## **Appendix**

## **Matlab Source Code**

randomInit.m

```
function [pi_Init, mu_Init, cov_Init] = randomInit(dim, C)
    pi_Init = rand(C,1);
    pi_Init = pi_Init./sum(pi_Init);
    mu_Init = rand(C,dim)-1;
    cov_Init = rand(C,dim)+1;

%    cov_Init(cov_Init<0.0001) = 0.0001;
end</pre>
```

EMcalc.m

```
function [pi_fin,mu_fin,cov_fin] = EMcalc(dim,C,xi,pi_init,mu_init,cov_init,num)
% initialize for the first round iteration
pi = pi_init;
mu = mu_init;
cov = cov_init;
h = zeros(size(xi,1),C);
for i_iter = 1:1000
    for j = 1:C
        h(:,j) = mvnpdf(xi,mu(j,:),diag(cov(j,:)))*pi(j);
    end
    h = h./repmat(sum(h,2),1,C);
     save(['save_h_data/',num2str(num),'_iter_',num2str(i_iter),'.mat'],'h');
    sum_h = sum(h,1);
    pi_next = sum_h'/size(xi,1);
    for j = 1:C
        mu_next(j,:) = sum(repmat(h(:,j),1,dim).*xi,1)/sum_h(j);
        cov_next(j,:) = sum(repmat(h(:,j),1,dim).*(xi-
repmat(mu(j,:), size(xi,1),1)).^2,1)/sum_h(j);
        cov_next(cov_next<0.0001) = 0.0001;</pre>
    end
    pi = pi_next;
    mu = mu_next;
    cov = cov_next;
end
pi_fin = pi;
mu_fin = mu;
cov_fin = cov;
end
```

```
function cheetah_vec = cheetah_BDR(blocks,C,dim,mu,cov,pi,pri)
    cheetah_vec = 0;
    for i = 1:C
        cheetah_vec = cheetah_vec +
pi(i)*mvnpdf(blocks,repmat(mu(i,1:dim),size(blocks,1),1),diag(cov(i,1:dim)));
    end
    cheetah_vec = cheetah_vec*pri;
end
```

plotPoE.m

```
%% a)
figure('Name', 'PoE of Mixture Gaussian (C=8) with EM')
str_legend = [];
for i = 1:5
    for j = 1:5
        plot(dim,poe_1{i,j});
        xlabel('Dimension')
        xticks(dim)
        ylabel('PoE')
        str_legend = [str_legend, 'BG', num2str(i), '-FG', num2str(j)];
        hold on
    end
end
xticks(dim)
title('a)-PoE of Mixture Gaussian (C=8) with EM')
legend('BG_1 - FG_1','BG_1 - FG_2','BG_1 - FG_3','BG_1 - FG_4','BG_1 - FG_5',...
       'BG_2 - FG_1', 'BG_2 - FG_2', 'BG_2 - FG_3', 'BG_2 - FG_4', 'BG_2 - FG_5',...
       'BG_3 - FG_1', 'BG_3 - FG_2', 'BG_3 - FG_3', 'BG_3 - FG_4', 'BG_3 - FG_5',...
       'BG_4 - FG_1', 'BG_4 - FG_2', 'BG_4 - FG_3', 'BG_4 - FG_4', 'BG_4 - FG_5',...
       'BG_5 - FG_1', 'BG_5 - FG_2', 'BG_5 - FG_3', 'BG_5 - FG_4', 'BG_5 - FG_5');
grid()
%% b)
figure('Name', 'PoE of Mixture Gaussian (various C) with EM')
for i = 1:6
    plot(dim,poe_2(i,:))
    xlabel('Dimension')
    ylabel('PoE')
    hold on
legend('C = 1', 'C = 2', 'C = 4', 'C = 8', 'C = 16', 'C = 32');
xticks(dim)
grid()
title('b)-PoE of Mixture Gaussian (various C) with EM')
```

