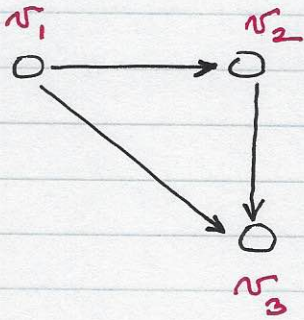
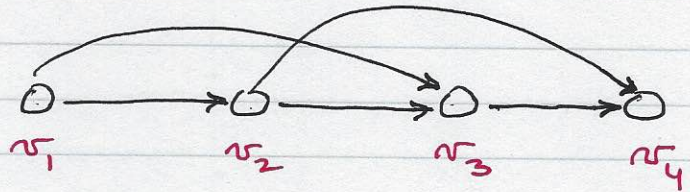


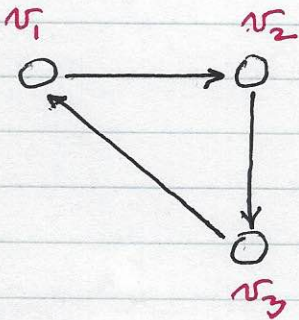
EXAMPLES



NO CYCLES

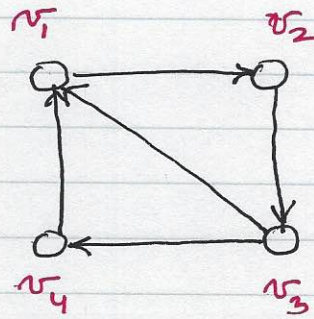


NO CYCLES



CYCLE

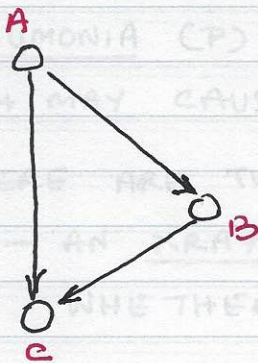
(CLOSED LOOP)



CYCLES

DIRECTED GRAPHICAL MODEL

TERMINOLOGY

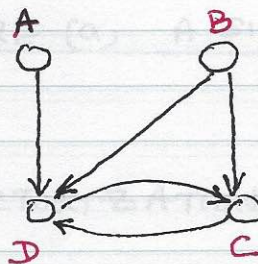


- NODE OF A IS PARENT OF NODE B
- NODE B IS CHILD OF NODE A
- A NODE REPRESENTS AN EVENT / RANDOM VARIABLE
- FOR EACH CONDITIONAL DISTRIBUTION ADD LINKS (ARROWS)
- FOR $P(C|A, B)$ HAVE LINKS (A, C) AND (B, C)

$$P(A, B, C) = P(A) P(B|A) P(C|A, B)$$

- $P(A, B, C)$ IS SPECIFIED BY PRODUCT OF THREE TERMS.
- THERE ARE THREE TERMS, AND EACH TERM IS A DISTRIBUTION. IT COULD BE SPECIFIED BY A TABLE.

EXAMPLE



$$\begin{aligned} P(A, B, C, D) \\ = P(A) P(B) P(C|B, D) P(D|A, B, C) \end{aligned}$$

□

EXAMPLE A SIMPLE YET SERIOUS EXAMPLE OF BAYESIAN NW,

- SHOWS INTERACTION BETWEEN TWO POTENTIAL DISEASES:

PNEUMONIA (P); AND TUBERCULOSIS (T).

BOTH MAY CAUSE A PATIENT TO HAVE LUNG INFILTRATES (I)

- THERE ARE TWO SEPARATE TESTS THAT CAN BE PERFORMED

- AN XRAY (X) CAN BE TAKEN, WHICH MAY INDICATE WHETHER THE PATIENT HAS LUNG INFILTRATES.

- THERE IS A SEPARATE SPUTUM SMEAR (S) TEST FOR TUBERCULOSIS.

- FIGURE (a) SHOWS DEPENDABILITY STRUCTURE.

