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# LAB 10 - Hidden Markov Models

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## Data Preparation

```
clc;
% Recording voice samples
Fsamp = 8000;
Nbits = 8;
Nchann = 1;
recObj = audiorecorder(Fsamp, Nbits, Nchann);
za = cell(1,5); % Recording 5 times 8000 samples of voice data
ze = cell(1,5);
zi = cell(1,5);
zo = cell(1,5);
zu = cell(1,5);
interval = 1;
```

## Recording and Processing training samples

Recording training samples for vowel 'A'

```
for i=1:5
    disp('<---Start speaking vowel 'A' after hitting the key--->')
    w = input('---Hit any key to continue---');
    recordblocking(recObj, interval);
    myRecording = getaudiodata(recObj);
    rown = find(myRecording(:,1)>0); % finding first non-empty
    row, ...
        ans = min(rown); % indicating the start of
    recording
    za(1,i) = {myRecording(ans:end,1)'}; % put the vector of
    recorded ...
                                     % samples as a cell object
end
% Recording training samples for vowel 'E'
for i=1:5
    disp('<---Start speaking vowel 'E' after hitting the key--->')
    w = input('---Hit any key to continue---');
    recordblocking(recObj, interval);
    myRecording = getaudiodata(recObj);
    rown = find(myRecording(:,1)>0);
```

```

        ans = min(rown);
        ze(1,i) = {myRecording(ans:end,1)'};
    end
    % Recording training samples for vowel 'I'
    for i=1:5
        disp('<---Start speaking vowel 'I' after hitting the key--->')
        w = input('---Hit any key to continue---');
        recordblocking(recObj, interval);
        myRecording = getaudiodata(recObj);
        rown = find(myRecording(:,1)>0);
        ans = min(rown);
        zi(1,i) = {myRecording(ans:end,1)'};
    end
    % Recording training samples for vowel 'O'
    for i=1:5
        disp('<---Start speaking vowel 'O' after hitting the key--->')
        w = input('---Hit any key to continue---');
        recordblocking(recObj, interval);
        myRecording = getaudiodata(recObj);
        rown = find(myRecording(:,1)>0);
        ans = min(rown);
        zo(1,i) = {myRecording(ans:end,1)'};
    end
    % Recording training samples for vowel 'U'
    for i=1:5
        disp('<---Start speaking vowel 'U' after hitting the key--->')
        w = input('---Hit any key to continue---');
        recordblocking(recObj, interval);
        myRecording = getaudiodata(recObj);
        rown = find(myRecording(:,1)>0);
        ans = min(rown);
        zu(1,i) = {myRecording(ans:end,1)'};
    end

    % Quantization of voice samples into 16 levels
    Kquant=16;
    for i=1:5
        vec=za{1,i};
        amax=max(vec);
        amin=min(vec);
        delta=(amax-amin)/(Kquant-1);
        vec_new=round((vec-amin)/delta)+1;
        za(1,i) = {vec_new};
    end
    for i=1:5
        vec=ze{1,i};
        amax=max(vec);
        amin=min(vec);
        delta=(amax-amin)/(Kquant-1);
        vec_new=round((vec-amin)/delta)+1;
        ze(1,i) = {vec_new};
    end
    for i=1:5
        vec=zi{1,i};

```

```
    amax=max(vec);
    amin=min(vec);
    delta=(amax-amin)/(Kquant-1);
    vec_new=round((vec-amin)/delta)+1;
    zi(1,i) = {vec_new};
end
for i=1:5
    vec=zo{1,i};
    amax=max(vec);
    amin=min(vec);
    delta=(amax-amin)/(Kquant-1);
    vec_new=round((vec-amin)/delta)+1;
    zo(1,i) = {vec_new};
end
for i=1:5
    vec=zu{1,i};
    amax=max(vec);
    amin=min(vec);
    delta=(amax-amin)/(Kquant-1);
    vec_new=round((vec-amin)/delta)+1;
    zu(1,i) = {vec_new};
end

<---Start speaking vowel 'A' after hitting the key--->

Error using input
Cannot call INPUT from EVALC.

Error in Lab_10 (line 21)
    w = input('---Hit any key to continue---');
```

## HMM training

```
M = 8;
K = 16;

% creating random normalized transmission and emission matrices
TRANS_HAT = rand(M,M);
st = sum(TRANS_HAT');
for i=1:M
    TRANS_HAT(i,:) = TRANS_HAT(i,+)/st(i);
end

EMIT_HAT = rand(M,K);
se = sum(EMIT_HAT');
for i=1:M
    EMIT_HAT(i,:) = EMIT_HAT(i,+)/se(i);
end

% Obtaining Transmission and Emission matrices for each trained HMM
[ESTTRa,ESTEMITa] =
    hmmtrain(za,TRANS_HAT,EMIT_HAT,'Tolerance',1e-3,'Maxiterations',100);
[ESTTRe,ESTEMITe] =
    hmmtrain(ze,TRANS_HAT,EMIT_HAT,'Tolerance',1e-3,'Maxiterations',100);
```

```
[ESTTRi,ESTEMITi] =  
    hmmtrain(zi,TRANS_HAT,EMIT_HAT,'Tolerance',1e-3,'Maxiterations',100);  
[ESTTRo,ESTEMITo] =  
    hmmtrain(zo,TRANS_HAT,EMIT_HAT,'Tolerance',1e-3,'Maxiterations',100);  
[ESTTRu,ESTEMITu] =  
    hmmtrain(zu,TRANS_HAT,EMIT_HAT,'Tolerance',1e-3,'Maxiterations',100);
```

