_mu(8,1:5)))'*w8;
g9=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==9)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(9,1:5))*class_sigma...
(find(class_sigma(:,1))==9),2:6)^(-1)*(x-class_mu(9,1:5)))'*w9;
g10=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==10)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(10,1:5))*class_sigma...
(find(class_sigma(:,1))==10),2:6)^(-1)*(x-class_mu(10,1:5)))'*w10;
g11=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==11)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(11,1:5))*class_sigma...
(find(class_sigma(:,1))==11),2:6)^(-1)*(x-class_mu(11,1:5)))'*w11;
g12=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==12)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(12,1:5))*class_sigma...
(find(class_sigma(:,1))==12),2:6)^(-1)*(x-class_mu(12,1:5)))'*w12;
g13=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==13)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(13,1:5))*class_sigma...
(find(class_sigma(:,1))==13),2:6)^(-1)*(x-class_mu(13,1:5)))'*w13;
g14=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==14)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(14,1:5))*class_sigma...
(find(class_sigma(:,1))==14),2:6)^(-1)*(x-class_mu(14,1:5)))'*w14;
g15=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==15)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(15,1:5))*class_sigma...
(find(class_sigma(:,1))==15),2:6)^(-1)*(x-class_mu(15,1:5)))'*w15;
%— data from 16 to 21 is missing
g22=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==22)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(16,1:5))*class_sigma...
(find(class_sigma(:,1))==22),2:6)^(-1)*(x-class_mu(16,1:5)))'*w22;
g23=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==23)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(17,1:5))*class_sigma...
(find(class_sigma(:,1))==23),2:6)^(-1)*(x-class_mu(17,1:5)))'*w23;
g24=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==24)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(18,1:5))*class_sigma...
(find(class_sigma(:,1))==24),2:6)^(-1)*(x-class_mu(18,1:5)))'*w24;
g25=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==25)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(19,1:5))*class_sigma...
(find(class_sigma(:,1))==25),2:6)^(-1)*(x-class_mu(19,1:5)))'*w25;
g26=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==26)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(20,1:5))*class_sigma...
(find(class_sigma(:,1))==26),2:6)^(-1)*(x-class_mu(20,1:5)))'*w26;
g27=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==27)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(21,1:5))*class_sigma...
(find(class_sigma(:,1))==27),2:6)^(-1)*(x-class_mu(21,1:5)))'*w27;
g28=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==28)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(22,1:5))*class_sigma...
(find(class_sigma(:,1))==28),2:6)^(-1)*(x-class_mu(22,1:5)))'*w28;
g29=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==29)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(23,1:5))*class_sigma...
(find(class_sigma(:,1))==29),2:6)^(-1)*(x-class_mu(23,1:5)))'*w29;
g30=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==30)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(24,1:5))*class_sigma...
(find(class_sigma(:,1))==30),2:6)^(-1)*(x-class_mu(24,1:5)))'*w30;
g31=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==31)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(25,1:5))*class_sigma...
(find(class_sigma(:,1))==31),2:6)^(-1)*(x-class_mu(25,1:5)))'*w31;
g32=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==32)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(26,1:5))*class_sigma...
(find(class_sigma(:,1))==32),2:6)^(-1)*(x-class_mu(26,1:5)))'*w32;
g33=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==33)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(27,1:5))*class_sigma...
(find(class_sigma(:,1))==33),2:6)^(-1)*(x-class_mu(27,1:5)))'*w33;
g34=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==34)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(28,1:5))*class_sigma...
(find(class_sigma(:,1))==34),2:6)^(-1)*(x-class_mu(28,1:5)))'*w34;
g35=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==35)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(29,1:5))*class_sigma...
(find(class_sigma(:,1))==35),2:6)^(-1)*(x-class_mu(29,1:5)))'*w35;
g36=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==36)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(30,1:5))*class_sigma...
(find(class_sigma(:,1))==36),2:6)^(-1)*(x-class_mu(30,1:5)))'*w36;

