

# Vikram Voleti

## [09EE3501]

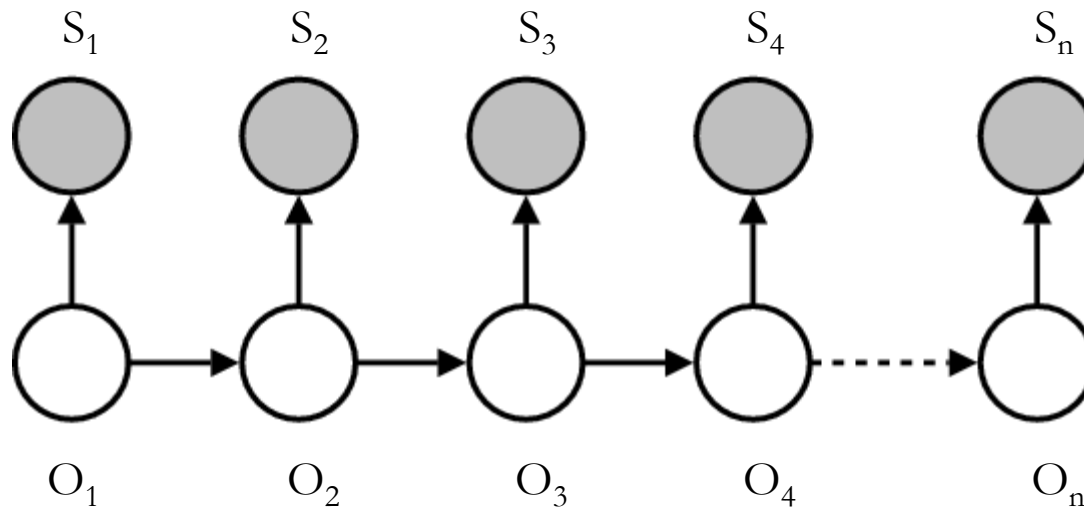
Summer 2012  
Internship Report

# MATLAB Codes

Original, Optimised, Efficient

- Hidden Markov Models
  - Forward Algorithm
  - Backward Algorithm
  - Baum-Welch Algorithm
  - Viterbi Algorithm
- Finger Tip Gesture Recognition

# Hidden Markov Models



- **Pi** : Nx1 matrix : Vector of initial probabilities of states,
- **a** : NxN matrix : Probability of transition from state  $S_i$  to state  $S_j$ ,
- **b** : NxM matrix : Probability of observing  $V_k$  for state  $S_i$ ,
- **Ob** : Mx1 matrix : Vector of all possible observations,
- **O** : EGxT matrix : Matrix of EG no. of 1xT dimensional observation sets,
- **Alpha** : NxT matrix;  $\text{Alpha}(i,t)$  = Probability of observing partial observation sequence from start to time  $t$ , i.e.  $O_1, O_2, \dots, O_t$ , and being in state  $S_i$ , at time  $t$ ,
- **Betaa** : NxM matrix;  $\text{Betaa}(i, \text{find}(\text{Ob} == \text{O}(\text{eg}, t), 1))$  = Probability of partial observation sequence from  $t+1$  to end, i.e.  $O_{t+1}, \dots, O_T$ , given the state at time  $t$  was  $S_i$ .

# Forward Algorithm

$$[\text{Alpha}, c, P] = \mathbf{ForwardAlgo}(P_i, a, b, Ob, O)$$

- $\text{Alpha}(i, t)$  is the probability of observing partial observation sequence from start to time  $t$ , i.e.,  $O_1, O_2, \dots, O_t$ , and being in state  $S_i$  at time  $t$
- $c$  is a  $T \times 1$  matrix,  $c(t)$  = Probability of the partial observation sequence till time  $t$ , and
- $P$  is an  $N \times 1$  matrix,  $P(n)$  = Probability of being in state  $S_n$  at the end time  $T$ .

*"A Tutorial on Hidden Markov models" by Lawrence R. Rabiner*

# Backward Algorithm

$\text{Beta}_i = \text{BackwardAlgo}(\text{Pi}, a, b, \text{Ob}, 0)$

- $\text{Beta}_i(i, \text{find}(\text{Ob} == 0(\text{eg}, t), 1))$  is the probability of observing the partial observation sequence from time  $t+1$  to end, i.e.  $O_{t+1}, \dots, O_T$ , given the state at time  $t$  was  $S_i$

