# **Convolutional Codes**

#### **Differences Between Block Codes And Convolutional Codes**

1. LINEAR BLOCK CODES ARE DESCRIBED BY

n, k AND g(X) (OR G)

CONVOLUTIONAL CODES ARE DESCRIBED BY

n. k AND K

K-1

WHERE K IS THE NUMBER OF SHIFT REGISTERS

- 2. FOR LINEAR BLOCK CODES, EACH CODEWORD n-TUPLE IS UNIQUELY DETERMINED BY THE INPUT MESSAGE k-TUPLE. FOR CONVOLUTIONAL CODES, n DOES NOT DEFINE A BLOCK OR CODEWORD LENGTH, HENCE NOT DETERMINED BY THE INPUT MESSAGE k-TUPLE ONLY, BUT ALSO A FUNCTION OF THE PREVIOUS (K-1) INPUT k-TUPLES.
- 3. DECODING OF LINEAR BLOCK CODES IS DONE n-BLOCK BY n-BLOCK AND EACH n-BLOCK WILL GIVE THE CORRESPONDING k-BLOCK MESSAGE.

  DECODING THE CONVOLUTIONAL CODES CANNOT BE DONE AS ABOVE, BUT THE LENGTH OF THE BLOCK DECODED AT ONE TIME DEPENDS ON THE ALGORITHMS OR METHODS ADOPTED.

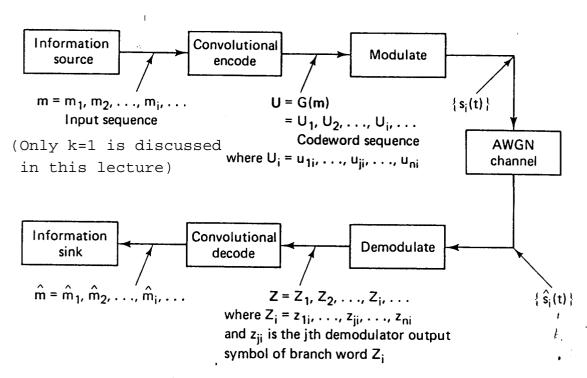
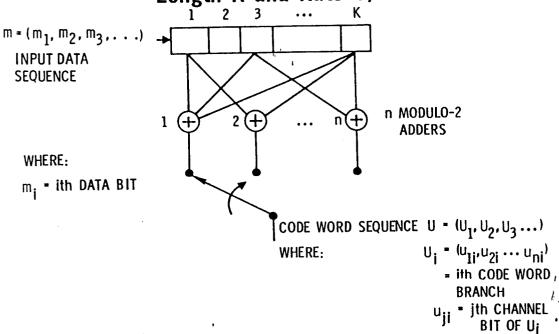


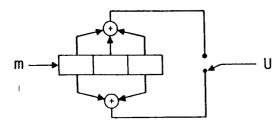
Figure 6.1 Encode/decode and modulate/demodulate portions of a communication link.

## Convolutional Encoder with Constraint Length K and Rate 1/n



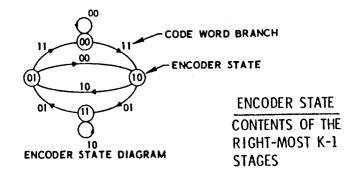
### **Encoder Characterization**

1. CONNECTION PICTORIAL



ENCODER, K = 3, 1/n = 1/2

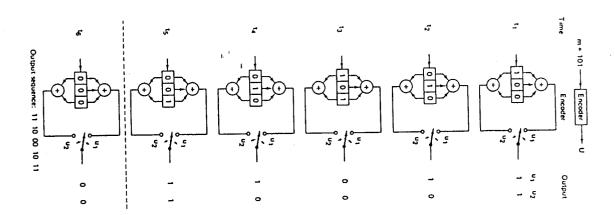
2. STATE DIAGRAM



3. CONNECTION VECTORS OR POLYNOMIALS

$$g_1 = 1 \quad 1 \quad 1$$
  
 $g_2 = 1 \quad 0 \quad 1$ 

$$g_1(X) = 1 + X + X^2$$
  
 $g_2(X) = 1 + X^2$ 



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Figure 6.4 Convolutionally encoding a message sequence with a rate  $\frac{1}{2}$ , K=3 concoder.