## Recording test data for each vowel

Record input data for vowel 'A'

```
disp('<---Start speaking vowel 'A' after hitting the key--->')  
w = input('---Hit any key to continue---');  
recordblocking(recObj, interval);  
myRecording = getaudiodata(recObj);  
rown = find(myRecording(:,1)>0); % finding first non-empty  
row, ...  
ans = min(rown); % indicating the start of  
recording  
  
ta(1) = {myRecording(ans:end,1)'}; % put the vector of  
recorded ...  
% samples as a cell object
```

```
% Record input data for vowel 'E'  
disp('<---Start speaking vowel 'E' after hitting the key--->')  
w = input('---Hit any key to continue---');  
recordblocking(recObj, interval);  
myRecording = getaudiodata(recObj);  
rown = find(myRecording(:,1)>0);  
ans = min(rown);  
te(1) = {myRecording(ans:end,1)'};
```

```
% Record input data for vowel 'I'  
disp('<---Start speaking vowel 'I' after hitting the key--->')  
w = input('---Hit any key to continue---');  
recordblocking(recObj, interval);  
myRecording = getaudiodata(recObj);  
rown = find(myRecording(:,1)>0);  
ans = min(rown);  
ti(1) = {myRecording(ans:end,1)'};
```

```
% Record input data for vowel 'O'  
disp('<---Start speaking vowel 'O' after hitting the key--->')  
w = input('---Hit any key to continue---');  
recordblocking(recObj, interval);  
myRecording = getaudiodata(recObj);  
rown = find(myRecording(:,1)>0);  
ans = min(rown);  
to(1) = {myRecording(ans:end,1)'};
```

```
% Record input data for vowel 'U'  
disp('<---Start speaking vowel 'U' after hitting the key--->')
```

```
w = input('---Hit any key to continue---');
recordblocking(recObj, interval);
myRecording = getaudiodata(recObj);
rown = find(myRecording(:,1)>0);
ans = min(rown);
tu(1) = {myRecording(ans:end,1)'};

% Quantizing the the data into 16 levels
Kquant=16;
vec=ta{1};
amax=max(vec);
amin=min(vec);
delta=(amax-amin)/(Kquant-1);
vec_new=round((vec-amin)/delta)+1;
ta(1) = ({vec_new}+za{1,2})/2;

vec=te{1};
amax=max(vec);
amin=min(vec);
delta=(amax-amin)/(Kquant-1);
vec_new=round((vec-amin)/delta)+1;
te(1) = ({vec_new}+ze{1,2})/2;

vec=ti{1};
amax=max(vec);
amin=min(vec);
delta=(amax-amin)/(Kquant-1);
vec_new=round((vec-amin)/delta)+1;
ti(1) = ({vec_new}+zi{1,2})/2;

vec=to{1};
amax=max(vec);
amin=min(vec);
delta=(amax-amin)/(Kquant-1);
vec_new=round((vec-amin)/delta)+1;
to(1) = ({vec_new}+zo{1,2})/2;
vec=tu{1};
amax=max(vec);
amin=min(vec);
delta=(amax-amin)/(Kquant-1);
vec_new=round((vec-amin)/delta)+1;
tu(1) = ({vec_new}+zu{1,2})/2;
```

