

Convolutional CodingDelay Operator

\* THERE ARE TWO MAIN CLASSES OF CHANNEL CODE

- BLOCK CODES
- CONVOLUTIONAL CODES

\* SO FAR, WE HAVE ONLY LOOKED AT BLOCK CODES, TODAY WE WILL BEGIN OUR LOOK AT CONVOLUTIONAL CODES.

CHANNEL CODES

\* BLOCK CODES: DEFINED BY TWO INTEGERS  $n$  AND  $k$ .

$\frac{k}{n}$  - GIVES THE CODE RATE

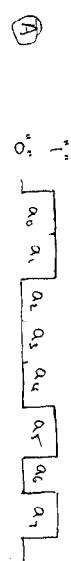
\* CONVOLUTION CODES: DEFINED BY THREE INTEGERS;  $n$ ,  $k$  AND  $r$ .

$\frac{r}{n}$  - GIVES CODE RATE;  
 BUT  $n$  DOES NOT HAVE  
 THE SAME SIGNIFICANCE  
 AS IT DOES FOR BLOCK  
 CODES

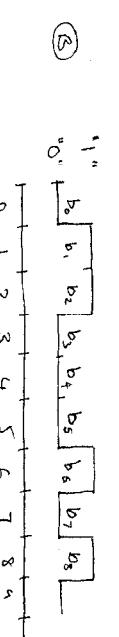
$K$  - CONSTRAINT LENGTH

A BINARY SEQUENCE "A" CONTAINS A NUMBER OF SEQUENTIAL ELEMENTS WHICH OCCUR AT REGULAR TIME INTERVALS

$$A = [a_0 \ a_1 \ a_2 \ a_3 \ a_4 \ a_5 \ a_6 \ a_7] \quad n\text{-TUPLE OR } n\text{-VECTOR}$$



MSB - TRANSMITTED FIRST



"B" IS SUBJECT TO A DIALLIC STORENIE ELEMENT, INHERITLY ASSUMED TO BE CLOCKED. THIS CAUSES THE INPUT SEQUENCE "A" TO SUFFER A UNIT DELAY. SO;



THAT IS) OPERATING ON A SEQUENCE BY  $D$  (THE DELAY OPERATOR) CAUSES A SINGLE SHIFT TO THE RIGHT;

$$B(D) = D A(D)$$

OR JUST

$$B = D A.$$

IN POLYNOMIAL FORM  $g(x)$  FOR EXAMPLE, WHEN MULTIPLIED BY  $x$  SHIFTED TO THE LEFT.

MULTIPLYING BY  $x^{-1}$  SHIFTS SYMBOLS TO THE RIGHT (DELAY).

HENCE;

$$D \equiv x^{-1} \quad \text{OR} \quad x = D^{-1}$$

OR  $x^m$  - SHIFT LEFT  
 $x^D$  - SHIFT RIGHT.

FOR EXAMPLE IF WE APPLY "A" TO AN  $m$ -STAGE SHIFT REGISTER THEN

$$B(D) = D^m A(D)$$

SO, FOR  $m=4$ .