### **Convolutional Encoding Example**

INPUT DAT	TA SEQUENCE =	1	1	0	1	1	h 1 4
OUTPUT CO	ODE SEQUENCE	= 11	01	01	00	01	
INPUT	REGISTER	STA	TE t <sub>i</sub>	ST	ATE t	i+1	BRANCH WORD
1	1. 0. 0	0	0	•	10		11
1	1. 1. 0	1	0		11		01
0	0 1 1	1	1		01		01
1	1 0 1	0	1	,	10		00
1	1 10	1	0		11		01
	state t;						
	state t i+1						

### **Connection Vectors Or Polynomials Representation**

### **Connection Vectors**

$$g_1 = 111$$
  
 $g_2 = 101$ 

IMPULSE RESPONSE OF THE ENCODER:

Register Contents	Branch u <sub>1</sub>	Word u <sub>2</sub>
100	<u>(1)</u>	$\widehat{1}$
010	(1)	(o)
001	1	1)
	9 <sub>1</sub>	y <sub>2</sub>

### earliest transmission

INPUT SEQUENCE: 1 0 0
OUTPUT SEQUENCE: 11 10 11

▼ TO FIND THE OUTPUT SEQUENCE FOR INPUT m = 1 0 1, USE SUPERPOSITION OR LINEAR ADDITION OF THE IMPULSE RESPONSES OF EACH INPUT BIT:

NPUT m OUTPUT					
1 ,	11	10	11		<sup>A</sup> (M <sub>h</sub>
0		00	00	00	
1			11	10	11
MODULO-2 SUM:	11	10	00	10	11

THIS IS POSSIBLE BECAUSE CONVOLUTION CODE IS LINEAR.

### **Polynomials**

$$g_1(X) = 1 + X + X^2$$
 AND  $g_2(X) = 1 + X^2$   
 $m = 1 \ 0 \ 1$   $\longrightarrow$   $m(X) = 1 + X^2$ 

**OUTPUT SEQUENCE IS FOUND AS FOLLOWS:** 

$$\begin{split} & U(X) = m(X).g_1(X) \text{ INTERLACED WITH } m(X).g_2(X) \\ & m(X)g_1(X) = (1+X^2)(1+X+X^2) = 1+X+X^3+X^4 \\ & m(X)g_2(X) = (1+X^2)(1+X^2) = 1+X^4 \end{split}$$

**RE-WRITE**:

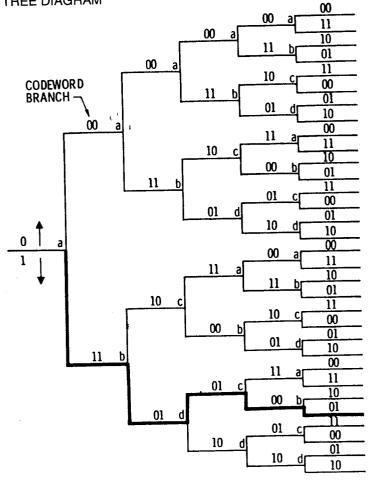
$$m(X)g_1(X) = 1 + X + 0X^2 + X^3 + X^4$$