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        ,2:6))^0.5)*exp((-0.5)*(x-class_mu(30,1:5))*class_sigma...
        (find(class_sigma(:,1)==36),2:6)^(-1)*(x-class_mu(30,1:5)))'*w36;
result=[g1,g2,g3,g4,g5,g6,g7,g8,g9,g10,g11,g12,g13,g14,g15,...
        g22,g23,g24,g25,g26,g27,g28,g29,g30,g31,g32,g33,g34,g35,g36];
[~,index]=max(result);
if index==1
    sum1=sum1+1;
elseif index==2
    sum2=sum2+1;
elseif index==3
    sum3=sum3+1;
elseif index==4
    sum4=sum4+1;
elseif index==5
    sum5=sum5+1;
elseif index==6
    sum6=sum6+1;
elseif index==7
    sum7=sum7+1;
elseif index==8
    sum8=sum8+1;
elseif index==9
    sum9=sum9+1;
elseif index==10
    sum10=sum10+1;
elseif index==11
    sum11=sum11+1;
elseif index==12
    sum12=sum12+1;
elseif index==13
    sum13=sum13+1;
elseif index==14
    sum14=sum14+1;
elseif index==15
    sum15=sum15+1;
elseif index==16
    sum22=sum22+1;
elseif index==17
    sum23=sum23+1;
elseif index==18
    sum24=sum24+1;
elseif index==19
    sum25=sum25+1;
elseif index==20
    sum26=sum26+1;
elseif index==21
    sum27=sum27+1;
elseif index==22
    sum28=sum28+1;
elseif index==23
    sum29=sum29+1;
elseif index==24
    sum30=sum30+1;
elseif index==25
    sum31=sum31+1;
elseif index==26
    sum32=sum32+1;
elseif index==27
    sum33=sum33+1;
elseif index==28
    sum34=sum34+1;
elseif index==29
    sum35=sum35+1;
elseif index==30
    sum36=sum36+1;
end
end
table=zeros(30,2);
table(1:15,1)=1:15;
table(16:30,1)=22:36;
table(1:30,2)=[sum1,sum2,sum3,sum4,sum5,sum6,sum7,sum8,...
    sum9,sum10,sum11,sum12,sum13,sum14,sum15,...
    sum22,sum23,sum24,sum25,sum26,sum27,sum28,sum29,...

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sum30,sum31,sum32,sum33,sum34,sum35,sum36];
save('confusion_table_5_bayesian_fs.mat','table');

clc;clear all;
mu_5_features=load('mu_5_pca.mat');
mu_5_features=mu_5_features.mu;
sigma_5_feature=load('Sigma_5_pca.mat');
sigma_5_feature=sigma_5_feature.Sigma;
test_data_fs=load('testdata_PCA.mat');
test_data_fs=test_data_fs.test_data;
test_data=test_data_fs;
class_sigma=zeros(150,6);
sum1=0;sum2=0;sum3=0;sum4=0;sum5=0;sum6=0;sum7=0;sum8=0;sum9=0;sum10=0;
sum11=0;sum12=0;sum13=0;sum14=0;sum15=0;
sum22=0;sum23=0;sum24=0;sum25=0;sum26=0;
sum27=0;sum28=0;sum29=0;sum30=0;sum31=0;
sum32=0;sum33=0;sum34=0;sum35=0;sum36=0;
pw=load('pw.mat');
w1=pw.w1;
w2=pw.w2;
w3=pw.w3;
w4=pw.w4;
w5=pw.w5;
w6=pw.w6;
w7=pw.w7;
w8=pw.w8;
w9=pw.w9;
w10=pw.w10;
w11=pw.w11;
w12=pw.w12;
w13=pw.w13;
w14=pw.w14;
w15=pw.w15;
w22=pw.w22;
w23=pw.w23;
w24=pw.w24;
w25=pw.w25;
w26=pw.w26;
w27=pw.w27;
w28=pw.w28;
w29=pw.w29;
w30=pw.w30;
w31=pw.w31;
w32=pw.w32;
w33=pw.w33;
w34=pw.w34;
w35=pw.w35;
w36=pw.w36;
for i=1:15
    sigma_feature=squeeze(sigma_5_feature(i,:,:));
    class_sigma(i*5-4:i*5,1)=i;
    class_sigma(i*5-4:i*5,2:6)=sigma_feature;
end
for i=16:30
    sigma_feature=squeeze(sigma_5_feature(i,:,:));
    class_sigma(i*5-4:i*5,1)=i+6;
    class_sigma(i*5-4:i*5,2:6)=sigma_feature;
end
class_mu=mu_5_features;
for num_test=1:60
    x=test_data(num_test,2:6);
    %— build classification function
    g1=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==1),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(1,1:5))*class_sigma(...
        find(class_sigma(:,1))==1),2:6)^(-1)*(x-class_mu(1,1:5))'*w1;
    g2=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==2)...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(2,1:5))*class_sigma...
        (find(class_sigma(:,1))==2),2:6)^(-1)*(x-class_mu(2,1:5))'*w2;
    g3=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1))==3),...
        2:6))^0.5)*exp((-0.5)*(x-class_mu(3,1:5))*class_sigma...
        (find(class_sigma(:,1))==3),2:6)^(-1)*(x-class_mu(3,1:5))'*w3;