HW5.mat

```
%% Step1:initialization, calculate DCT and do the zigzag transformation
clc;clear;
% Once again we use the decomposition
% into 8 × 8 image blocks, compute the DCT of each block, and zig-zag scan.
```

```
zigzag = load('Zig-Zag Pattern.txt');
zigzag = reshape(zigzag, 1, []) + 1;
cheetah_img = imread('cheetah.bmp');
cheetah_dw = im2double(cheetah_img);
cheetah_mask = imread('cheetah_mask.bmp');
cheetah_maskdw = im2double(cheetah_mask);
%set a blank padding
% cheetah_pad = [cheetah_dw, zeros([size(cheetah_dw,1),7]);
zeros([7,size(cheetah_dw,2)+7])];
[img_row, img_col] = size(cheetah_dw);
% cheetah_blocks = zeros(img_row*img_col,64);
cheetah_blocks = zeros((img_row-7)*(img_col-7),64);
cnt = 1;
for col = 1:img\_col-7
    for row = 1:img_row-7
          window = cheetah_pad(row:row+7,col:col+7);
        window = cheetah_dw(row:row+7,col:col+7);
        cheetah_blocks(cnt,:) = reshape(dct2(window),[],64);
        cnt = cnt+1;
    end
cheetah_blocks = dozigzag(cheetah_blocks,zigzag);
clear cheetah_img cheetah_mask cnt window cheetah_pad zigzag row col
%% 1 - initialization
load('TrainingSamplesDCT_8_new.mat');
priBG =
size(TrainsampleDCT_BG,1)/(size(TrainsampleDCT_BG,1)+size(TrainsampleDCT_FG,1));
priFG = 1-priBG;
dim = [1,2,4,8,16,24,32,40,48,56,64];
times_1 = 5;
%% Step-1 BG
C1 = 8;
muBG = cell(times_1,size(C1,2));
covBG = cell(times_1, size(C1, 2));
piBG = cell(times_1, size(C1,2));
count = 1;
for dim_i = 64
    for time_i = 1:times_1
        % Initialize the BG's pre-requisites
        xi_BG = TrainsampleDCT_BG(:,1:dim_i);
        [pi_init_BG,mu_init_BG,cov_init_BG] = randomInit(dim_i,C1);
        [pi,mu,cov] =
EMcalc(dim_i,C1,xi_BG,pi_init_BG,mu_init_BG,cov_init_BG,1);
        muBG{time_i,count} = mu;
        covBG{time_i,count} = cov;
        piBG{time_i,count} = pi;
    end
    count = count + 1;
end
clear mu pi cov count dim_i xi_BG pi_init_BG mu_init_BG cov_init_BG time_i
%% Step-1 FG
muFG = cell(times_1, size(C1, 2));
covFG = cell(times_1, size(C1, 2));
```

```
piFG = cell(times_1,size(C1,2));
count = 1;
for dim_i = 64
    for time_i = 1:times_1
        % Initialize the FG's pre-requisites
        xi_FG = TrainsampleDCT_FG(:,1:dim_i);
        [pi_init_FG,mu_init_FG,cov_init_FG] = randomInit(dim_i,C1);
        [pi,mu,cov] =
EMcalc(dim_i,C1,xi_FG,pi_init_FG,mu_init_FG,cov_init_FG,2);
        muFG{time_i,count} = mu;
        covFG{time_i,count} = cov;
        piFG{time_i,count} = pi;
    end
    count = count + 1;
end
clear mu pi cov count dim_i xi_FG pi_init_FG mu_init_FG cov_init_FG time_i
poe_1 = cell(5);
for dim_i = 1:size(dim,2)
    test_set = cheetah_blocks(:,1:dim(dim_i));
    for i = 1:times_1
        Px BG =
cheetah_BDR(test_set,C1,dim(dim_i),muBG{i},covBG{i},piBG{i},priBG);
        for j = 1:times_1
            Px_FG =
cheetah_BDR(test_set,C1,dim(dim_i),muFG{j},covFG{j},piFG{j},priFG);
            cheetah_vec = Px_FG./Px_BG;
            cheetah_vec(cheetah_vec>1) = 1;
            cheetah_vec(cheetah_vec\sim=1) = 0;