$$m(X)g_2(X) = 1 + 0X + 0X^2 + 0X^3 + X^4$$

$$U(X) = (1,1) + (1,0)X + (0,0)X^2 + (1,0)X^3 + (1,1)X^4$$

$$U = 11 \quad 10 \quad 00 \quad 10 \quad 11$$

#### 4. TREE DIAGRAM

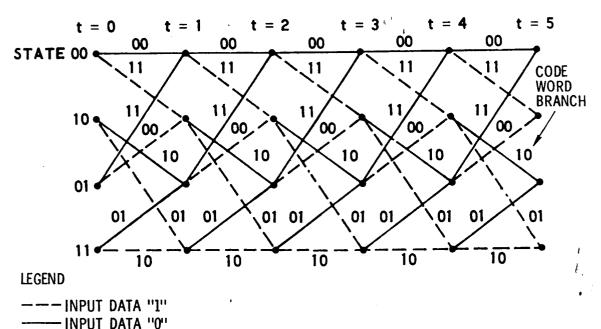


# Tree Representation of Encoder

THE INPUT DATA SEQUENCE m = 11011 TRACES THE HEAVY-LINE PATH, HAVING THE CODEWORD SEQUENCE

U - 11 01 01 00 01

# Encoder Trellis Diagram Shows all Possible Transitions at Each Time Unit



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### **Problem of Decoding**

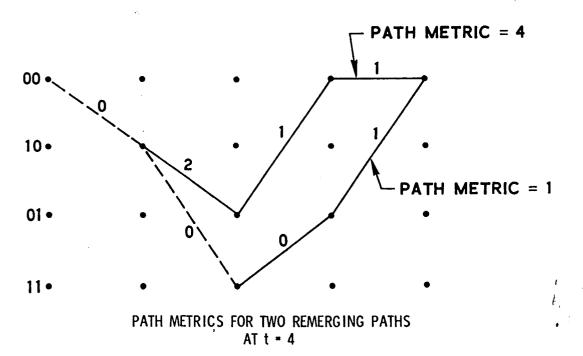
#### **Maximum Likelihood Decoding**

- FHENCE, OPTIMAL DECODING OF AN L-BIT BINARY SEQUENCE REQUIRES COMPARING THE  $2^L$  ACCUMULATED METRICS  $\longrightarrow$  EXPONENTIAL INCREASE OF DECODING EFFORT WITH THE LENGTH L OF THE SEQUENCE.

#### Viterbi Decoding

- **☞ SUBOPTIMAL DECODING**
- - WHEN 2 PATHS MERGE, THE PATH WITH THE LARGER METRIC CAN BE ELIMINATED
- FHENCE, FOR L SEQUENCE REQUIRES ONLY L2K-1 OPERATIONS

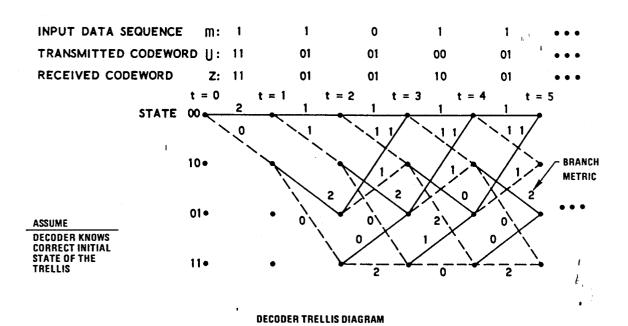
## If Two Paths Merge, One of Them Can be Eliminated



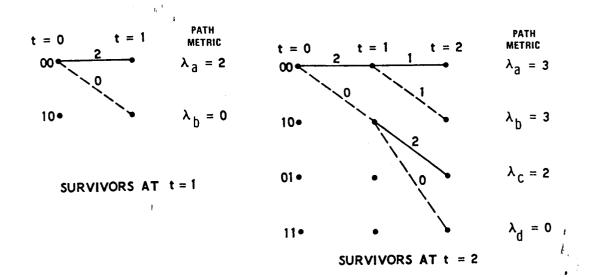
### Viterbi Decoding

- FOR SIMPLICITY, ASSUME BINARY SYMMETRIC CHANNEL
- ENCODER HAS CONSTRAINT LENGTH 3, AND RATE 1/2
- A TRELLIS REPRESENTS THE DECODER (similar to the encoder trellis)
- THE TRELLIS TRANSITIONS ARE LABELLED WITH BRANCH METRICS (hamming distance between branch code word and rcvd code word)
- IF ANY 2 TRELLIS PATHS MERGE TO A SINGLE STATE, THE PATH WITH THE LARGER METRIC IS ELIMINATED