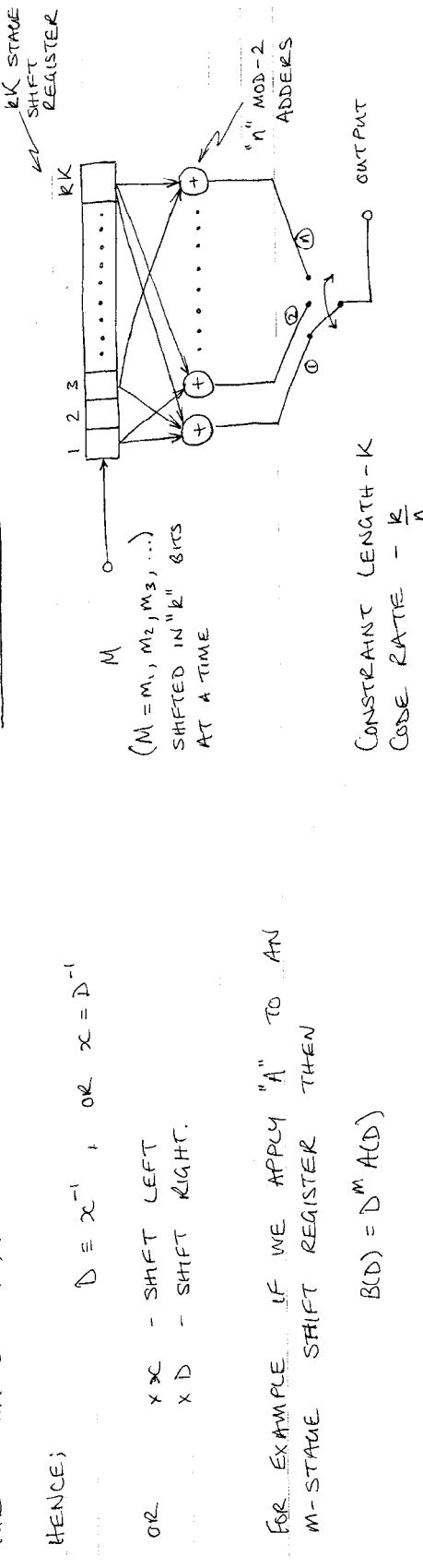
$$\begin{aligned} B(D) &= D^4 A(D) = D^4 A(D) \\ &= D^4 \oplus D^5 \oplus D^9 \oplus D^{11} \end{aligned}$$

### (4) Convolutional Coding

WITH CONVOLUTIONAL CODING A SLIDING SEQUENCE OF MESSAGE BITS IS USED TO PRODUCE A CODED STREAM OF BITS

AS WITH BLOCK CODING WE CAN USE SYMBOLS INSTEAD OF JUST BITS, BUT, FOR SIMPLICITY WE WILL ONLY CONSIDER BIT STREAMS IN THIS COURSE.

### Convolutional Code



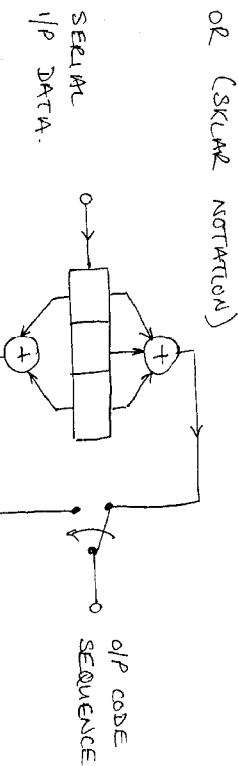
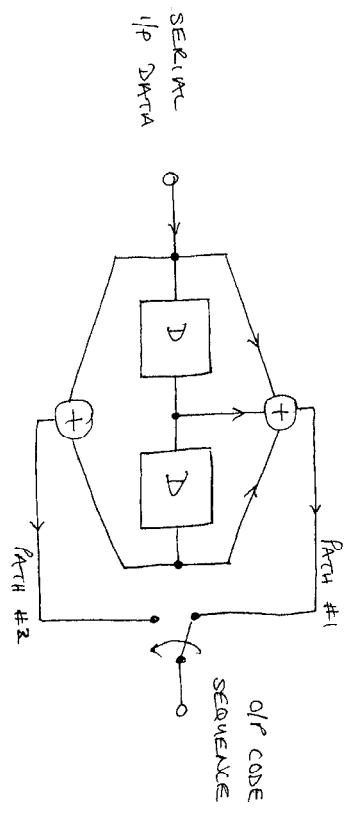
CONSTRAINT LENGTH -  $K$   
 CODE RATE -  $\frac{K}{n}$

TYPICAL CODER,  $K=3$ ,  $\frac{R}{K} = \frac{1}{2}$

(5)

THAT IS, ONE PARTICULAR BIT INFLUENCES THE OUTPUT DURING ITS OWN INTERVAL, AS WELL AS THE NEXT TWO INTERVALS.