            cheetah_res = reshape(cheetah_vec,img_row-7,img_col-7);
            cheetah_res_pad = [cheetah_res,zeros([size(cheetah_res,1),7]);
zeros([7,size(cheetah_res,2)+7])];
            poe_1{i,j}(dim_i) = sum(abs(cheetah_maskdw-
cheetah_res_pad), 'all')/img_row/img_col;
        end
    end
end
clear i j Px_BG Px_FG cheetah_vec
%%
figure
imagesc(cheetah_res_pad)
colormap('gray')
%% Step-2 BG
times_2 = 1;
C2 = [1,2,4,8,16,32];
muBG = cell(times_2, size(C2,2));
covBG = cell(times_2, size(C2,2));
piBG = cell(times_2,size(C2,2));
count = 1;
for dim_i = 64
    for time_i = 1:times_2
        for c_i = c_2
            % Initialize the BG's pre-requisites
            xi_BG = TrainsampleDCT_BG(:,1:dim_i);
```

```
[pi_init_BG,mu_init_BG,cov_init_BG] = randomInit(dim_i,c_i);
            [pi,mu,cov] =
EMcalc(dim_i,c_i,xi_BG,pi_init_BG,mu_init_BG,cov_init_BG,1);
            muBG{time_i,count} = mu;
            covBG{time_i,count} = cov;
            piBG{time_i,count} = pi;
            count = count + 1;
        end
    end
end
clear mu pi cov count dim_i xi_BG pi_init_BG mu_init_BG cov_init_BG time_i
%% Step-2 FG
muFG = cell(times_2, size(C2,2));
covFG = cell(times_2, size(C2,2));
piFG = cell(times_2, size(C2,2));
count = 1;
for dim_i = 64
    for time_i = 1:times_2
        for c_i = c_2
            % Initialize the FG's pre-requisites
            xi_FG = TrainsampleDCT_FG(:,1:dim_i);
            [pi_init_FG,mu_init_FG,cov_init_FG] = randomInit(dim_i,c_i);
            [pi,mu,cov] =
EMcalc(dim_i,c_i,xi_FG,pi_init_FG,mu_init_FG,cov_init_FG,2);
            muFG{time_i,count} = mu;
            covFG{time_i,count} = cov;
            piFG{time_i,count} = pi;
            count = count + 1;
        end
    end
end
clear mu pi cov count dim_i xi_BG pi_init_BG mu_init_BG cov_init_BG time_i
%%
poe_2 = zeros(size(C2,2),size(dim,2));
for dim_i = 1:size(dim,2)
    test_set = cheetah_blocks(:,1:dim(dim_i));
    for c_i = 1:size(c_{2,2})
        for i = 1:times_2
            Px_BG =
cheetah_BDR(test_set,C2(c_i),dim(dim_i),muBG{c_i},covBG{c_i},piBG{c_i},priBG);
            Px_FG =
cheetah_BDR(test_set,C2(c_i),dim(dim_i),muFG{c_i},covFG{c_i},piFG{c_i},priFG);
            cheetah_vec = Px_FG./Px_BG;
            cheetah_vec(cheetah_vec>1) = 1;
            cheetah_vec(cheetah_vec\sim=1) = 0;
%
                  cheetah_res = reshape(cheetah_vec,img_row,img_col);
            cheetah_res = reshape(cheetah_vec,img_row-7,img_col-7);
            cheetah_res_pad = [cheetah_res,zeros([size(cheetah_res,1),7]);
zeros([7,size(cheetah_res,2)+7])];
            poe_2(c_i,dim_i) = sum(abs(cheetah_maskdw-
cheetah_res_pad), 'all')/img_row/img_col;
        end
    end
end
```

```
clear i j Px_BG Px_FG cheetah_vec

%%
figure
imagesc(cheetah_res_pad)
colormap('gray')

%%
figure
plot(dim,poe_2(1,:))

%%
format long
t = datetime('now');
save(['poe_save/poe_1_',datestr(now,30),'.mat'],'poe_1');
save(['poe_save/poe_2_',datestr(now,30),'.mat'],'poe_2');
```