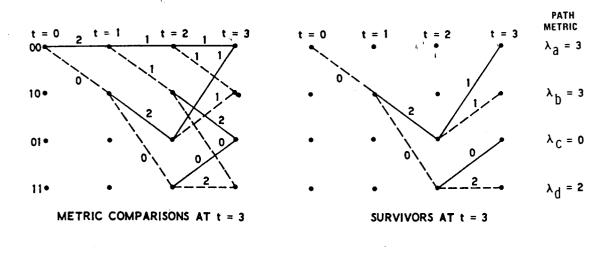
### Viterbi Decoding Example



### **Selection of Survivor Paths**



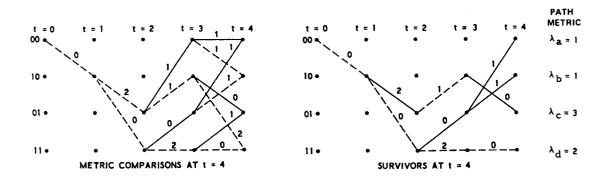
### **Selection of Survivor Paths (cont'd)**



ONE PATH ENTERING EACH STATE CAN BE ELIMINATED

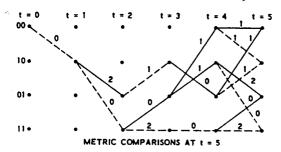
DECODER DECIDES THAT TRANSITION FROM t = 0 TO t = 1, WAS PRODUCED BY DATA BIT "1"

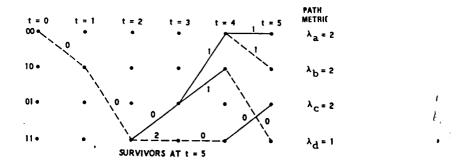
### Selection of Survivor Paths (cont'd)



AGAIN, ONE OF TWO PATHS ENTERING SAME STATE CAN BE ELIMINATED

## Selection of Survivor Paths (concluded)





DECODER DECIDES, THE SECOND DATA BIT - "1"

### Path Memory

 $m{\sigma}$  PROBLEM: IF A L-BIT LONG BINARY SEQUENCE (L USUALLY IS A LARGE NUMBER) IS TRANSMITTED, SHOULD WE WAIT UNTIL THE RECEIVER RECEIVED ALL THE L BITS, COMPARED AND DECODED THEM, THEN WE START TO **OUTPUT THE DECODED SEQUENCE?** 

☞ IF WE DO: ⇒ WE HAVE RECEIVER WITH VERY LONG DELAY

 $\Rightarrow$  RECEIVER REQUIRES VERY LARGE MEMORY STORAGE (=  $L2^{K-1}$ )

- PRACTICAL DECODER IS NEEDED WHICH DOES NOT HAVE TO WAIT TILL ALL THE L BITS ARE RECEIVED BEFORE IT CAN OUTPUT THE DECODED BIT
- FROM THE PREVIOUS EXAMPLE, WE SEE:

  - AT  $t_i$  WE CAN OUTPUT BIT DECODED AT  $t_j$  BUT BIT DECODED AT  $t_i$  CANNOT BE OUTPUT UNTIL  $t_{6}$ . SO THERE IS DISCONTINUITY
  - ALSO, IF MANY ERROR BITS ARE RECEIVED, IT IS IMPOSSIBLE TO HAVE A SINGLE PATH SURVIVED AT  $t_i$  WHEN DECODING DEPTH HAS REACHED TO  $t_i$  AS THE ABOVE-**MENTIONED**
- SIMULATION RESEARCH HAS FOUND THAT THE PATH STORAGE REQUIRED IS

$$U=h.2^{K-1}$$

WHERE h = 4 OR 5 TIMES K

#### DISTANCE PROPERTIES

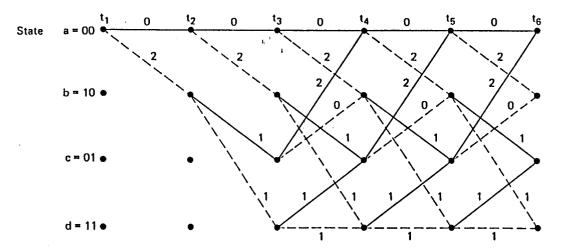
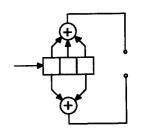
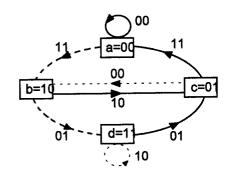


Figure 6.13 Trellis diagram, labeled with distances from the all-zeros path.