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g4=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==4)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(4,1:5))*class_sigma...
(find(class_sigma(:,1)==4),2:6)^(-1)*(x-class_mu(4,1:5)))'*w4;
g5=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==5)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(5,1:5))*class_sigma...
(find(class_sigma(:,1)==5),2:6)^(-1)*(x-class_mu(5,1:5)))'*w5;
g6=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==6)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(6,1:5))*class_sigma...
(find(class_sigma(:,1)==6),2:6)^(-1)*(x-class_mu(6,1:5)))'*w6;
g7=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==7)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(7,1:5))*class_sigma...
(find(class_sigma(:,1)==7),2:6)^(-1)*(x-class_mu(7,1:5)))'*w7;
g8=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==8)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(8,1:5))*class_sigma...
(find(class_sigma(:,1)==8),2:6)^(-1)*(x-class_mu(8,1:5)))'*w8;
g9=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==9)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(9,1:5))*class_sigma...
(find(class_sigma(:,1)==9),2:6)^(-1)*(x-class_mu(9,1:5)))'*w9;
g10=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==10)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(10,1:5))*class_sigma...
(find(class_sigma(:,1)==10),2:6)^(-1)*(x-class_mu(10,1:5)))'*w10;
g11=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==11)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(11,1:5))*class_sigma...
(find(class_sigma(:,1)==11),2:6)^(-1)*(x-class_mu(11,1:5)))'*w11;
g12=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==12)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(12,1:5))*class_sigma...
(find(class_sigma(:,1)==12),2:6)^(-1)*(x-class_mu(12,1:5)))'*w12;
g13=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==13)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(13,1:5))*class_sigma...
(find(class_sigma(:,1)==13),2:6)^(-1)*(x-class_mu(13,1:5)))'*w13;
g14=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==14)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(14,1:5))*class_sigma...
(find(class_sigma(:,1)==14),2:6)^(-1)*(x-class_mu(14,1:5)))'*w14;
g15=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==15)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(15,1:5))*class_sigma...
(find(class_sigma(:,1)==15),2:6)^(-1)*(x-class_mu(15,1:5)))'*w15;
%— data from 16 to 21 is missing
g22=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==22)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(16,1:5))*class_sigma...
(find(class_sigma(:,1)==22),2:6)^(-1)*(x-class_mu(16,1:5)))'*w22;
g23=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==23)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(17,1:5))*class_sigma...
(find(class_sigma(:,1)==23),2:6)^(-1)*(x-class_mu(17,1:5)))'*w23;
g24=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==24)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(18,1:5))*class_sigma...
(find(class_sigma(:,1)==24),2:6)^(-1)*(x-class_mu(18,1:5)))'*w24;
g25=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==25)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(19,1:5))*class_sigma...
(find(class_sigma(:,1)==25),2:6)^(-1)*(x-class_mu(19,1:5)))'*w25;
g26=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==26)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(20,1:5))*class_sigma...
(find(class_sigma(:,1)==26),2:6)^(-1)*(x-class_mu(20,1:5)))'*w26;
g27=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==27)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(21,1:5))*class_sigma...
(find(class_sigma(:,1)==27),2:6)^(-1)*(x-class_mu(21,1:5)))'*w27;
g28=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==28)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(22,1:5))*class_sigma...
(find(class_sigma(:,1)==28),2:6)^(-1)*(x-class_mu(22,1:5)))'*w28;
g29=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==29)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(23,1:5))*class_sigma...
(find(class_sigma(:,1)==29),2:6)^(-1)*(x-class_mu(23,1:5)))'*w29;
g30=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==30)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(24,1:5))*class_sigma...
(find(class_sigma(:,1)==30),2:6)^(-1)*(x-class_mu(24,1:5)))'*w30;
g31=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==31)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(25,1:5))*class_sigma...
(find(class_sigma(:,1)==31),2:6)^(-1)*(x-class_mu(25,1:5)))'*w31;
g32=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==32)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(26,1:5))*class_sigma...
(find(class_sigma(:,1)==32),2:6)^(-1)*(x-class_mu(26,1:5)))'*w32;
g33=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==33)...
,2:6))^0.5)*exp((-0.5)*(x-class_mu(27,1:5))*class_sigma...
(find(class_sigma(:,1)==33),2:6)^(-1)*(x-class_mu(27,1:5)))'*w33;