- ALL VARIABLES P, T, I, X, S ARE BOOLEAN

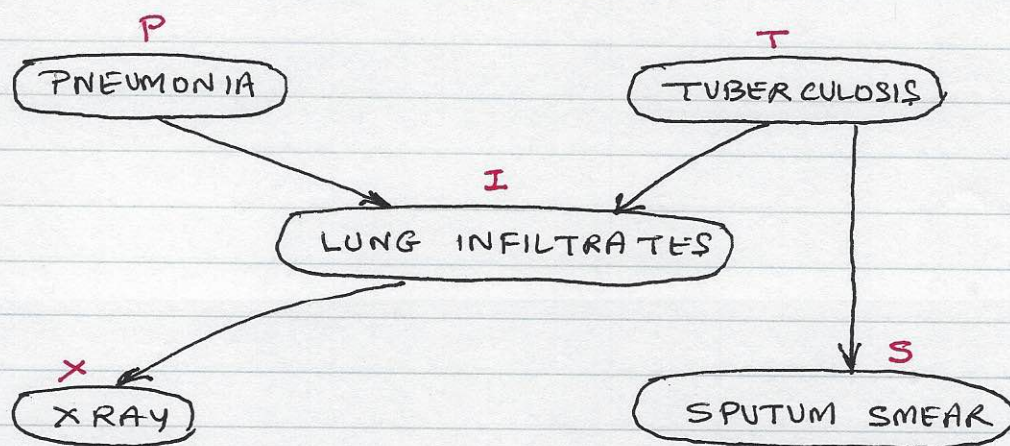


FIGURE (a), A SIMPLE BAYESIAN NETWORK FOR TWO POTENTIAL DISEASES.

- FACTORIZATION FOR $P(P, T, I, X, S)$

$$P(P, T, I, X, S) = P(P) P(T) P(I|P, T) P(X|I) P(S|T)$$

FIGURE (b) SHOWS CONDITIONAL PROBABILITY DISTRIBUTIONS FOR EACH RANDOM VARIABLE.

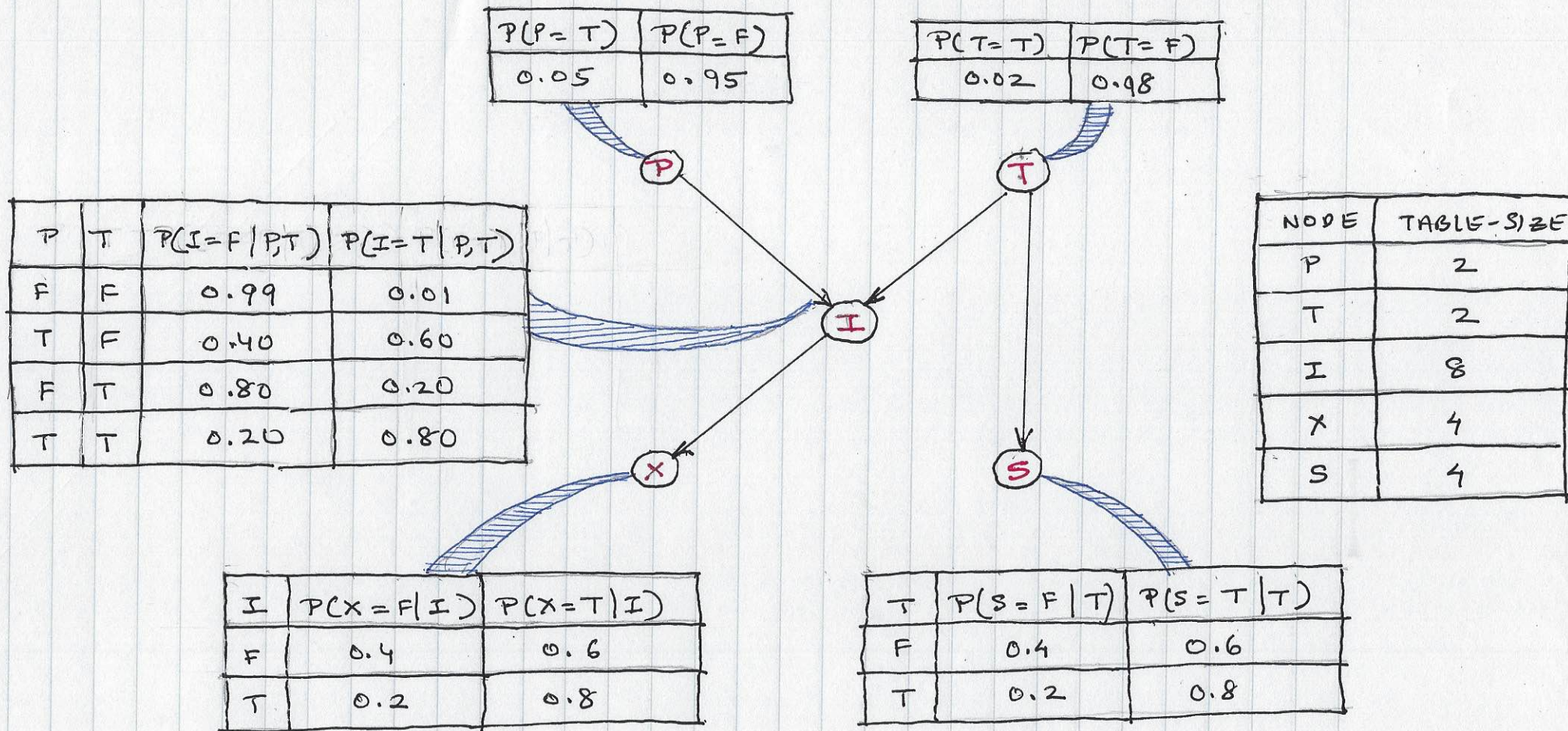
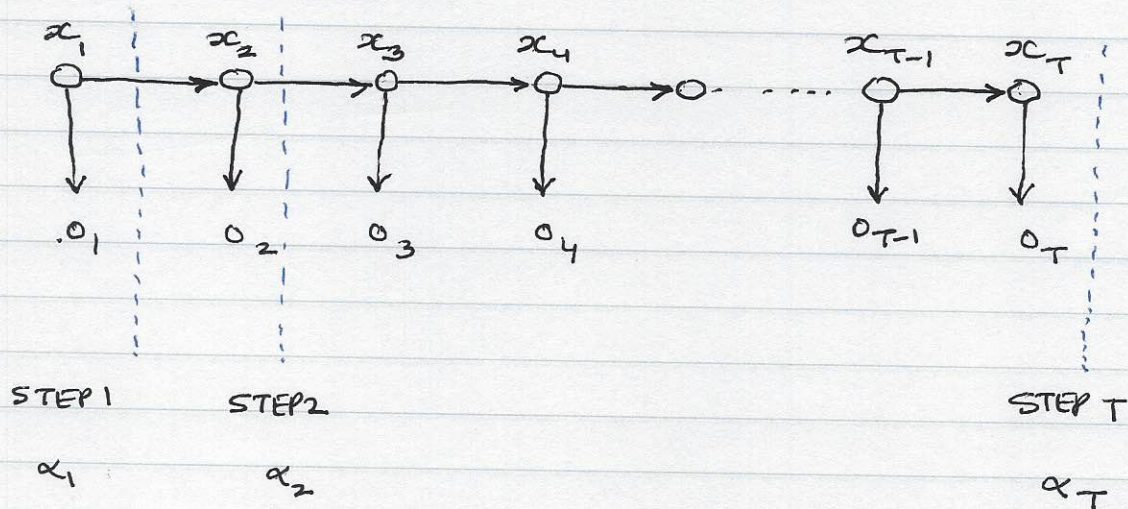


FIG (6) A SIMPLE BAYESIAN NW FOR TWO POTENTIAL DISEASES
& CORRESPONDING PROBABILITY TABLES

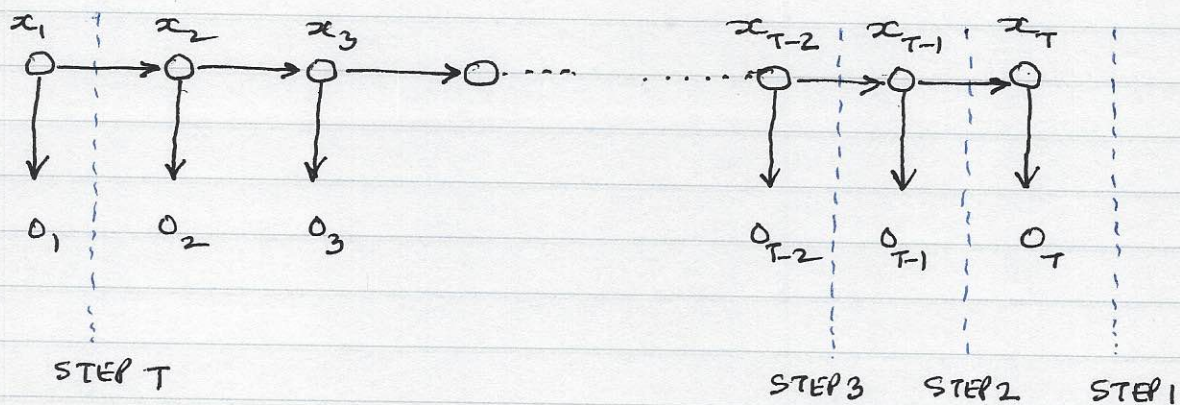
TOTAL TABLE ENTRIES = 20 ; TOTAL POSSIBILITIES = $2^5 = 32$.

EXAMPLE HIDDEN MARKOV MODEL (HMM)

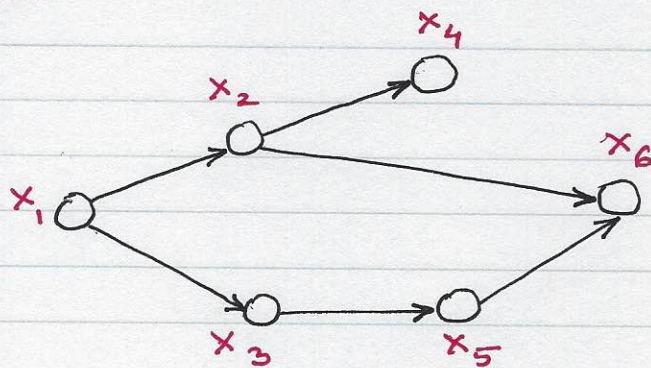
FORWARD ALGORITHM:



BACKWARD ALGORITHM



EXAMPLE



RANDOM VARIABLES ARE: $\{x_1, x_2, x_3, x_4, x_5, x_6\}$

\emptyset NULL SET

$$\Theta_1 = \{x_1\}; \quad \Theta_2 = \{x_1\}; \quad \Theta_3 = \{x_1\}; \quad \Theta_4 = \{x_2\}$$

$$\Theta_5 = \{x_3\}; \quad \Theta_6 = \{x_2, x_5\}$$

THE GRAPH DEFINES A FACTORIZATION OF THE JOINT DISTRIBUTION IN TERMS OF CONDITIONAL DISTRIBUTIONS $P(x_i | \Theta_i)$

$$P(x_1, x_2, \dots, x_6) = P(x_1) P(x_2 | x_1) P(x_3 | x_1) P(x_4 | x_2) \cdot P(x_5 | x_3) P(x_6 | x_2, x_5)$$

□

EXAMPLES ON GRAPHICAL MODELING

EXAMPLE EVENT B IS CONDITIONALLY INDEPENDENT OF EVENT A, GIVEN EVENT C. THAT IS,

$$P(B|A, C) = P(B|C)$$



JOINT PROBABILITY $P(A, B, C) = ?$

SOLUTION:

i) VIA CONDITIONAL DISTRIBUTIONS (USE PARENT RULE)

$$P(A, B, C) = P(A) P(C|A) P(B|C)$$

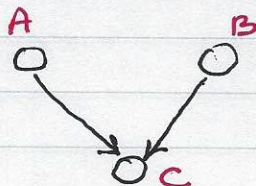
ii) VIA PRODUCT RULE:

$$\begin{aligned} P(A, B, C) &= P(A) P(C|A) P(B|A, C) \\ &= P(A) P(C|A) P(B|C) \end{aligned}$$

□

EXAMPLE

EVENT A INDEPENDENT OF EVENT B. $\Rightarrow P(B|A) = P(B)$



JOINT $P(A, B, C) = ?$

SOLUTION:

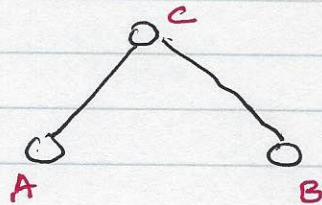
i) VIA PARENT RULE: $P(A, B, C) = P(A) P(B) P(C|A, B)$

ii) VIA PRODUCT RULE:

$$\begin{aligned} P(A, B, C) &= P(A) P(B|A) P(C|A, B) \\ &= P(A) P(B) P(C|A, B) \end{aligned}$$

EXAMPLE

EVENT B IS CONDITIONALLY INDEPENDENT OF EVENT A, GIVEN EVENT C. $\Rightarrow P(B|A, C) = P(B|C)$



JOINT $P(A, B, C) = ?$

SOLUTION:

i) VIA PARENT RULE: $P(A, B, C) = P(C) P(A|C) P(B|C)$

ii) VIA PRODUCT RULE:

$$\begin{aligned} P(A, B, C) &= P(C) P(A|C) P(B|A, C) \\ &= P(C) P(A|C) P(B|C) \end{aligned}$$