For linear code, can assume all-zeros path is the correct transmitted path. Compare all possible paths with this all-zeros path. The minimum distance from the all-zeros path is the minimum free distance of the code (a to b to c to a). The minimum free 339 distance of the above code is 2+1+2=5.

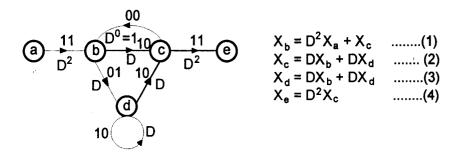
### **Transfer Function**





#### MODIFY STATE DIAGRAM INTO INPUT-OUTPUT FORM:

- LABEL THE BRANCHES AS EITHER D<sup>0</sup> (=1), D<sup>1</sup>, D<sup>2</sup>, ......, WHERE THE EXPONENT OF D DENOTES THE HAMMING DISTANCE FROM THE BRANCH WORD TO THE ALL-ZERO BRANCH
- ELIMINATE THE SELF-LOOP AT NODE a SINCE IT CONTRIBUTE NOTHING TO THE DISTANCE PROPERTY
- SPLIT NODE a INTO 2 NODES: ONE INPUT, THE OTHER OUTPUT
- DENOTE THE PARTIAL PATHS TO THE INTERMEDIATE NODES a, b, c, d AND e WITH DUMMY VARIABLES X<sub>a</sub>, X<sub>b</sub>, X<sub>c</sub>, X<sub>d</sub> AND X<sub>e</sub>



(2) - (3): 
$$X_c = X_d$$

(2): 
$$X_c = DX_b + DX_c \Rightarrow X_b = \left(\frac{1-D}{D}\right)X_c$$

$$\frac{1-D}{D} X_c = D^2 X_a + X_c$$

$$X_c = \left(\frac{D^3}{1-2D}\right) X_a$$

(4): 
$$X_{e} = D^{2} \left( \frac{D^{3}}{1 - 2D} \right) X_{a}$$

$$\frac{X_{e}}{X_{a}} = \frac{D^{5}}{1 - 2D}$$

HENCE,

$$T(D) = \frac{D^5}{1 - 2D}$$

NOTE THAT FOR INFINITE GP, THE SUM OF THE SERIES:

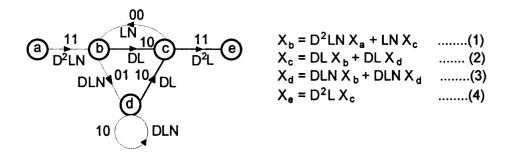
$$S_{\infty} = \frac{a}{1-r} = a + ar + ar^2 + \dots$$

SO LET  $a = D^5$  AND r = 2D:

$$T(D) = \frac{D^5}{1-2D}$$
 GIVE  $d_f = 5$  
$$= D^5 + 2D^6 + 4D^7 + \dots + 2^\ell D^{\ell+5} + \dots$$
 one path of two paths of in general, there are distance 5 distance 6 2¹ paths of distance from all-zero path +5 from all-zero path

#### MORE DETAILED INFORMATION CAN BE PROVIDED BY INTRODUCING FACTORS:

- L: INTO ALL THE BRANCHES. THE EXPONENT OF L INDICATES THE NUMBER OF BRANCHES IN ANY GIVEN PATH FROM STATE a = 00 TO STATE e = 00
- N: ONLY INTO THE BRANCH TRANSITIONS CAUSED BY THE INPUT BIT ONE. THE EXPONENT OF N INDICATES HOW MANY INPUT BITS THIS PATH DIFFERS FROM THE ALL-ZEROS PATH