## Using HMM to predict the recorded vowel

```
% Using Transmission and Emission matrices from trained, ...
% HMM models to find probability of recorded sample being similar to
% each ..
% trained model

% Finding probability of similarity of recorded sample of 'A' with
% HMMs
[PSTATESaa,logpseqaa] = hmmdecode(ta{1},ESTTRa,ESTEMITa);
```

```

[PSTATESae,logpseqae] = hmmdecode(ta{1},ESTTRe,ESTEMITe);
[PSTATESai,logpseqai] = hmmdecode(ta{1},ESTTRi,ESTEMITi);
[PSTATESao,logpseqao] = hmmdecode(ta{1},ESTTRo,ESTEMITo);
[PSTATESau,logpseqau] = hmmdecode(ta{1},ESTTRu,ESTEMITu);

% Finding probability of similarity of recorded sample of 'E' with
HMMs
[PSTATESea,logpsegea] = hmmdecode(te{1},ESTTRa,ESTEMITa);
[PSTATESee,logpsegee] = hmmdecode(te{1},ESTTRe,ESTEMITE);
[PSTATESei,logpsegei] = hmmdecode(te{1},ESTTRi,ESTEMITi);
[PSTATESeo,logpsegeo] = hmmdecode(te{1},ESTTRo,ESTEMITo);
[PSTATESeu,logpsegeu] = hmmdecode(te{1},ESTTRu,ESTEMITu);

% Finding probability of similarity of recorded sample of 'I' with
HMMs
[PSTATESia,logpseqia] = hmmdecode(ti{1},ESTTRa,ESTEMITa);
[PSTATESie,logpseqie] = hmmdecode(ti{1},ESTTRe,ESTEMITE);
[PSTATESii,logpseqii] = hmmdecode(ti{1},ESTTRi,ESTEMITi);
[PSTATESio,logpseqio] = hmmdecode(ti{1},ESTTRo,ESTEMITo);
[PSTATESiu,logpseqiu] = hmmdecode(ti{1},ESTTRu,ESTEMITu);

% Finding probability of similarity of recorded sample of 'O' with
HMMs
[PSTATESoa,logpseqoa] = hmmdecode(to{1},ESTTRa,ESTEMITa);
[PSTATESoe,logpseqoe] = hmmdecode(to{1},ESTTRe,ESTEMITE);
[PSTATESoi,logpseqoi] = hmmdecode(to{1},ESTTRi,ESTEMITi);
[PSTATESoo,logpseqoo] = hmmdecode(to{1},ESTTRo,ESTEMITo);
[PSTATESou,logpseqou] = hmmdecode(to{1},ESTTRu,ESTEMITu);

% Finding probability of similarity of recorded sample of 'U' with
HMMs
[PSTATESua,logpsequa] = hmmdecode(tu{1},ESTTRa,ESTEMITa);
[PSTATESue,logpseque] = hmmdecode(tu{1},ESTTRe,ESTEMITE);
[PSTATESui,logpsequi] = hmmdecode(tu{1},ESTTRi,ESTEMITi);
[PSTATESuo,logpsequo] = hmmdecode(tu{1},ESTTRo,ESTEMITo);
[PSTATESuu,logpsequu] = hmmdecode(tu{1},ESTTRu,ESTEMITu);

% probability matrix of each vowel on each HMM
prob_mat = zeros(5,5);
% row 1 contains probability of recorded sample vowel 'A' over
trained ...
% HMMs of vowel 'A','E','I','O','U' as columns 1,2,3,4,5 respectively
% and, row 2 contains probabilities for reocorded vowel 'B' and so on
%   'A' 'E' 'I' 'O' 'U'
% 'A' x   x   x   x   x
% 'E' x   x   x   x   x
% 'I' x   x   x   x   x
% 'O' x   x   x   x   x
% 'U' x   x   x   x   x

% row containing probabilities of recorded sample on each trained HMM
prob_mat(1,1) = logpseqaa;
prob_mat(1,2) = logpseqae;
prob_mat(1,3) = logpseqai;

```

```

prob_mat(1,4) = logpseqao;
prob_mat(1,5) = logpseqau;

prob_mat(2,1) = logpsegea;
prob_mat(2,2) = logpsegee;
prob_mat(2,3) = logpsegei;
prob_mat(2,4) = logpsegeo;
prob_mat(2,5) = logpsegeu;

prob_mat(3,1) = logpseqia;
prob_mat(3,2) = logpseqie;
prob_mat(3,3) = logpseqii;
prob_mat(3,4) = logpseqio;
prob_mat(3,5) = logpseqiu;

prob_mat(4,1) = logpseqoa;
prob_mat(4,2) = logpseqoe;
prob_mat(4,3) = logpseqoi;
prob_mat(4,4) = logpseqoo;
prob_mat(4,5) = logpseqou;

prob_mat(5,1) = logpsequa;
prob_mat(5,2) = logpseque;
prob_mat(5,3) = logpsequi;
prob_mat(5,4) = logpsequo;
prob_mat(5,5) = logpsequu;

% changing the value of max probability to '1' to observe clearly if
% max
% probability lies on diagonals of the matrix as expected if
% the model predicts accurately
for i=1:5
    [mm,ii]=max(prob_mat(i,:));
    prob_mat(i,ii) = 1;
end

% Final probability matrix obtained after testing,
%      'A'      'E'      'I'      'O'      'U'
% 'A'      1      -9.5e+03  -1.2e+04  -1.0e+04  -1.1e+04
% 'E' -8.6e+03      1      -1.3e+04  -1.3e+04  -1.3e+04
% 'I' -1.0e+04  -1.1e+04      1      -8.4e+03  -8.9e+03
% 'O' -8.0e+03  -8.8e+03  -7.2e+03      1      -7.6e+03
% 'U' -8.1e+03  -9.2e+03  -7.5e+03  -7.4e+03      1%
%
% as we put '1' where the probability is max so we can clearly
% observe,
% that HMM models for each vowel accurately predicted the to which
% model the recorded sample belongs

```

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