

Paper discussion.

06-04-2022

→ Uncertainty.

- Based on evidence in KB agents predict the future.

eg: In KB: $A \rightarrow B$ if A is true, then B is true.

But consider a situation where we are not sure about whether A is true or not. Then we cannot express this statement, this situation → uncertainty.

- So to represent uncertain knowledge, where we are not sure about the predicates, we need uncertain reasoning / probabilistic reasoning.

→ Cause of uncertainty.

- Information occurred from unreliable sources
- Experimental errors
- Equipment fault
- Temperature variation
- Climate change

→ how to solve this → Probabilistic reasoning

- way of knowledge representation.

we combine probability theory with logic to handle the uncertainty

- we use probability in PR because it provides a way to handle uncertainty that is the result of someone's laziness & ignorance

→ Need of probabilistic reasoning in AI:

- when there are unpredictable outcomes
- when specifications / possibilities of predicates becomes too large to handle.

→ When an unknown error occurs during an experiment

2 ways to solve problems with uncertain knowledge $\left\{ \begin{array}{l} \text{Bayes' rule} \\ \text{Bayesian statistics} \end{array} \right.$

→ probability, event, sample space, Random Variables, prior probability, posterior probability

each possible outcome of variable \rightarrow collection of all possible events \rightarrow used to represent the event of objects in world.

probability computed before observing new info \rightarrow probability that is calculated after all evidence/info has taken into account

conditional probability

probability of A under conditions of B.

$P(A \cap B) \rightarrow$ joint probability of A and B.

$P(B) \rightarrow$ marginal probability of B.

$$P(A/B) = \frac{P(A \cap B)}{P(B)}$$

08-04-2022

Bayes rule

way of finding probability when we know certain other probabilities

$$P(A/B) = \frac{P(B/A) \cdot P(A)}{P(B)}$$

A & B are events

$P(B) \neq 0$

$P(A/B)$ is a conditional probability of event A occurring given that B is true

(also called as Posterior probability of A given B)

$P(B/A)$ can be interpreted as likelihood of A given fixed B, because $P(B/A) = L(A/B)$

conditional probability of event B occurring given that A is true

$P(A) \neq P(B)$ are probabilities of observing A and B respectively without any given condition.

(known as marginal probability / prior probability)

A and B must be different events

2 Planning a picnic

① 50% of all rainy days start off cloudy

② But cloudy mornings are common. $\left\{ \begin{array}{l} \text{abt 20\% of days} \\ \text{start cloudy} \end{array} \right\}$

③ and this is usually a dry month

(only 3 of 30 days tend to be rainy - or 10%)

What is the chance of rain during a cloudy day?

$$P(\text{rain} / \text{cloudy}) = \frac{P(\text{cloudy} / \text{rain}) \times P(\text{rain})}{P(\text{cloudy})}$$

$$\frac{50 \times 10}{40} = 12.5\%$$

Q From a standard deck of playing cards a single card is drawn. Probability that card is king is $4/52$. Then calculate posterior probability $P(\text{king} / \text{face})$ which means face card is a king card?

posterior probability $\rightarrow P(A/B) = \frac{P(B/A) \times P(A)}{P(B)}$

$$P(\text{king} / \text{face}) = \frac{P(\text{face} / \text{king}) \times P(\text{king})}{P(\text{face})} \rightarrow \frac{1 \times 4/52}{12/52} \Rightarrow \frac{1 \times 1/13}{3/13} = 1/3$$

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Q What is probability that a patient has disease with stiff neck?
 it occurs 80% of time. the known probability that a patient has a disease is $1/30,000$ and known probability that a patient has a stiff neck is 2%.

(a) = stiff neck (b) = disease

$$P(b|a) = \frac{P(a|b) \times P(b)}{P(a)} \Rightarrow \frac{\frac{80}{100} \times \frac{1}{30,000}}{\frac{2}{100}} \Rightarrow \frac{1}{250} \approx 0.133$$

Q ABC companies produce 25% 35% 40% bolts out of total. 5% 4% 2% are defective. A bolt drawn at random from products. If bolt drawn is found defective, what is probability it is manufactured by B?

$$P(\text{company: B} / \text{bolt is defective}) = \frac{P(\text{defective} | B) \times P(B)}{P(\text{defective})}$$

$$P(B | \text{defective}) \Rightarrow \frac{\frac{4}{100} \times \frac{35}{100}}{\left(\frac{25}{100}\right)\left(\frac{5}{100}\right) + \left(\frac{35}{100}\right)\left(\frac{4}{100}\right) + \left(\frac{40}{100}\right)\left(\frac{2}{100}\right)} = \frac{28}{69}$$

Q Man is known to speak truth 3 out of 4 times. he says on a throw. "it is a six". what is probability it is actually a six.