#### THE TRANSFER FUNCTION BECOMES:

$$T(D,L,N) = \frac{D^5 L^3 N}{1 - DL(1+L)N}$$
$$= D^5 L^3 N + D^6 L^4 (1+L)N^2 + D^7 L^5 (1+L)^2 N^3 + \dots + D^{\ell+5} L^{\ell+3} N^{\ell+1} + \dots$$

### **Bit Error Probability**

THE UPPER BOUND OF THE CONVOLUTIONAL CODE PROBABILITY OF BIT ERROR IS

$$\left.P_{B} \leq \frac{dT(D,N)}{dN}\right|_{N=1,D=2\sqrt{p(1-p)}}$$

WHERE p = THE PROBABILITY OF CHANNEL SYMBOL ERROR

**EXAMPLE:** 

USE THE T(D,L,N) OBTAINED PREVIOUSLY, AND SET L = 1:

$$T(D,N) = \frac{D^5 N}{1 - 2DN}$$

$$\Rightarrow \frac{dT(D,N)}{dN} \Big|_{N=1} = \frac{D^5}{(1 - 2D)^2}$$

$$P_B \le \frac{\{2[p(1-p)]^{1/2}\}^5}{\{1 - 4[p(1-p)]^{1/2}\}^2}$$

### **Catastrophic Error**

- CATASTROPHIC ERROR = AN EVENT WHEREBY A FINITE NUMBER OF CODE SYMBOL ERRORS CAUSE AN INFINITE NUMBER OF DECODED DATA BIT ERRORS
- **☞ SOME ENCODER CONNECTION DESIGNS CAN PRODUCE CATASTROPHIC ERROR**
- FOR RATE 1/n ENCODER, THE NECESSARY AND SUFFICIENT CONDITION FOR CONVOLUTIONAL CODES TO DISPLAY CATASTROPHIC ERROR IS

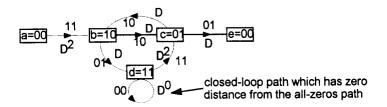
THE GENERATORS HAVE A COMMON POLYNOMIAL FACTOR

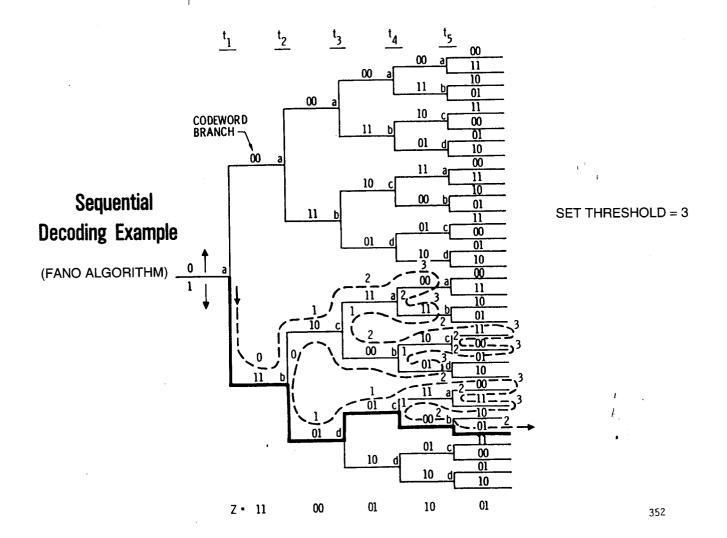
**EXAMPLE**:

$$g_1(X)=1+X \\ g_2(X)=1+X^2=(1+X)(1+X) \\ \text{THE COMMON POLYNOMIAL FACTOR IS } 1+X$$

**☞ IN TERMS OF STATE DIAGRAM IS** 

IF ONLY IF, ANY CLOSED-LOOP PATH IN THE DIAGRAM HAS ZERO DISTANCE FROM THE ALL-ZERO PATH.





