

BAYES THEOREM

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Let $X \rightarrow$ data sample whose class label is unknown

$H \rightarrow$ hypothesis such as that the data sample X belongs to a specified class C .

$P(H/X) \rightarrow$ probability that the hypothesis H holds the given observed data sample X .

It is the posterior prob of H conditioned on X .

Ex. Suppose the world of data sample consists of fruits described by their color and shape.

Suppose that X is Red and Brown and that H is the hypothesis that X is an apple. Then $P(H/X)$ reflects our confidence that X is an apple given that we have seen that X is Red and Brown.

$P(H)$ - This is the prior probability and it is independent of X .

$P(X/H)$ - This is the posterior probability of X conditioned on H .

Bayes theorem is

$$P(H/X) = \frac{P(X/H) P(H)}{P(X)}$$

①⑩	Rid	age	income	student	credit rating	class % buys computer
1	<u>youth</u>	high		no	fair	no
2	<u>youth</u>	high		no	excellent	no
3	<u>mid</u>	high		no	fair	<u>yes</u>
4	senior	medium		no	fair	<u>yes</u>
5	senior	low		yes	fair	<u>yes</u>
6	senior	low		yes	excellent	no
7	<u>mid</u>	low		yes	excellent	<u>yes</u>
8	<u>youth</u>	medium		no	fair	no
9	<u>youth</u>	low		yes	fair	<u>yes</u>
10	senior	medium		yes	fair	<u>yes</u>
11	<u>youth</u>	medium		yes	excellent	<u>yes</u>
12	<u>mid</u>	medium		no	excellent.	<u>yes</u>
13	<u>mid</u>	high		yes	fair	<u>yes</u>
14	senior	medium		no	excellent	no

Q10 predict the class label of an unknown sample using Naive Bayesian Classification on the following training dataset from all electronics customer database.

The unknown sample to classify is .

$X = (\text{age} = \text{"youth"}, \text{income} = \text{"medium"}, \text{student} = \text{"yes"}, \text{credit-rating} = \text{"fair"})$

Ans) Maximise $P(X|C_i) P(C_i)$ for $i=1,2$
 $P(C_i)$ is the prior probability of each class .

$$P(\text{buys-computer} = \text{"Yes"}) = 9/14 = 0.643$$

$$P(\text{buys-computer} = \text{"No"}) = 5/14 = 0.357 .$$

To Compute $P(X|C_i)$ for $i=1,2$ we compute following conditional probabilities .

$$P(\text{age} = \text{"youth"} | \text{buys-computer} = \text{"Yes"}) = 2/9 = 0.222$$

$$P(\text{age} = \text{"youth"} | \text{buys-computer} = \text{"No"}) = 3/5 = 0.6$$

$$P(\text{income} = \text{"medium"} | \text{buys-computer} = \text{"Yes"}) = 4/9 = 0.444$$

$$P(\text{income} = \text{"medium"} | \text{buys-computer} = \text{"No"}) = 2/5 = 0.4$$

$$P(\text{student} = \text{"Yes"} | \text{buys-computer} = \text{"Yes"}) = 6/9 = 0.667$$

$$P(\text{student} = \text{"Yes"} | \text{buys-computer} = \text{"No"}) = 1/5 = 0.2$$

$$P(\text{credit-rating} = \text{"Yes"} | \text{buys-computer} = \text{"Yes"}) = 6/9 = 0.667$$

$$P(\text{credit-rating} = \text{"Yes"} | \text{buys-computer} = \text{"No"}) = 2/5 = 0.4$$

using the above probabilities we obtained .

$$P(X \mid \text{buys-computer} = \text{"Yes"})$$

$$= 0.222 \times 0.444 \times 0.667 \times 0.667 \\ = 0.044$$

$$P(X \mid \text{buys-computer} = \text{"No"})$$

$$= 0.6 \times 0.4 \times 0.2 \times 0.4 \\ = 0.019$$

$$P(X \mid \text{buys-computer} = \text{"Yes"}) P(\text{buys-computer} = \text{"Yes"})$$

$$= 0.044 \times 0.643 \\ = 0.028$$

$$P(X \mid \text{buys-computer} = \text{"No"}) P(\text{buys-computer} = \text{"No"})$$

$$= 0.019 \times 0.357 \\ = 0.007$$

Since, 0.028 is greater than 0.007 i.e $0.028 > 0.007$

Therefore, the Naïve Bayesian classifier predicts

$\text{buys-computer} = \text{"Yes"}$ for the sample X :

∴ $X = (\text{age} = \text{"youth"}, \text{income} = \text{"medium"}, \text{student} = \text{"yes"}, \text{credit-rating} = \text{"fair"}, \text{buys-computer} = \text{"Yes"})$

Q20 predict a class label of an unknown sample X

$X = (\text{outlook} = \text{"Rain"}, \text{temp} = \text{"cool"}, \text{humidity} = \text{"Normal"}, \text{wind} = \text{"strong"}, \text{play-football} = ?)$

Maximise

Minimise $P(X|C_i) P(C_i)$ for $i=1,2$ $P(C_i)$ is the prior probability of each class.

$$P(\text{plays-football} = \text{"yes"}) = 9/14 = 0.643$$

$$P(\text{plays-football} = \text{"No"}) = 5/14 = 0.357$$

To compute $P(X|C_i)$ for $i=1,2$ we compute following conditional probability,

$$P(\text{outlook} = \text{"Rain"} | \text{play-football} = \text{"Yes"}) = 3/9 = 0.333$$

$$P(\text{outlook} = \text{"Normal"} | \text{play-football} = \text{"No"}) = 2/5 = 0.4$$

$$P(\text{temp} = \text{"cool"} | \text{play-football} = \text{"Yes"}) = 3/9 = 0.333$$

$$P(\text{temp} = \text{"Normal"} | \text{play-football} = \text{"No"}) = 1/5 = 0.2$$

$$P(\text{humidity} = \text{"Normal"}, \text{play-football} = \text{"Yes"}) = 6/9 = 0.667$$

$$P(\text{humidity} = \text{"Normal"}, \text{play-football} = \text{"No"}) = 1/5 = 0.2$$

$$P(\text{wind} = \text{"Strong"}, \text{play-football} = \text{"Yes"}) = 3/9 = 0.333$$

$$P(\text{wind} = \text{"Strong"}, \text{play-football} = \text{"No"}) = 3/5 = 0.6$$

using the above probabilities we obtained

$$P(X | \text{play-football} = \text{"Yes"}) = 0.333 \times 0.333 \times 0.667 \times 0.333 \\ = 0.025$$

$$P(X | \text{play-football} = \text{"No"}) = 0.4 \times 0.2 \times 0.2 \times 0.6$$

$$= 9.6 \times 10^{-3} = 0.0096$$

$$P(X | \text{play - football} = \text{"yes"}) P(\text{play - football} = \text{"yes"})$$

$$= 0.028 \times 0.643$$

$$= \underline{\underline{0.016}}$$

No

$$P(X | \text{play - football} = \text{"no"}) P(\text{play - football} = \text{"No"})$$

$$= 0.357 \times 0.0096$$

$$\therefore \underline{\underline{3.4272 \times 10^{-3}}}$$

$$= 0.00343.$$