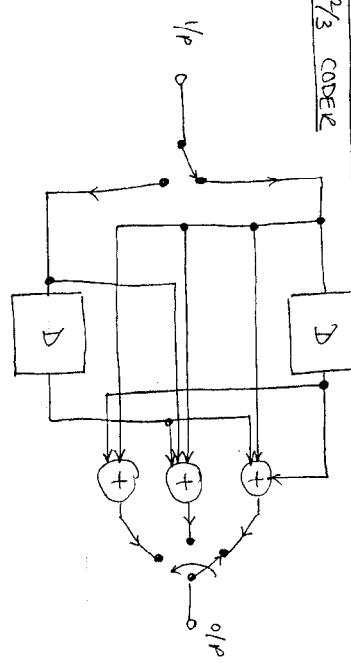
WE WILL ONLY CONSIDER THE CASE  $K=1$  IN THIS COURSE.



THE INPUT BITS ARE CLOCKED IN AFTER EACH INPUT BIT IS RECEIVED. THE CODE OUTPUT IS GENERATED BY SAMPLING AND MULTIPLEXING THE  $N=2$  PATH OUTPUTS FROM THE MOD-2 ADDERS.

NOTE  
CONSTRAINT LENGTH  $K=3$  IS ONE PLUS THE NUMBER OF PAST BITS AFFECTING THE CURRENT OUTPUT

### SYSTEMATIC AND NON-SYSTEMATIC CODES



LIKE BLOCK CODES, CONVOLUTIONAL CODES CAN BE SYSTEMATIC OR NON-SYSTEMATIC DEPENDING ON WHETHER OR NOT THE INFORMATION SEQUENCE APPEARS DIRECTLY WITHIN THE CODE SEQUENCE i.e. THE INPUT CONNECTED DIRECTLY TO ONE OF THE "n" OUTPUTS

(THAT IS  $g_i(n)=1$ , - SEE LATER)

(6)

For the same code performance, a systematic encoder will have a more complex structure than a non-systematic one

Therefore, most convolutional codes used in practice are non systematic

$K=3, \frac{1}{2}$  rate encoder

returning to one  $\frac{1}{2}$  rate  $K=3$  encoder shown on page 5;

using the decimal operator  $D$ , for the top adder of the encoder the impulse response (the response to a single one, with the registers reset initially to zero) for path #1 can be expressed as;

$$g^1(D) = g_0^1 + g_1 D + g_2 D^2 + \dots + g_N D^N$$

similarly for path #2;

$$g^2(D) = g_0^2 + g_1 D + g_2 D^2 + \dots + g_N D^N$$

where

$g_i^{1/2} = 0$  or 1 if the connection is open or made.

⑦ THE TWO POLYNOMIALS  $g^1(D)$  AND  $g^2(D)$  ARE THE GENERATOR POLYNOMIALS OF THE CODE;

WITH A (SEMI-INFINITE) INPUT MESSAGE SEQUENCE OF L BITS;  
 $M = (M_0, M_1, M_2, \dots, M_{L-1})$

THESE FOR THE OUTPUTS ARE;

$$\text{PATH } \#1 : \quad x^1(D) = g^1(D) M(D)$$

$$\text{PATH } \#2 : \quad x^2(D) = g^2(D) M(D)$$

So, from our example, the impulse response of path #1 is 111, so,  
 $g^1(D) = 1 + D + D^2$   
 AND FOR PATH #2  
 $g^2(D) = 1 + D$

$$\begin{aligned} & \text{FOR AN INPUT SEQUENCE OF } 10011 \\ & \Rightarrow M(D) = 1 + D^3 + D^4 \\ & x^1(D) = g^1(D) M(D) \\ & = (1 + D + D^2)(1 + D^3 + D^4) \\ & = 1 + D + D^2 + D^3 + D^4 \\ & = (1111001) \end{aligned}$$

AND

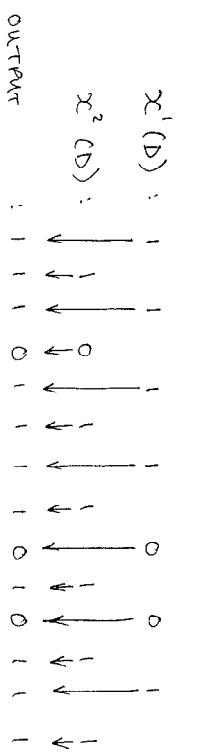
$$x^2(D) = g^2(D) M(D)$$

$$= (1 \oplus D^2)(1 \oplus D^3 \oplus D^4)$$

$$= 1 \oplus D^2 \oplus D^3 \oplus D^4 \oplus D^5 \oplus D^6$$

HENCE, THE OUTPUT CODEWORD IS;

(BY MULTIPLEXING  $x^1$  AND  $x^2$ ),



(4)

### ENCODER STATE REPRESENTATION

THE STATE OF THE ENCODER (SHIFT REGISTER CONTENTS) CAN ONE OF  $2^{K-1}$  STATES:

KNOWLEDGE OF THE PRESENT STATE PLUS THE NEXT INPUT IS SUFFICIENT INFORMATION TO DETERMINE THE NEXT STATE.