### SEQUENTIAL DECODER (STACK ALGORITHM)

- **☞** COMPARISON WITH FANO ALGORITHM:
  - FANO ALGORITHM IS MORE PRACTICAL BECAUSE IT USES LESS MEMORY STORAGE
  - STACK ALGORITHM HAS ADVANTAGE IN SPEED OF COMPUTATION
  - STACK ALGORITHM IS EASIER TO UNDERSTAND
- THE STEPS INVOLVED:
  - BRANCH METRIC CALCULATION (FOR HARD-DECISION, BSC CHANNEL)

$$\mu_{jm}^{(r)} = \begin{cases} \log_2 2(1-p) - R_c & \text{if } \widetilde{y}_{jm} = c_{jm}^{(r)} \\ \log_2 2p - R_c & \text{if } \widetilde{y}_{im} \neq c_{im}^{(r)} \end{cases}$$

WHERE  $\mu$  = THE METRIC FOR rth PATH, jth BRANCH, AND mth CODE BIT p = BSC CHANNEL TRANSITION ERROR PROBABILITY  $R_{C}$  = CODE RATE  $y_{jm}$  = THE mth RECEIVED BIT  $c_{im}$  = THE mth CODED BIT

- PLACE THE MOST PROBABLE PATHS, I.E. PATH WITH THE LARGEST METRIC AT THE TOP OF THE STACK, FOLLOWED BY THE NEXT LARGEST AND SO ON TO THE LEAST AT THE BOTTOM.
- AT EACH STEP, ONLY THE PATH AT THE TOP OF THE STACK IS EXTENDED BY ONE BRANCH.
- RE-ORDER THE VALUES IN THE STACK AT EVERY OF THESE STEPS WITH THE LARGEST ON TOP THE LEAST ON THE BOTTOM.
- REPEAT THE PROCESS OF EXTENDING OF THE PATH.

### **EXAMPLE OF STACK ALGORITHM**

WE FOLLOW THE EXAMPLE FOR FANO ALGORITHM.

- TAKE THE BSC TRANSITION PROBABILITY, p = 0.1.
- **☞ CALCULATE THE BRANCH METRIC FOR EACH BIT:**

$$\mu_{jm}^{(r)} = \begin{cases} \log_2 2(1-0.1) - 1/2 = 0.35 & \text{if } \widetilde{y}_{jm} = c_{jm}^{(r)} \\ \log_2 2(0.1) - 1/2 = -2.82 & \text{if } \widetilde{y}_{jm} \neq c_{jm}^{(r)} \end{cases}$$

TO SIMPLIFY CALCULATION, NORMALISE THE ABOVE VALUES:

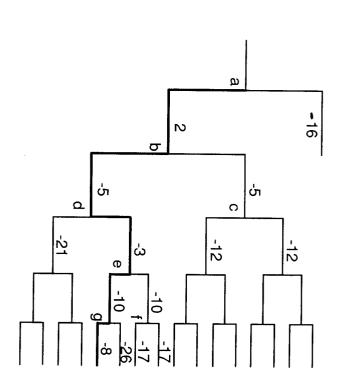
$$\mu_{jm}^{(r)} = \begin{cases} 1 & \text{if } \widetilde{y}_{jm} = c_{jm}^{(r)} \\ -8 & \text{if } \widetilde{y}_{jm} \neq c_{jm}^{(r)} \end{cases}$$

HENCE, FOR TWO OUTPUT BITS, THE BRANCH METRIC IS

$$\mu_j^{(r)} = 2 - d + (-8)d$$

$$= 2 - 9d$$

						-16	2	Step
					-16	ა	ტ	Step
				-16	-12	-12	ტ	Step
			-21	-16	-12	-12	ယ်	Step
		-21	-16	-12	-12	-10	-10	Step e
	-21	-17	-17	-16	-12	-12	-10	Step
-26	-21	-17	-17	-16	-12	-12	-8	Slep



