

## Recitation 9

10-6-2011

Last Time:

~ Encoding CC's using various methods.

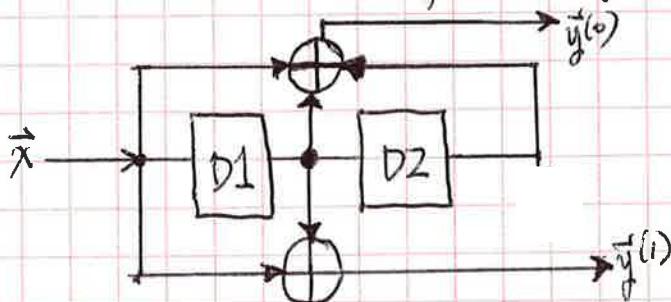
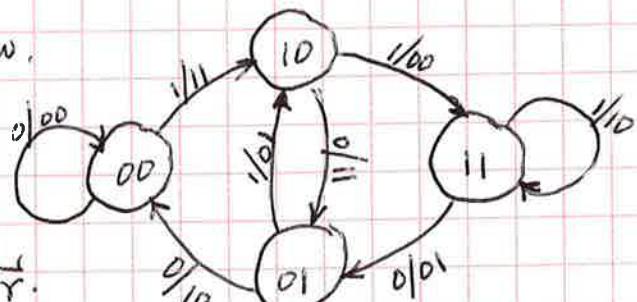
- state table, state diagram, generator sequence & D-transform, etc.
- (3) - Office hrs by Appt.  
(please send topics ahead of time)

Today:

Viterbi Decoding of CC's.

Example 1:

- (\* Consider the convolutional encoder defined by  $\vec{g}^{(0)} = (110)$  and  $\vec{g}^{(1)} = (110)$  shown below.

The corresponding state diagram is as below.

We can construct a trellis diagram, very useful in decoding a received vector  $\vec{r}$ .

Trellis: ~ extension of state diagram with explicit time passage |

Observations: (1) As with state diagram, trellis has  $2^m = 2^{K-1}$  states; for m-memory or K constraint length encoder.

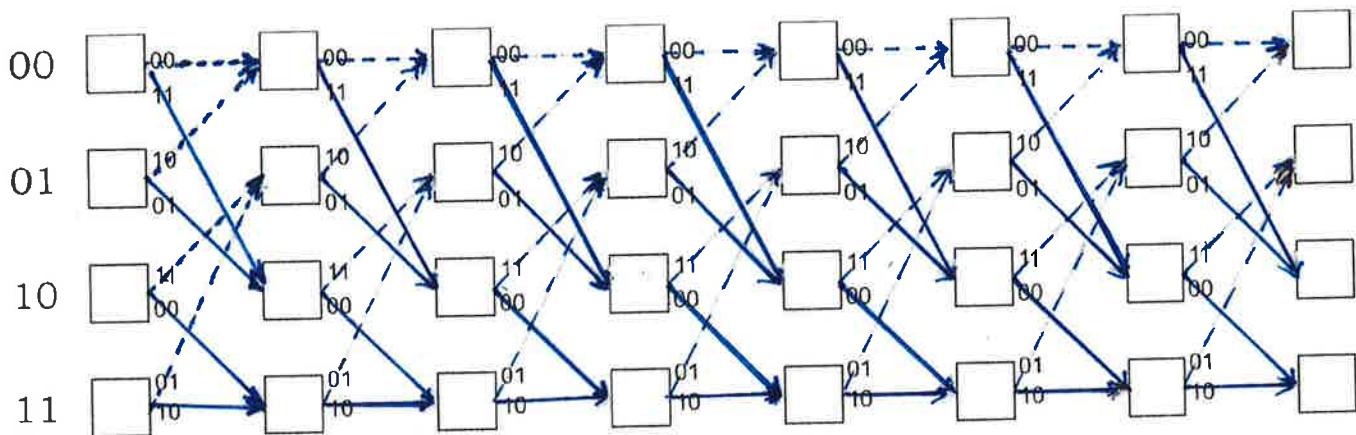
(2) For  $(n, k)$  binary CC, each node has  $2^k$  branches leaving and  $2^k$  branches entering

(so for our rate- $\frac{1}{2}$  codes,  $2^1 = 2$  branches leave and enter each node).

(3) We'll assume - that encoder starts at zero-state (state  $s_0$ )  
- that encoder is time-invariant, so  $\vec{y}$  is constant  
- that noise is uncorrelated from stage-to-stage.

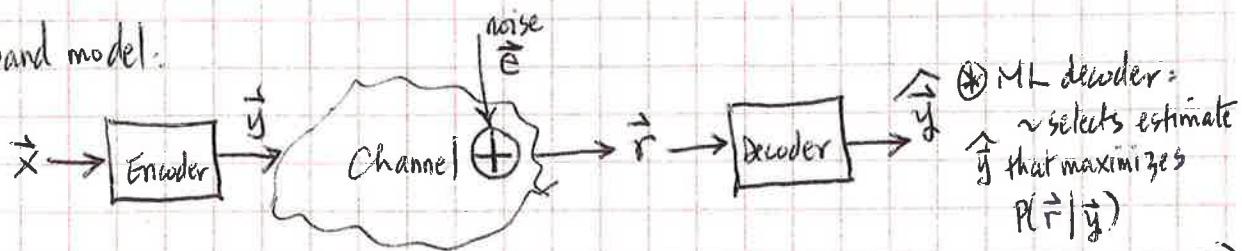
- ④ After all bits of input vector  $\vec{x}$  entered, need  $m$ -state transitions to return encoder to all-zero state  $s_0$ . Thus, given input sequence length  $k$ , trellis must have  $k+m$  stages, starting and stopping at  $s_0$ .
- ⑤ There are  $2^k$  distinct paths through trellis, each corresponding to a length  $n(k+m)$  possible codeword  
(We'll see how Viterbi addresses this issue.)