THE ENCODER STATE IS SHOWN TO BE MARKOV IN THAT THE PROBABILITY OF BEING IN ONE STATE DEPENDS ONLY ON THE MOST RECENT STATE.

### STATE TRANSITION DIAGRAM

MESSAGE LENGTH:  $L = 5$  PRODUCES AN OUTPUT CODED SEQUENCE OF  $n(L+K-1)$  BITS  
 $= 2(5+2) = 14$  BITS.

NOTE: SINCE A CONVOLUTIONAL CODE, UNLIKE A BLOCK CODE, HAS NO PARTICULAR BLOCK SIZE, THEY ARE OFTEN (FOR CONVENIENCE) PERIODICALLY TRUNCATED. WHEN THIS IS DONE, A TAIL OF  $(K-1)$  ZEROS ARE APPENDED TO THE END OF THE MESSAGE SEQUENCE TO FLUSH THE ENCODER. THIS GIVES RISE TO A TAIL IN THE CODE SEQUENCE.

FROM THE STATE DIAGRAM, TO DETERMINE THE OUTPUT SEQUENCE FOR SOME INPUT MESSAGE SEQUENCE, START AT STATE (a) AND WORK THROUGH THE STATE DIAGRAM IN ACCORDANCE WITH THE MESSAGE SEQUENCE PUTTING THE APPROPRIATE BITS FOR EACH BRANCH.

CONSIDER OUR EXAMPLE  $K=3$  Y2 RATE CODE

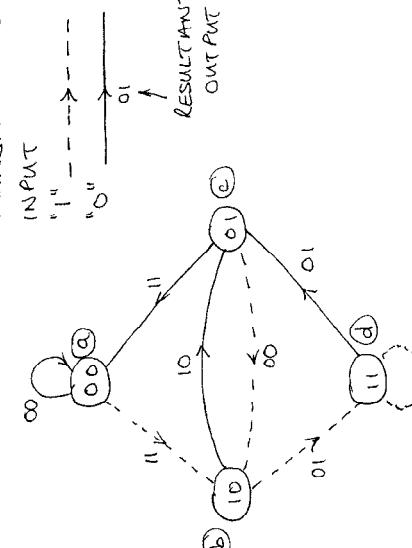
(5)

### STATE TRANSITION DIAGRAM K=3 V2 RATE

TRANSITION FOR:

INPUT "1" --->---

"0" -----> 01



RESULTANT  
OUTPUT

00

01

10

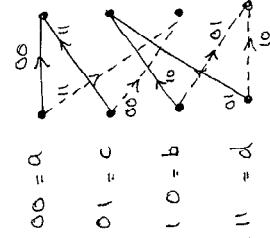
11

FOR EXAMPLE IF  $M = 10011$

$\textcircled{a} \rightarrow \textcircled{b} \rightarrow \textcircled{c} \rightarrow \textcircled{a} \rightarrow \textcircled{b} \rightarrow \textcircled{d} \rightarrow \textcircled{c} \rightarrow \textcircled{a}$