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g34=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==34),...
2:6))^0.5)*exp((-0.5)*(x-class_mu(28,1:5))*class_sigma(...
(find(class_sigma(:,1)==34),2:6)^(-1)*(x-class_mu(28,1:5)))'*w34;
g35=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==35),...
2:6))^0.5)*exp((-0.5)*(x-class_mu(29,1:5))*class_sigma(...
(find(class_sigma(:,1)==35),2:6)^(-1)*(x-class_mu(29,1:5)))'*w35;
g36=1/((2*pi)^2*det(class_sigma(find(class_sigma(:,1)==36),...
2:6))^0.5)*exp((-0.5)*(x-class_mu(30,1:5))*class_sigma(...
(find(class_sigma(:,1)==36),2:6)^(-1)*(x-class_mu(30,1:5)))'*w36;
result=[g1,g2,g3,g4,g5,g6,g7,g8,g9,g10,g11,g12,g13,g14,g15...
,g22,g23,g24,g25,g26,g27,g28,g29,g30,g31,g32,g33,g34,g35,g36];
[,index]=max(result);
if index==1
    sum1=sum1+1;
elseif index==2
    sum2=sum2+1;
elseif index==3
    sum3=sum3+1;
elseif index==4
    sum4=sum4+1;
elseif index==5
    sum5=sum5+1;
elseif index==6
    sum6=sum6+1;
elseif index==7
    sum7=sum7+1;
elseif index==8
    sum8=sum8+1;
elseif index==9
    sum9=sum9+1;
elseif index==10
    sum10=sum10+1;
elseif index==11
    sum11=sum11+1;
elseif index==12
    sum12=sum12+1;
elseif index==13
    sum13=sum13+1;
elseif index==14
    sum14=sum14+1;
elseif index==15
    sum15=sum15+1;
elseif index==16
    sum22=sum22+1;
elseif index==17
    sum23=sum23+1;
elseif index==18
    sum24=sum24+1;
elseif index==19
    sum25=sum25+1;
elseif index==20
    sum26=sum26+1;
elseif index==21
    sum27=sum27+1;
elseif index==22
    sum28=sum28+1;
elseif index==23
    sum29=sum29+1;
elseif index==24
    sum30=sum30+1;
elseif index==25
    sum31=sum31+1;
elseif index==26
    sum32=sum32+1;
elseif index==27
    sum33=sum33+1;
elseif index==28
    sum34=sum34+1;
elseif index==29
    sum35=sum35+1;
elseif index==30
    sum36=sum36+1;
end

```

```

end
table=zeros(30,2);
table(1:15,1)=1:15;
table(16:30,1)=22:36;
table(1:30,2)=[sum1,sum2,sum3,sum4,sum5,sum6,sum7,sum8...
,sum9,sum10,sum11,sum12,sum13,sum14,sum15,...
sum22,sum23,sum24,sum25,sum26,sum27,sum28,sum29...
,sum30,sum31,sum32,sum33,sum34,sum35,sum36];

save('confusion_table_5_bayesian_pca.mat','table');

```