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## Load and process normal data and testing data

```
tic

close;
clear all;
happen=160;
d00=importdata('d00.dat');
d01=importdata('d01_te.dat');
X=d00';
XT=d01;
[X,mean,std]=zscore(X);
XT=(XT-ones(size(XT,1),1)*mean)./(ones(size(XT,1),1)*std);
```

# **Augmented Matrices for training and testing**

```
for i = 17 : size(X,1)
    tdX\{i\} = X(i-16:i,:);
end
for i =1 : 16
    tdX{i} = tdX{i+16};
end
for i = 17 : size(XT,1)
    tdXT\{i\} = XT(i-16:i,:);
end
for i =1 : 16
    tdXT{i} = tdXT{i+16};
summ = 0;
for j = 1 : size(X,1)
TempX = tdX{j};
MatXX(:,:,j) = TempX;
summ = summ + TempX;
```

```
end
Mm = summ/size(X,1);
for i =1 : length(tdX)
    tdX{i} = tdX{i}-Mm;
end
for i = 1 : length(tdXT)
    tdXT\{i\} = tdXT\{i\}-Mm;
end
for j = 1 : size(X,1)
    TempX = tdX{j};
    MatXX(:,:,j) = TempX;
    VecXX(j,:) = reshape(TempX,1,52*17);
end
Dis = pdist2(VecXX, VecXX);
options = [];
option.t = 1/size(X,1)^2 * sum(sum(Dis));
options.NeighborMode = 'KNN';
options.k = 20;
options.WeightMode = 'HeatKernel';
```

## Compute the similarity

```
W = myConstructW(VecXX,20,1);
tempD = sum(W,2);
D_sqrt = (diag(1./sqrt(tempD)));
```

### Perform 2D graph embedding

```
end
 [V2,D2] = eig(St2);
Q = PL;
 % Compute T2 and SPE
 for i=1:size(X,1)
                                  t2(i)=norm(Q'*(tdX{i})*P*pinv(D)*P'*(tdX{i})'*Q,'fro');
                                  t2(i)=norm(P'*(tdX{i}))'*Q*pinv(D2)*Q'*(tdX{i})*P,'fro');
                                  SPE(i) = norm( (tdX{i}-Q*Q'*tdX{i}*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i}*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i})*P*P')*(tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*tdX{i}-Q*Q'*td
Q*Q'*tdX{i}*P*P')','fro');
 end
 % Compute T2 and SPE of the testing samples
 for i=1:size(XT,1)
                                  XTt2(i)=norm(Q'*(tdXT{i})*P*pinv(D)*P'*(tdXT{i})'*Q,'fro');
                                 XTt2(i)=norm(P'*(tdXT{i}))'*Q*pinv(D2)*Q'*(tdXT{i})*P,'fro');
                                 XTSPE(i) = norm( (tdXT{i}-Q*Q'*tdXT{i}*P*P')*(tdXT{i}-Q*Q'*tdXT{i})*P*P')*(tdXT{i}-Q*Q'*tdXT{i}*P*P')*(tdXT{i}-Q*Q'*tdXT{i}*P*P')*(tdXT{i}-Q*Q'*tdXT{i}*P*P')*(tdXT{i}-Q*Q'*tdXT{i}*P*P')*(tdXT{i}-Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q'*tdXT{i}+Q*Q
Q*Q'*tdXT{i}*P*P')','fro');
 end
```

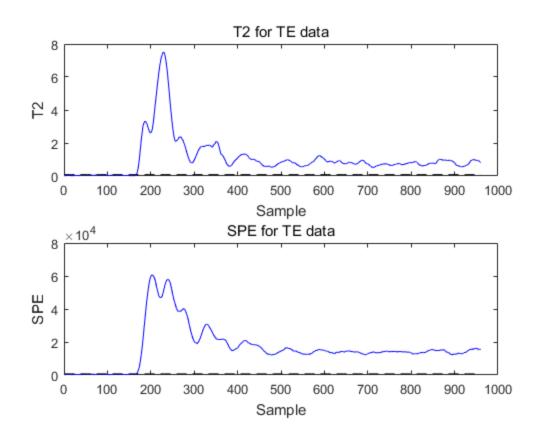
#### **Compute Control limit of SPE and T2**

```
[bandwidth,density,xmesh,cdf]=kde(t2);
r=0.99;
for i=1:size(cdf,1),
    if cdf(i,1)>=r,
        break;
    end;
end;
T2limit=xmesh(i);
[bandwidth, density, xmesh, cdf]=kde(SPE);
r=0.99;
for i=1:size(cdf,1),
    if cdf(i,1)>=r,
        break;
    end;
end;
SPElimit= xmesh(i);
```

#### Plot the results

```
figure(11)
subplot(2,1,1);
plot(1:happen,XTt2(1:happen),'b',happen+1:size(XTt2,2),XTt2(happen
+1:end),'b');
hold on;
TS=T2limit*ones(size(XT,1),1);
plot(TS,'k--');
title('T2 for TE data');
```

```
xlabel('Sample');
ylabel('T2');
hold off;
subplot(2,1,2);
plot(1:happen,XTSPE(1:happen), 'b', happen+1:size(XTSPE,2),XTSPE(happen
+1:end), 'b');
hold on;
S=SPElimit*ones(size(XT,1),1);
plot(S,'k--');
title('SPE for TE data');
xlabel('Sample');
ylabel('SPE');
hold off;
%False alarm rate
falseT2=0;
falseSPE=0;
for wi=1:happen
    if XTt2(wi)>T2limit
        falseT2=falseT2+1;
    end
    falserate_pca_T2=100*falseT2/happen;
    if XTSPE(wi)>SPElimit
        falseSPE=falseSPE+1;
    end
    falserate_pca_SPE=100*falseSPE/happen;
end
```



#### Miss alarm rate and False alarm rate

```
missT2=0;
missSPE=0;
for wi=happen+1:size(XTt2,2)
    if XTt2(wi)<T2limit</pre>
        missT2=missT2+1;
    end
    if XTSPE(wi)<SPElimit</pre>
        missSPE=missSPE+1;
    end
end
missrate_pca_T2=100*missT2/(size(XTt2,2)-happen);
missrate_pca_SPE=100*missSPE/(size(XTt2,2)-happen);
 disp('----False alarm rate----');
falserate_pca=[falserate_pca_T2 falserate_pca_SPE]
 disp('---Miss alarm rate----');
missrate_pca=[missrate_pca_T2 missrate_pca_SPE]
% toc
----False alarm rate----
falserate_pca =
     0
           0
----Miss alarm rate----
missrate pca =
    0.7500
             0.7500
```

#### **Detection time**

```
i1=happen+1;
while i1<=size(X,1)</pre>
   T2_mw(i1,:)=XTt2(1,i1:(i1+5))-T2limit*ones(1,6);
   flag1=0;
   for j1=1:6
       if T2_mw(i1,j1)<0
           flag1=1;
           i1=i1+j1;
           break;
       end
   end
   if flag1==0
       detection_time_T2=i1;
       break;
   end
end
i2=happen+1;
while i2<=size(X,1)
```

```
SPE_mw(i2,:) = XTSPE(1,i2:(i2+5))-SPElimit*ones(1,6);
    flag2=0;
    for j2=1:6
       if SPE_mw(i2,j2)<0</pre>
           flag2=1;
           i2=i2+j2;
           break;
       end
   end
   if flag2==0
       detection_time_SPE=i2;
       break;
   end
end
detection_time_T2
detection_time_SPE
runtime=toc
detection_time_T2 =
   167
detection_time_SPE =
   167
runtime =
  103.5430
```

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