11 10 11 01 01 11

### TRELLIS SEGMENT



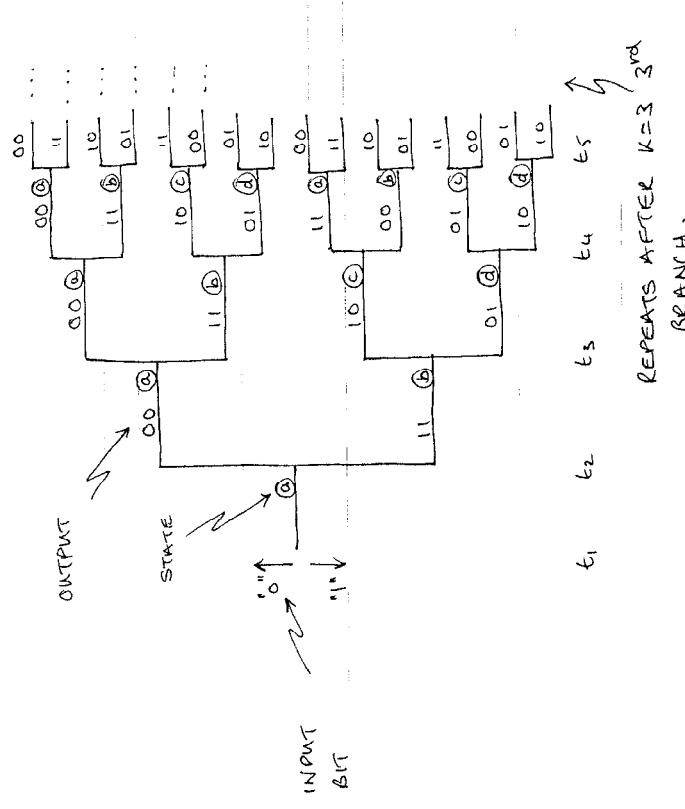
NOTE: WE CAN GET TO  
ANY STATE BY ONE OF  
TWO PATHS.

WE CAN LEAVE ANY  
STATE BY ONE OF TWO  
PATHS.

### TREE Diagram K=3 V2 RATE

ALTHOUGH THE STATE DIAGRAM CAN  
COMPLETELY CHARACTERIZE THE ENCODER,  
STATE, WE CANNOT TRACK THE OUTPUT  
AS A FUNCTION OF TIME SINCE IT  
HAS NO TEMPORAL DIMENSION.

WITH THE TREE DIAGRAM, EACH BRANCH  
OF THE TREE REPRESENTS AN INPUT BIT  
WITH AN UPPER BIFURCATION FOR A "0" INPUT  
AND A LOWER BIFURCATION FOR A "1" INPUT



REPEATS AFTER  $K=3$  3rd  
BRANCH.

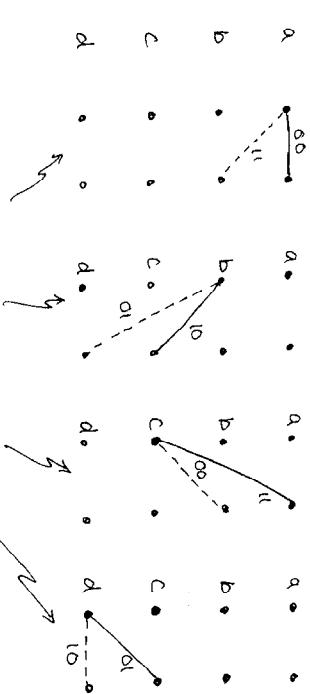
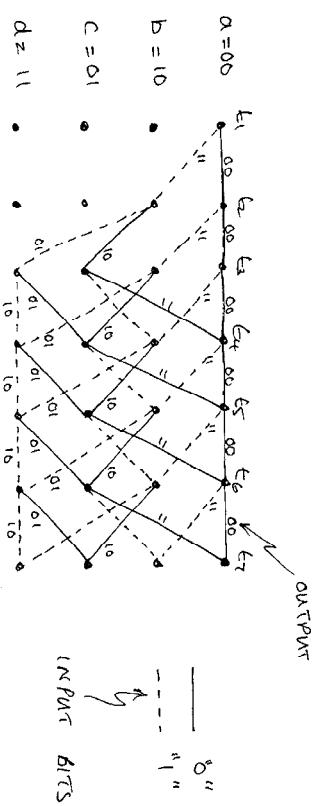
(12)

### TRELLIS DIAGRAM

(13)

### TRELLIS DIAGRAM K=3 1/2 RATE

(14)