### **Comparison - Viterbi And Sequential Decoding**

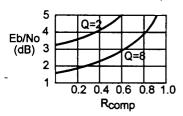
#### Viterbi Decoding

- ▼ VITERBI DECODER ARE LIMITED TO SMALL (  $K \le 10$  ) CONSTRAINT-LENGTH CODES; ARE USED WHERE A MODERATE ERROR-PROBABILITY IS SUFFICIENT (  $10^{-4}$  TO  $10^{-5}$  ); AND VERY HIGH DATA RATES ( 10s OF MBPS )

### **Sequential Decoding**

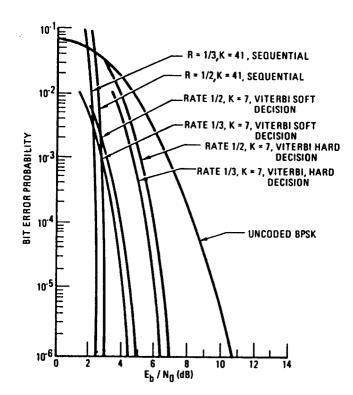
- DECODER COMPLEXITY IS INDEPENDENT OF CONSTRAINT LENGTH
- COMPUTATIONAL EFFORT (COMPLEXITY) IS VERY SENSITIVE TO CHANNEL CHARACTERISTICS AND IS RANDOM VARIABLE

- **☞** DUE TO THE RANDOMNESS AND SENSITIVITY OF COMPUTATION EFFORT TO CHANNEL CHARACTERISTICS:
  - 1. SEQUENTIAL DECODERS ARE LIMITED TO CODES WITH CODE RATE BELOW  $R_{\text{COMP}}$  (= COMPUTATIONAL CUT-OFF RATE)



- 2. BUFFER TO STORE INCOMING DATA TO DECODER AND SPEED OF DECODER ARE ALSO RANDOM AND CANNOT BE SET FOR PARTICULAR APPLICATION. SETTING THEM FIXED WILL CAUSE A LARGE VARIABILITY OF DECODING PERFORMANCE (WITH JUST A VERY SLIGHT CHANGE IN Eb/No). THIS IS THE REASON FOR THE VERY STEEP GRAPH FOR THE ERROR PERFORMANCE OF SEQUENTIAL DECODERS
- 3. VERY SENSITIVE TO BURSTY NOISE PATTERN
- SEQUENTIAL DECODERS ARE USED IF HIGH PERFORMANCE (Pb < 10-5) IS REQUIRED. HIGH PERFORMANCE CAN BE ACHIEVED BY USING LARGE CONSTRAINT-LENGTH CODES. THEIR USED ARE RESTRICTED TO WELL-BEHAVED MEMORYLESS CHANNELS SUCH AS THE SPACE AND SATELLITE CHANNELS AT MODERATE SPEED ( ~ 5 MBPS)

### Viterbi Decoder Performance Rate 1/2 vs Rate 1/3 K = 7 Hard vs Soft



### **Summary On Convolutional Codes**

- ENCODER REPRESENTATION AND CODEWORDS GENERATION:
  - 1. CONNECTION PICTORIAL
  - 2. STATE DIAGRAM
  - 3. CONNECTION VECTORS OR POLYNOMIALS
  - 4. TREE DIAGRAM
  - 5. TRELLIS DIAGRAM
- DECODING TECHNIQUES:
  - RELATIONSHIP BETWEEN MAXIMUM LIKELIHOOD DECODING AND HAMMING DISTANCE
  - HARD AND SOFT DECISION CHANNEL MODELS
  - VITERBI DECODING ALGORITHM:
    - ⇒ CUMMULATIVE HAMMING DISTANCE OF A PATH: PATH METRIC
    - ⇒ SELECTION OF SURVIVOR PATH FROM THE TWO PATHS WHICH MERGED
    - $\Rightarrow$  PATH MEMORY: U = h.2<sup>K-1</sup>
  - SEQUENTIAL DECODING: FANO AND STACK ALGORITHMS
  - ADVANTAGES AND DISADVANTAGES BETWEEN VITERBI AND SEQUENTIAL DECODINGS
- PROPERTIES OF CONVOLUTIONAL CODES:
  - DISTANCE PROPERTIES AND TRANSFER FUNCTION
  - CATASTROPHIC ERROR