# Baum-Welch Algorithm

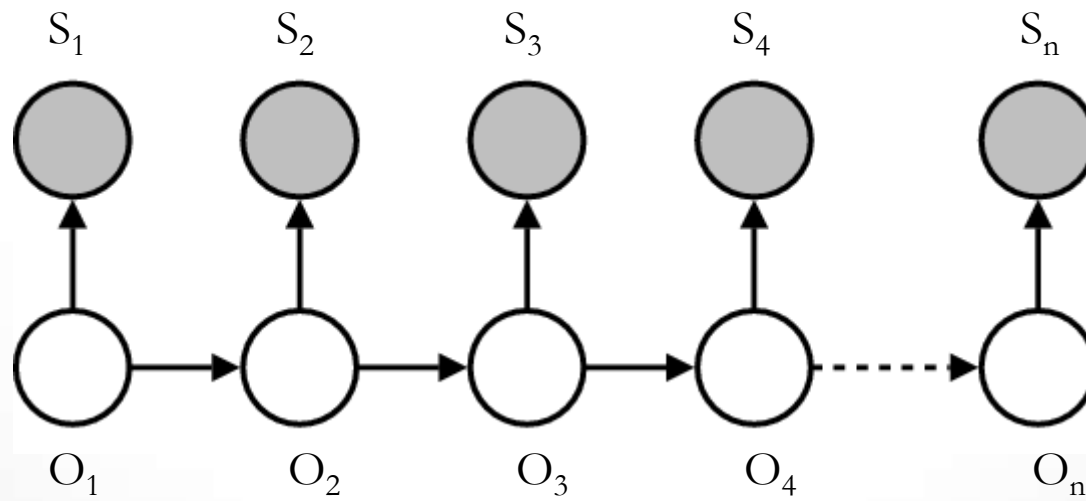
```
[PiNew, aNew, bNew, AlphaNew, BetaNew, logProb, lP]  
= BaumWelsh(Pi, a, b, Ob, O, Alpha, Betaa, iters,  
              maxIters, oldLogProb, lP);
```

- Calculates new values of  $P_i$ ,  $a$  and  $b$ .
- Recursion
- Employs Forward and Backward Algorithms

# Viterbi Algorithm

$$Q = \mathbf{ViterbiAlgo}(Pi, a, b, Ob, O)$$

- Determines most probable State Sequence  $Q$



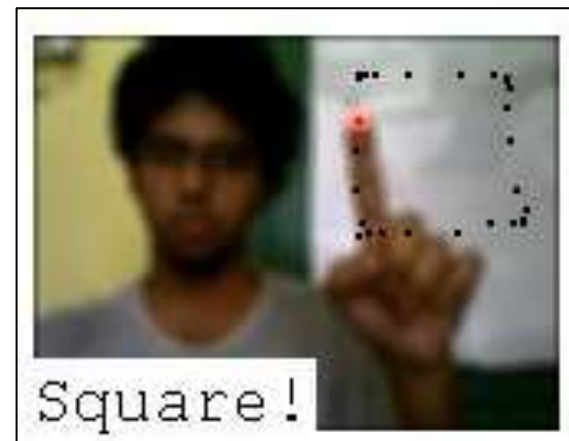


# Finger-Tip Gesture Recognition

- Finger-Tip Recognition
  - Skin-pixel Segmentation
  - First pixel from top
- Finger-Tip Tracking
  - Store all finger-tip coordinates
- Gesture Recognition using HMM's
  - Use Viterbi Algorithm to determine most probable state sequence



# Finger-Tip Gesture Recognition



# Finger-Tip Gesture Recognition

- HMM 1: To determine the state among:

**Right, Down, Left, Up, DR, DL, UL, UR**

- |                |                                           |                            |                            |
|----------------|-------------------------------------------|----------------------------|----------------------------|
| • $\Pi = [.4;$ | • $a = [.60 .25 .01 .01 .10 .01 .01 .01;$ | • $b(:,1) = [.10 .00 .90;$ | • $b(:,2) = [.34 .33 .33;$ |
| $.03;$         | $.01 .60 .25 .01 .10 .01 .01 .01;$        | $.34 .33 .33;$             | $.10 .90 .00;$             |
| $.03;$         | $.01 .01 .65 .15 .01 .01 .01 .15;$        | $.10 .90 .00;$             | $.34 .33 .33;$             |
| $.04;$         | $.01 .01 .01 .93 .01 .01 .01 .01;$        | $.34 .33 .33;$             | $.10 .00 .90;$             |
| $.4;$          | $.01 .01 .15 .01 .65 .15 .01 .01;$        | $.10 .00 .90;$             | $.10 .90 .00;$             |
| $.03;$         | $.01 .05 .05 .01 .01 .0 .6 .25 .01;$      | $.10 .90 .00;$             | $.10 .90 .00;$             |
| $.03;$         | $.01 .01 .055 .055 .01 .01 .60 .25;$      | $.10 .90 .00;$             | $.10 .00 .90;$             |
| $.04];$        | $.01 .01 .01 .01 .01 .01 .01 .93];$       | $.10 .00 .90];$            | $.10 .00 .90];$            |
|                |                                           | % for x coordinates        | % for y coordinates        |

- HMM 2: To determine the state among:

**Triangle, Square, Diamond**

- |                 |                       |                                           |
|-----------------|-----------------------|-------------------------------------------|
| • $\Pi = [.34;$ | • $A = [.98 .01 .01;$ | • $B = [.09 .04 .25 .04 .25 .04 .04 .25;$ |
| $.33;$          | $.01 .98 .01;$        | $.22 .22 .22 .22 .03 .03 .03 .03;$        |
| $.33];$         | $.01 .01 .98];$       | $.03 .03 .03 .03 .22 .22 .22 .22];$       |

# Finger-Tip Gesture Recognition



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Thank You.