TRELLIS FRAGMENTS

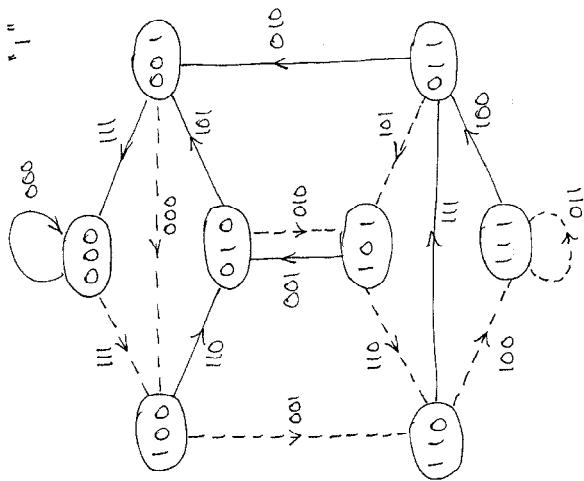
- \* IT CAN BE SEEN FROM THE TREE DIAGRAM THAT THE STRUCTURE REPEATS ITSELF AFTER THE  $K^m$  BRANCH
- \* AFTER THE  $K^m$  BRANCH THERE ARE EIGHT NODES: TWO LABELLED  $\circledcirc$ , TWO UNLABELLED  $\circledast$ , TWO UNLABELLED  $\circledcirc$  AND TWO UNLABELLED  $\circledast$ .
- \* FROM THIS POINT IT CAN BE SEEN THAT THE UPPER AND LOWER PARTS OF THE TREE ARE IDENTICAL.
- \* THIS MEANS THAT ANY TWO NODES HAVING THE SAME STATE LABEL, AT THE SAME TIME  $t_i$  CAN BE MERGED SINCE ALL SUBSEQUENT PATHS WILL BE INDISTINGUISHABLE.
- \* IF WE MERGE THESE PATHS WE OBTAIN THE TRELLIS DIAGRAM.
- \* AT EACH UNIT OF TIME WE NEED  $2^{K-1}$  NODES TO REPRESENT THE  $2^{K-1}$  POSSIBLE ENCODEE STATES
- \* TRELLIS DIAGRAMS ARE MOSTLY USED IN PRACTICE TO REPRESENT CONVOLUTIONAL CODES - WE SOON RUN OUT OF PAPER WITH THE TREE DIAGRAM!!

(15)

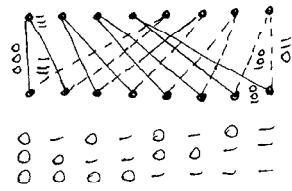
INPUT BIT

"0"

"1"

STATE DIAGRAM

→ TRELLIS  
SEGMENT.



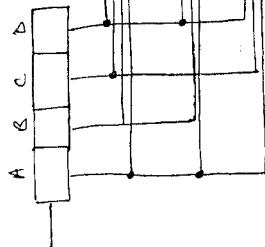
(15)

For Example

$$K = 4 \text{ } \frac{1}{2} \text{ RATE}$$

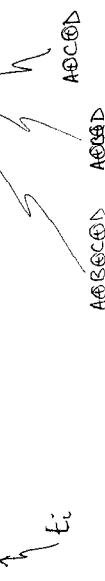
$$\begin{aligned} g^1(D) &= 1 \oplus D \oplus D^2 \oplus D^3 \\ g^2(D) &= 1 \oplus D \oplus D^3 \\ g^3(D) &= 1 \oplus D \oplus D^2 \end{aligned}$$

$$K = 4 \quad 2^{K-1} = 2^3 = 8 \text{ STATES}$$



INPUT BIT  $t_{i+1/2}$  ABCD STATE  $t_i$

	STATE $t_i$	$g^1$	$g^2$	$g^3$
0	000	000	000	000
-	100	000	100	100
0	001	000	000	100
-	101	000	000	000
0	010	000	000	000
-	110	000	000	000
0	011	000	000	000
-	111	000	000	000
0	100	100	100	100
-	010	100	010	010
0	101	100	010	010
-	011	100	010	010
0	110	100	010	010
-	001	010	010	010
0	010	010	010	010
-	101	010	010	010
0	111	010	010	010
-	000	000	000	000



## DECODING OF CONVOLUTIONAL CODES

(7)

## MAXIMUM LIKELIHOOD DECODING

(8)

- \* DECODER HAS KNOWLEDGE OF THE CODE STRUCTURE (e.g. TRELLIS STRUCTURE) AND THE RECEIVED SIGNAL (e.g. THE STATISTICAL CHARACTERISTICS OF THE CHANNEL).