$$P(E_1) = 1/6 \quad P(E_2) = 5/6 \quad \text{— occurrence of number other than 6}$$

$$P(A|E_1) = 3/4 \quad P(A|E_2) = 1/4$$

truth lie

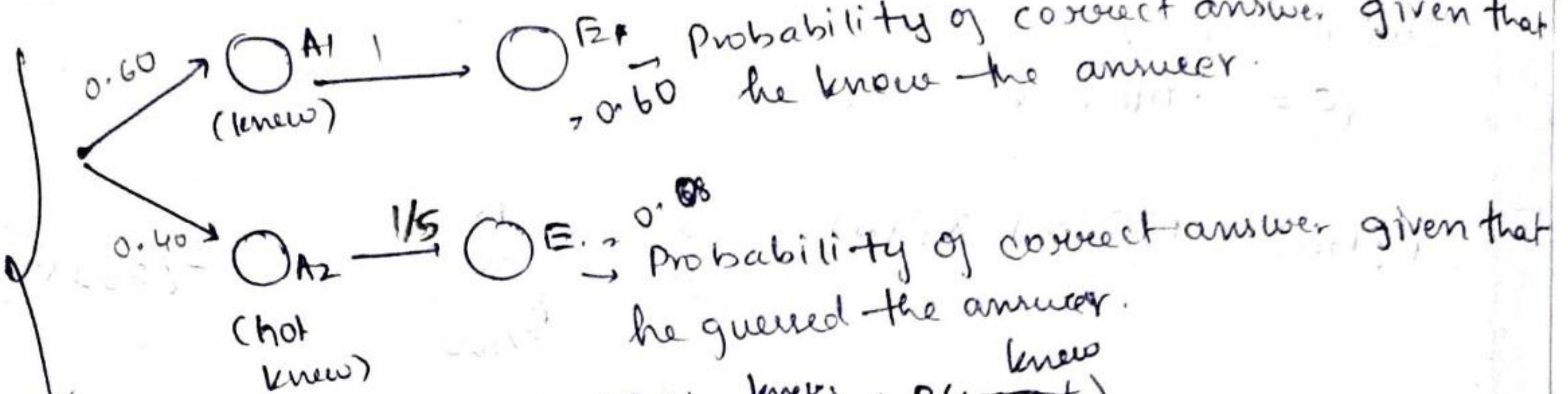
$$P\left(\frac{E_1}{A}\right) = \frac{P(A|E_1) \times P(E_1)}{P(A)}$$

$$\frac{3/4 \times 1/6}{\left(\frac{1}{6}\right)\left(\frac{3}{4}\right) + \left(\frac{5}{6}\right)\left(\frac{1}{4}\right)} = 3/8$$

Q Bag A → 3R balls 4G balls
 Bag B → 4R balls 5 green balls
 one ball is drawn at random from one of the bags & found to be red. what is probability that it was drawn from Bag A?

$$P(\text{Bag A} / \text{red}) = \frac{P(\text{red} | \text{Bag A}) \times P(\text{Bag A})}{P(\text{red})} = \frac{\frac{3}{7} \times \frac{1}{2}}{\left(\frac{1}{2}\right)\left(\frac{3}{7}\right) + \left(\frac{1}{2}\right)\left(\frac{4}{9}\right)} = \frac{27}{55}$$

Q. Student knew only 60% of questions in test each with 5 answers. he simply guessed the ~~answers~~ while answering. what is probability that he knew answer to a question given that he answered correctly.



$$P(\text{correct} / \text{knew}) = \frac{P(\text{knew} / \text{correct}) \times P(\text{knew})}{P(\text{knew} / \text{correct}) \times P(\text{knew}) + P(\text{not knew} / \text{correct}) \times P(\text{not knew})}$$

$$P(\text{correct}) = 0.68$$

$$\Rightarrow \frac{1 \times 0.60}{0.68} \Rightarrow 0.88235$$

Q. Bag \rightarrow 3W 5B, 4 balls are transferred into an empty bag. From this bag, a ball is drawn and is found to be white. what is probability that out of 4 balls transferred 3 are white and 1 is black.

$$\begin{array}{l} 3W \ 5B \rightarrow 0W \ 4B \rightarrow \frac{3C1 \times 5C4}{8C4} \Rightarrow 1/14 \\ \quad \quad \quad 1W \ 3B \rightarrow 6/14 \\ \quad \quad \quad 2W \ 2B \rightarrow 6/14 \\ \quad \quad \quad 3W \ 0B \rightarrow 1/14 \end{array}$$

probability of selecting a Bag.

$$P(3W \ 1B / \text{white}) \Rightarrow \frac{P(3W \ 1B) \times P(\text{white} / 3W \ 1B)}{P(\text{white})}$$

$$P(\text{white})$$

$$\begin{aligned} & \left(\frac{1}{14} \right) (0) + \left(\frac{6}{14} \right) \left(\frac{1}{4} \right) + \left(\frac{6}{14} \right) \left(\frac{2}{14} \right) + \left(\frac{1}{14} \right) \left(\frac{3}{4} \right) \\ & = \frac{1}{7} \end{aligned}$$

⇒ Markov Model { Present value can decide future value } { purely based on } { Probabilities }

• weather.

State 1: Rainy
State 2: Cloudy
State 3: Sunny.

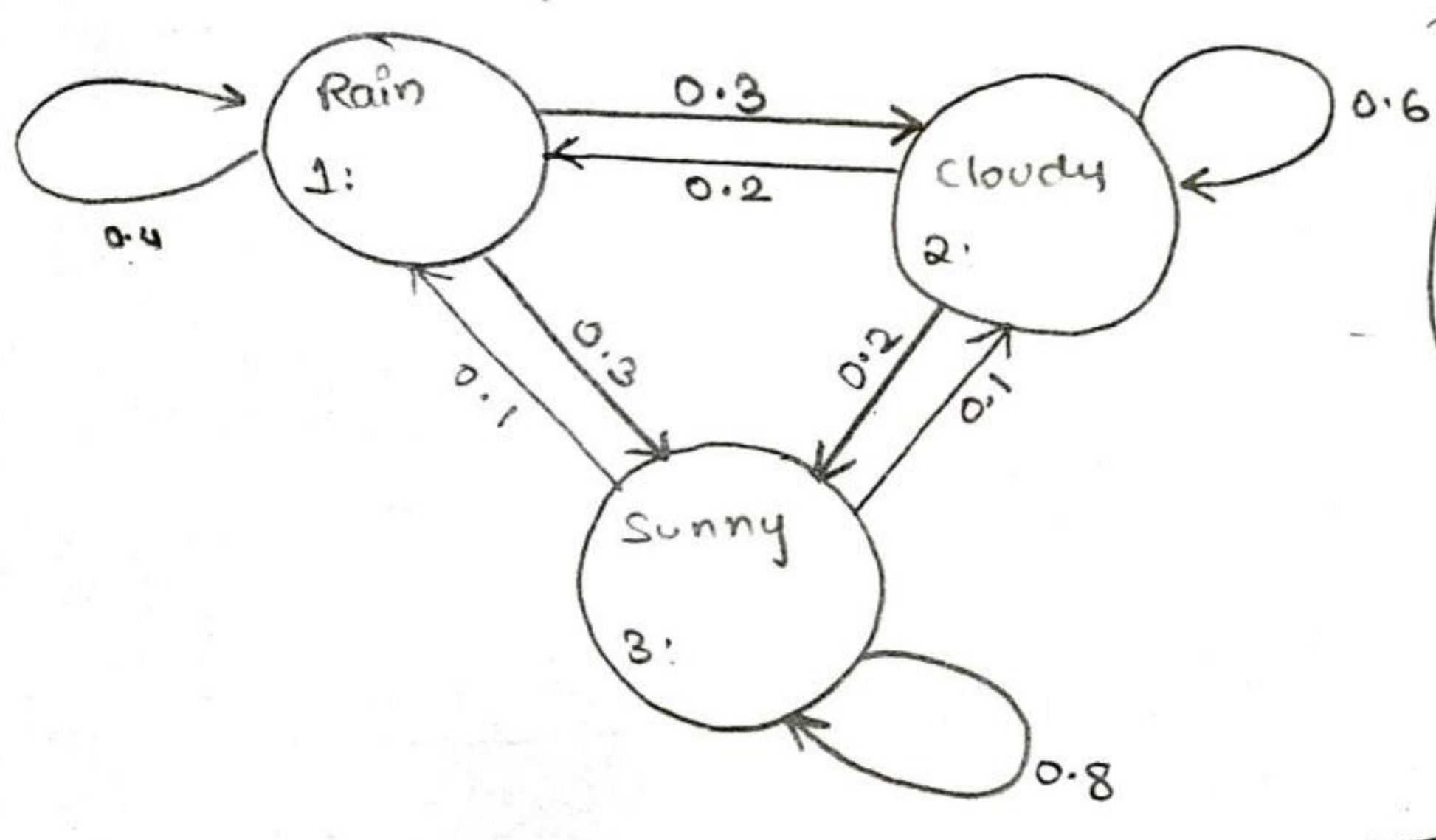
the weather of some city found following weather pattern.

		Tommorrows		
		Rainy	cloudy	Sunny
Today	Rainy	0.4	0.3	0.3
	Cloudy	0.2	0.6	0.2
	Sunny	0.1	0.1	0.8

if today is cloudy, 0.2 is the probability of tommorrow being Rainy.

(HMM) → hidden markov model

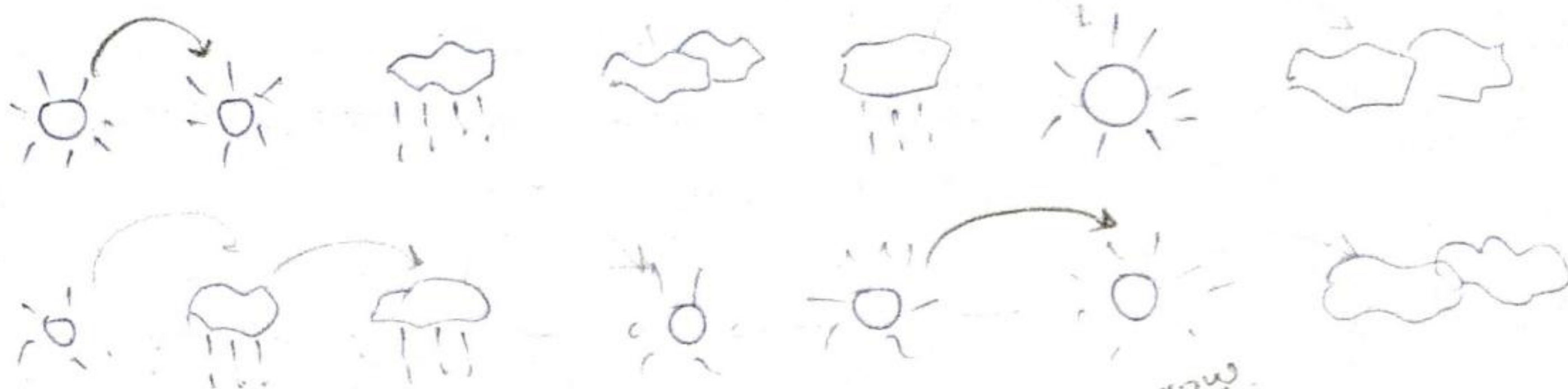
• we need to find hidden variables based on observed variables.



Graphical representation

Each State corresponds to 1 observation and then sum of outgoing edge weight is 1.

2 weeks weather



(total transitions: 13)

Sunny \rightarrow Sunny (2/13)

Today

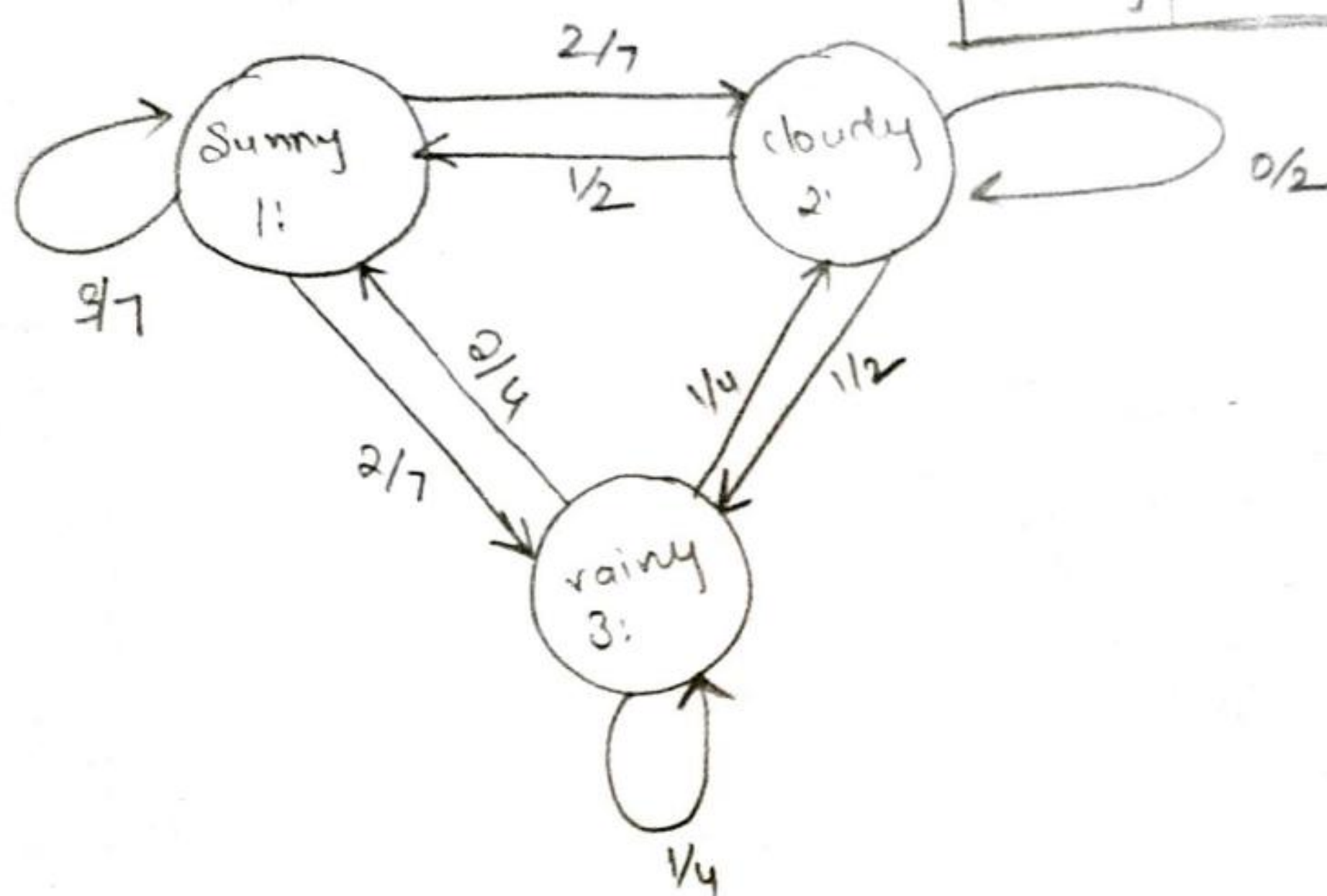
Tomorrow

	rainy	Sunny	cloudy
rainy	$\frac{1}{4} = 0.25$	$\frac{2}{4} = 0.5$	$\frac{2}{4} = 0.25$
Sunny	$\frac{2}{7} =$	$\frac{3}{7} =$	$\frac{2}{7} =$
cloudy	$\frac{4}{2} = 0.5$	$\frac{1}{2} = 0.5$	$\frac{0}{2} = 0$

— (4)

— (7)

— (2)



$$0.8 \times 0.8 \times 0.1 \times 0.4 \times 0.3 \times 0.1 \times 0.2 = 0.0001536$$

$$= 1.536 \times 10^{-4}$$

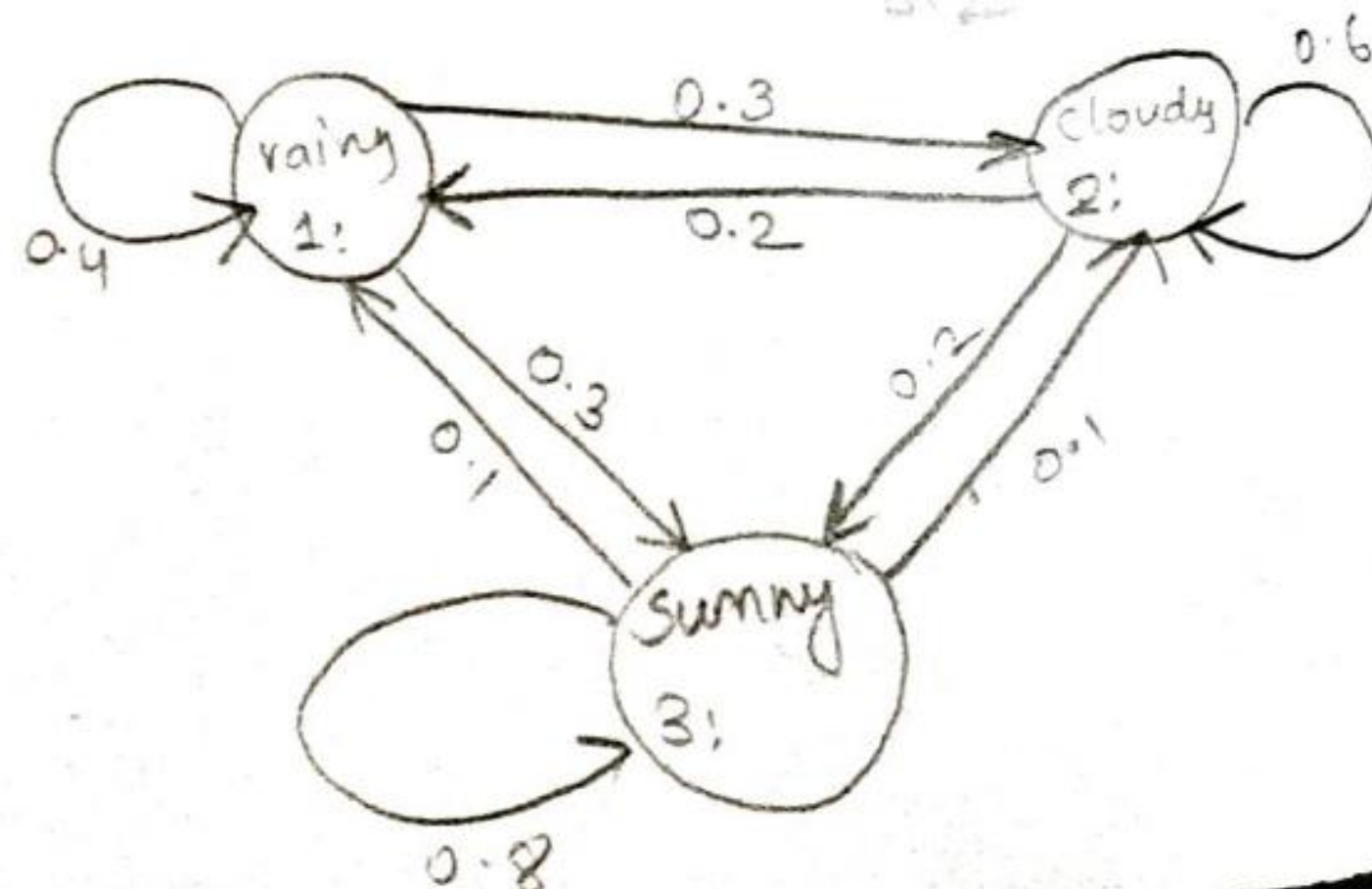
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Q What is the probability that the weather for 20-04-2022

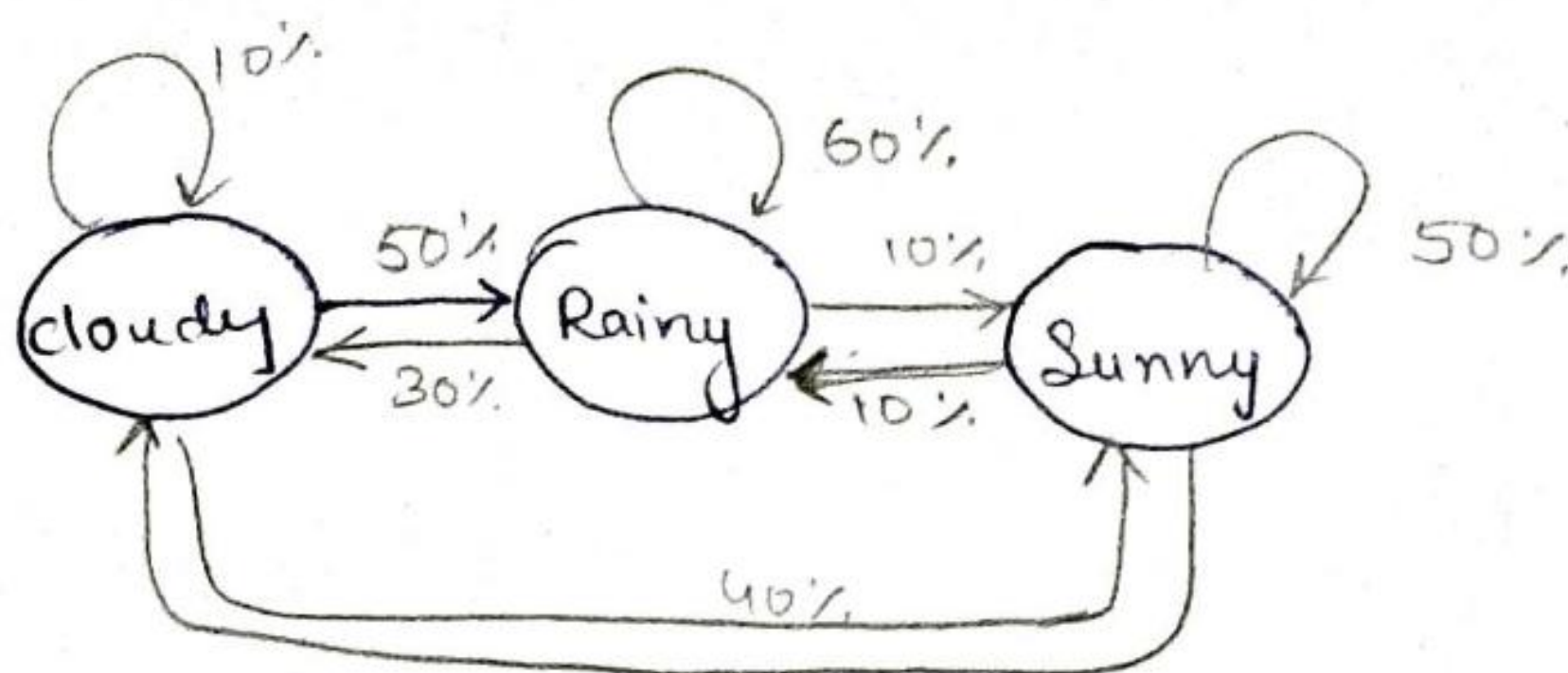
next 7 days will be the Sunny \rightarrow Sunny \rightarrow Rainy \rightarrow Rainy \rightarrow Sunny

when today is sunny?

	Sunny	rainy	cloudy
Sunny	0.8	0.1	0.1
rainy	0.3	0.4	0.3
cloudy	0.2	0.2	0.6



Q4



Graphical representation

What is the probability that "Wednesday ^{will be} cloudy", if today is Sunny.

① $\frac{\text{Sunny} - \text{Sunny} - \text{cloudy}}{0.5 \times 0.4} \Rightarrow 0.5 \times 0.4 = 0.2$

② $\frac{\text{Sunny} - \text{Rainy} - \text{cloudy}}{0.1 \times 0.3} \Rightarrow 0.3 \times 0.1 = 0.03$

③ $\frac{\text{Sunny} - \text{cloudy} - \text{cloudy}}{0.4 \times 0.1} \Rightarrow 0.4 \times 0.1 = 0.04$

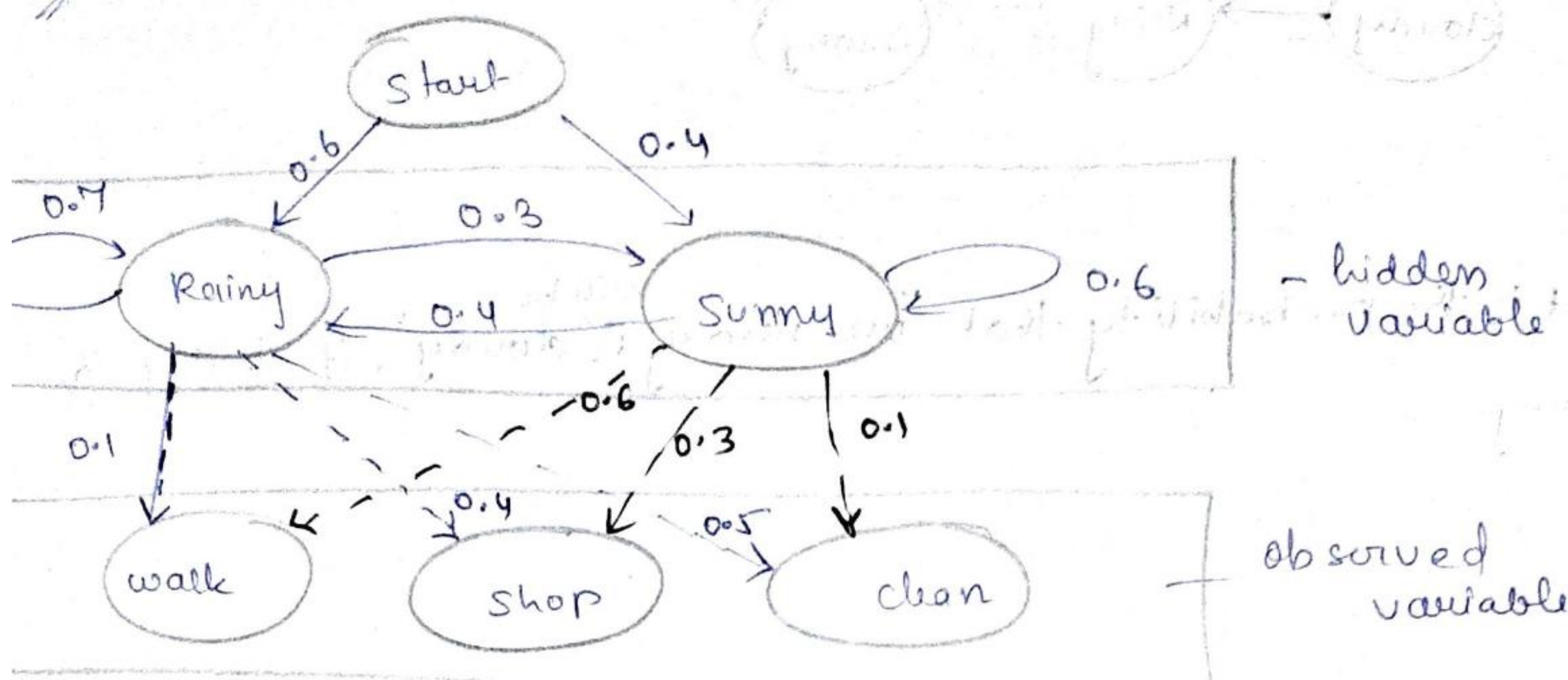
$$\begin{array}{r} 0.2 \\ 0.03 \\ 0.04 \\ \hline 0.27 \end{array}$$

∴ 27% possibility of getting cloudy on Wednesday

Applications of HMM

- user identification
 - for identifying human's mindset
 - prediction of diagnosis of disease inside body.
- (eg: identifying cancer based on its symptoms)

if a person visit restaurant during afternoon for biryani, then hidden detail is he likes Biryani.



States: Rainy, sunny.

Observation: walk, shop, clean

Start probability: Rainy (0.6)

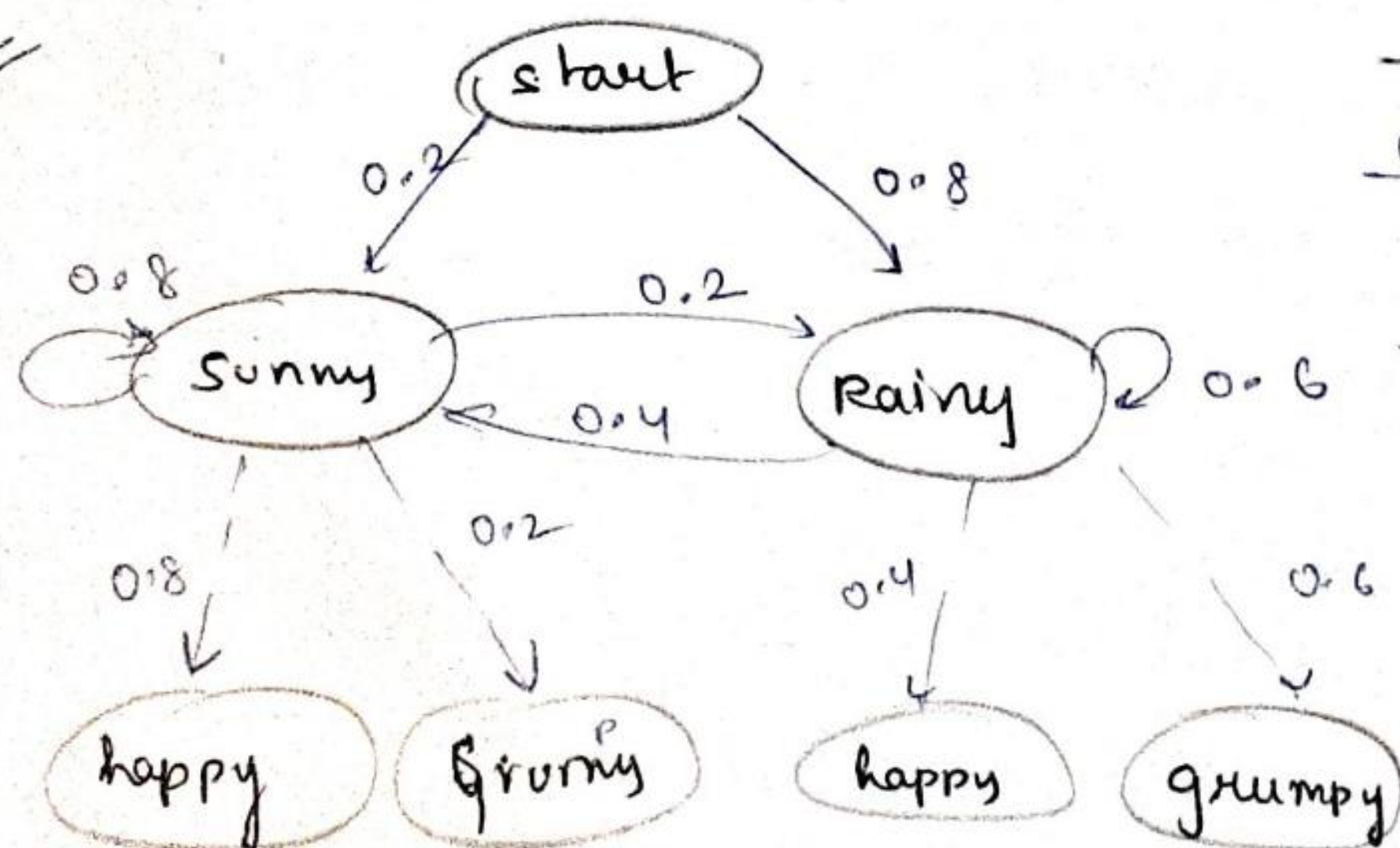
Sunny (0.4)

Transition probability:

	Rainy	Sunny
Rainy	0.7	0.3
Sunny	0.4	0.6

Emission probability

	walk	shop	clean
Rainy	0.1	0.4	0.5
Sunny	0.6	0.3	0.1



States: Sunny, rainy

Observation: happy, grumpy

Start probabilities: Sunny (0.2)

rainy (0.8)

Transition probability:

	Sunny	Rainy
Sunny	0.8	0.2
Rainy	0.4	0.6

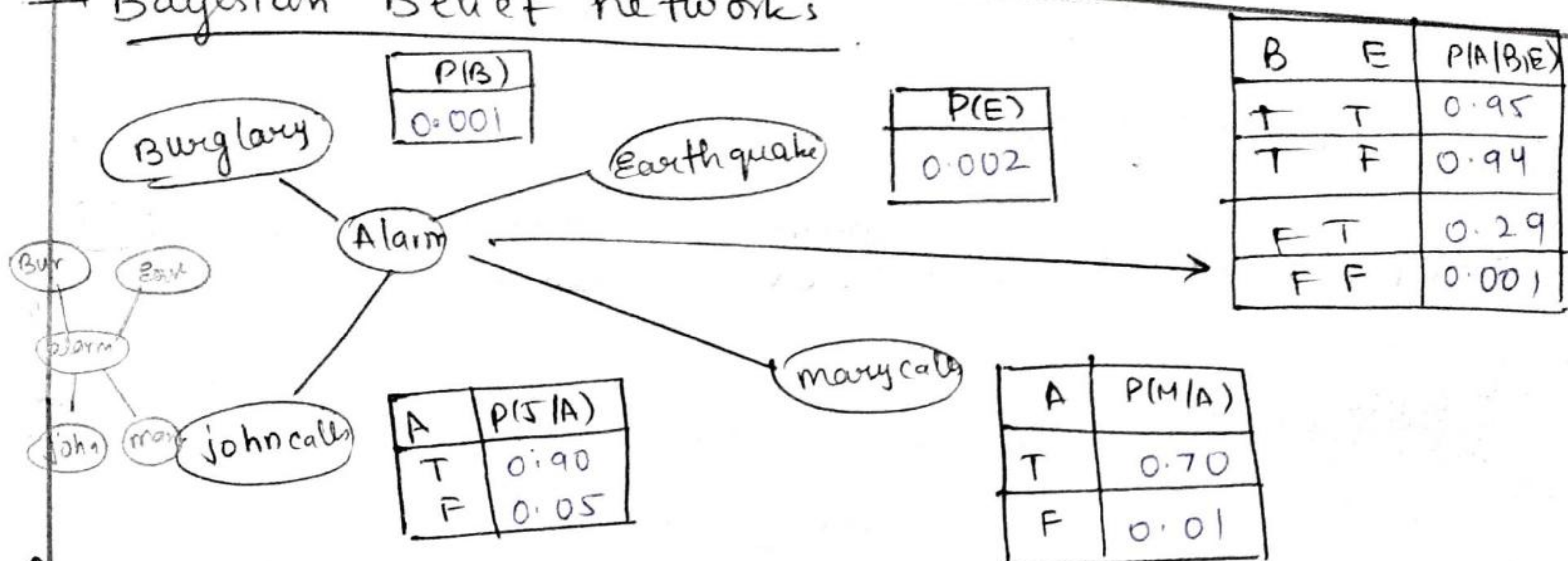
Emission prob.

happy grumpy

	happy	grumpy
Sunny	0.8	0.2
Rainy	0.4	0.6

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Bayesian Belief networks



Q What is probability that alarm has sounded but neither a burglary nor an earthquake has occurred & both John & Mary call?

alarm sound (✓) } $P(J|A)$
 burglary (X) } $0.999 \times 0.998 \times 0.001 \times 0.90 \times 0.7$
 earthquake (X) }
 John & Mary (✓) } $= 0.00062$

Q What is probability that John call?

John call (alarm ✓)

John call (alarm X)

0.90 [] 0.05 []

$(0.95)(0.001)(0.002) + (0.94)(0.001)(0.998) + (0.29)(0.999)(0.002) + (0.001)(0.998)(0.998)$
 $= 0.0000019 + 0.00093812 + 0.00057942 + 0.000990016$
 $= 0.002509$

$0.05 (0.001)(0.002) + (0.06)(0.001)(0.998) + (0.71)(0.999)(0.002) + (0.999)(0.999)(0.998)$
 $= 0.9974$

$= 0.0521$

Q What is probability that there is burglary given that John & Mary calls.

John call (alarm, burglary ✓)

$$P(b|j,m) \propto P(b) \cdot P(j|a) \cdot P(m|a) \cdot P(a|b,e) \cdot P(e)$$

$$\Rightarrow \propto P(b) \cdot P(j|a) \cdot P(m|a) \times \left\{ \begin{matrix} \text{alarm} \\ b \vee e \vee \end{matrix} + \begin{matrix} \text{alarm} \\ b \vee e \times \end{matrix} \right\}$$

$$= \propto P(b) \left\{ \begin{matrix} \text{alarm} \vee \\ b \vee e \vee \end{matrix} + \begin{matrix} \text{alarm} \vee \\ b \vee e \times \end{matrix} \right\} + \left\{ \begin{matrix} \text{alarm} \times \\ b \vee e \vee \end{matrix} + \begin{matrix} \text{alarm} \times \\ b \vee e \times \end{matrix} \right\}$$

$$= \propto \left[(0.90)(0.70) \left[(0.95)(0.001)(0.002) + (0.94)(0.001)(0.998) \right] + (0.05)(0.01) \left[(0.05)(0.001)(0.002) + (0.41)(0.998)(0.001) \right] \right]$$

$$= \propto (0.00059)$$

find $P(\neg b|j,m) \rightarrow \propto 0.0015$

$$P(b|j,m) = \frac{\propto + P(b|j,m)}{478.5 + 0.0059}$$

burglar given john & mary

burglar
john
mary

$$\propto = \frac{1}{P(b|j,m) + P(\neg b|j,m)}$$

$$\propto = \frac{1}{0.00059 + 0.0015 //}$$

$$= \underline{\underline{478.5}}$$

$$P(b|j,m) + P(\neg b|j,m) = 1$$

joint probability

$$P(b,j,m) \Rightarrow P(b) \times P(j|b) \times P(m|b)$$

conditional probabilities