Below is the trellis diagram for the encoder in our example: (copied from lecture notes)



### The Decoding Problem:

Recall our baseband model:



Naive ML decoder: compares  $\vec{r}$  with  $2^k$  possible  $k$ -bit sequences (eg. for 16-bit  $\vec{r}$ , need 64K compares)

Viterbi decoder: Need not consider all  $2^k$  possible paths in trellis; at any stage, only  $2^m$  paths need be retained

Assumes: channel is memoryless (ie. errors uncorrelated from stage-to-stage)

Thm: The path selected by the Viterbi decoder is the ML path! O(linear) vs. O(exponential)

## The Viterbi Algorithm:

Define :  $s_{j,t}$  ~ node  $S_j$  at time  $t$ .

$\text{PM}(s_{j,t})$  ~ path metric of node  $S_j$  at time  $t$ .

VA:

1. Initialize  $t = 0$

Set  $\text{PM}(s_{0,0}) = 0$ ;  $\text{PM}(s_{j,0}) = \infty \forall j \neq 0$ .

2. While ( $t < L+m$ )

increment  $t$ .

Compute PPMs (partial path metrics)  $\nabla$  paths entering each node.

Set  $\text{PM}(s_{j,t}) = \text{Best PPM entering node } S_j \text{ at time } t$ .

Delete non-surviving branches.

3. Trace back from  $s_0$  at time  $t = L+m$ , following surviving branches.

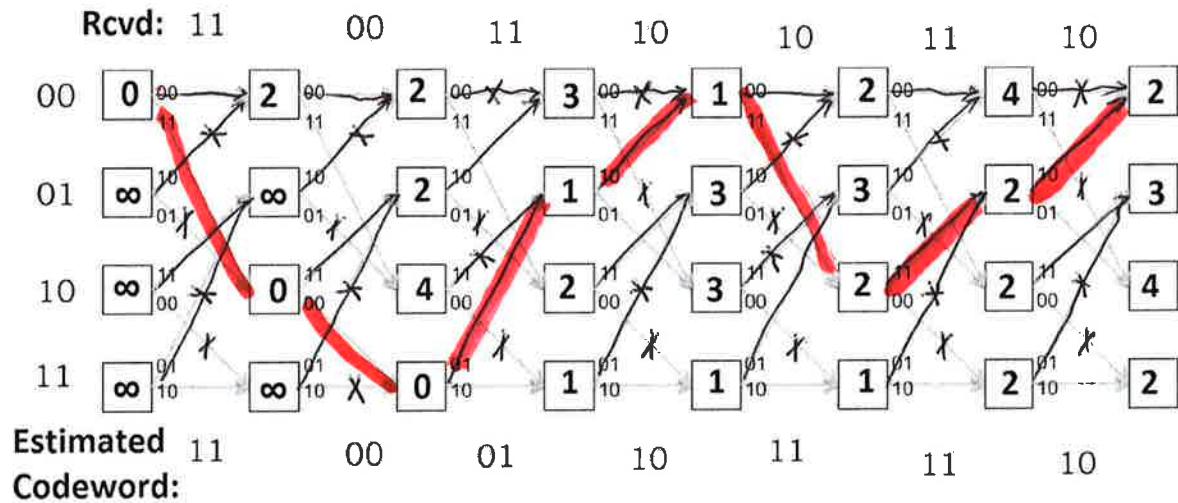
The path thus defined is the unique ML codeword!

Example: Our example encoder encodes the message sequence  $\vec{x} = (11001)$ , generating the codeword  $\vec{y} = (11, 00, 01, 10, 11, 11, 10)$ . If  $\vec{y}$  is transmitted over a noisy BSC, so that the received word is  $\vec{r} = (11, 00, 11, 10, 10, 11, 10)$ . Use the Viterbi decoder to obtain the ML codeword  $\hat{\vec{y}}$  and corresponding transmitted sequence  $\hat{\vec{x}}$ .

Soln: We'll use the constructed trellis with calculated PPMs, PMs and PMs using  $\text{HD}(d_H)$  as our metric (next page).

We obtain  $\hat{\vec{y}} = (11, 00, 01, 10, 11, 11, 10)$  which corrected the errors!

The transmitted estimated sequence is thus  $(11001)$  as expected.



ML path minimizes  $d_H(\vec{r} - \vec{y})$ , so choose min.  $\text{PM}$ .

$$\text{PM}(s_{i,j}) = \min \left\{ \text{PM}(s_{i,j}, j) + \text{BM}(s_{i,j}, s_{i,j}) \right\}$$

where  $\text{BM} \sim d_H(\vec{r} - \vec{y})$  at stage  $i$ .