- \* THE TRANSMITTED SIGNAL CORRESPONDS TO A SPECIFIC PATH THROUGH THE TRELLIS. THE DECODER USES THE RECEIVED SEQUENCE (WHICH MAY CONTAIN ERRORS) TO FIND THE MOST LIKELY PATH THROUGH THE TRELLIS - THAT CORRESPONDS TO THE RECEIVED SEQUENCE.

- \* THE MOST LIKELY PATH IS THEN USED TO SPECIFY THE DECODED DATA SEQUENCE.

- THIS IS CALLED MAXIMUM LIKELIHOOD DECODING

DENOTE THE ENCODER SEMI-INFINITE OUTPUT SEQUENCE CORRESPONDING TO A MESSAGE SEQUENCE (OR PATH) BY;  
 $c_m = c_{m_1}, c_{m_2}, c_{m_3}, \dots$

THE RECEIVED SIGNAL FROM THE DISCRETE MEMORYLESS CHANNEL IS;

$$r = r_1, r_2, r_3, \dots$$

THE RECEIVED SEQUENCE  $r$ , MAY DIFFER FROM  $c_m$  BECAUSE OF CHANNEL ERRORS.

THE PROBABILITY OF RECEIVING  $r$  GIVEN THAT THE CHANNEL INPUT WAS  $c_m$  IS GIVEN BY;  

$$P(r|c_m) = \prod_{i=1}^N P(r_i|c_{mi})$$

GIVEN  $r$ , THE MOST LIKELY PATH THROUGH THE TRELLIS IS ONE THAT MAXIMIZES  $P(r|c_m)$  - THIS IS A METRIC

THIS IS NOT VERY CONVENIENT, BUT IF WE USE THE LOGARITHM OF THE PROBABILITY WE CAN USE SUMMATION RATHER THAN MULTIPLICATION

(9)

THE USE OF THE LOG-LIKELIHOOD FUNCTION IS STILL PERMISSIBLE SINCE THE LOG FUNCTION IS A MONOTONICALLY INCREASING FUNCTION.

- THAT IS, THE OPTIMUM PATH THROUGH THE TRELLIS IS STILL ONE WHICH MAXIMIZES  $\log [P(r|cm)]$

HENCE, WE CAN USE THE LOG-LIKELIHOOD FUNCTION

$$\log [P(r|cm)] = \sum_{i=1}^N \log [P(r_i|c_{mi})]$$

FINDING THE MOST LIKELY PATH THROUGH EXHAUSTIVE SEARCHING OF THE TREE DIARAY, REQUIRES A "BRUTE FORCE" TECHNIQUE. FOR AN "L" BIT RECEIVED SEQUENCE,  $2^L$  ACCUMULATED LOG-LIKELIHOOD METRICS HAVE TO BE COMPUTED AND COMPARED - COMPLEX AND SLOW

BY TAKING INTO ACCOUNT THE SPECIAL STRUCTURE OF THE TRELLIS DIARAY, CAN IMPROVE THIS CONSIDERABLY, BY DISCARDING IMPOSSIBLE PATHS.

VITERBI DECODING GOES ONE STATE FURTHER . . .

### CONVOLUTIONAL CODE QUIZ

A CONVOLUTIONAL CODE IS DESCRIBED BY THE FOLLOWING GENERATOR POLYNOMIALS

$$g_1(D) = 1 ; g_2(D) = 1 \oplus D^2 ; g_3(D) = 1 \oplus D \oplus D^2$$

- a) DRAW THE ENCODER (using THE SHIFT REGISTER NOTATION OF SKLAR & PROAKIS)
- b) DRAW THE STATE TABLE
- c) DRAW THE STATE TRANSITION DIAGRAM
- d) DRAW THE TRELLIS DIAGRAM
- e) FIND THE OUTPUT CODE FOR THE MESSAGE STREAM  
1011000

(1)

b) STATE TABLE:

c) STATE DIAGRAM:

(2)

- a) ENCODER: