

Bayes Rule

CS 3130/ECE 3530:
Probability and Statistics for Engineers

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Bayes Rule

In-Class Problem:

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You have two urns, one with 4 black balls and 3 white balls, the other with 2 black balls and 2 white balls. You pick one urn at random and then select a ball from the urn. What is the probability the ball is white?

If you picked a black ball, what is the probability that you had picked the first urn (the 4 black, 3 white urn)?

Bayes Rule — Terminology

Posterior
After

likelihood.

Prior
Before

$$Pr(A|B) = \frac{Pr(B|A)Pr(A)}{Pr(B)}$$

marginalization
normalization

Bayes Rule — Meaning

Knowledge
want.

observation

state
of
observations

general
inclusion
of
world

$$Pr(A|B) = \frac{Pr(B|A)Pr(A)}{Pr(B)}$$

normalization

In-Class Problem:

You have a system with a main power supply and auxiliary power supply. The main power supply has a 10% chance of failure. If the main power supply is running, the auxiliary power supply also has a 10% chance of failure. But if the main supply fails, the auxiliary supply is more likely to be overloaded and has a 15% chance to fail. What is the probability that the auxiliary power will fail?

If the auxiliary power fails, what is the probability that the main power also failed?

A ← obs.
M ← know

$$P(M|A) = \frac{P(A|M)P(M)}{P(A)} \leftarrow \begin{array}{l} \text{total prob} \\ P(A|M)P(M) + \\ P(A|\sim M)P(\sim M) \end{array}$$

0.15 0.1

0.105

$$= \frac{.15 \times 0.1}{.105} = \frac{.015}{.105} =$$

In-Class Problem:

You work in a factory that makes sensors for airbags in automobiles. You have three machines that run continuously/simultaneously: A) the old machine makes 10 parts/hour and 10% of parts are faulty, B) a newer machine makes 20 parts/hour and 5% of parts are faulty, and C) the newest machine makes 30 parts/hour and 1% of parts are faulty. The parts get mixed in a bin and you sample one part from that bin. The part is faulty. What is the probability that the part came from machine B?

prob of part from machine A

$$P(A) = \frac{1}{6}$$

$$P(B) = \frac{2}{6}$$

$$P(C) = \frac{3}{6}$$

$$P(F|A) = .1$$

$$P(F|B) = .05$$

$$P(F|C) = .01$$

$$P(F|A)P(A) + P(F|B)P(B) + P(F|C)P(C)$$

$$= \frac{.23}{6}$$

$$P(B|F) =$$

$$\frac{.05}{\frac{.23}{6}} P(F)$$

$$= \frac{.05}{.0383} P(F)$$

$$= 0.435$$

$$\frac{(.05 / \frac{.23}{6})}{.0383} =$$

$$= .1 \times \frac{1}{6} + .05 \times \frac{2}{6} + .01 \times \frac{3}{6} =$$

In-Class Problem:

$$P(T|F)$$

$$P(F|T)$$

prob of
T given
Fugitive is
99.9%

You are given a machine learning, face recognition system for an escaped fugitive that has a true positive rate of 99.9%, and a false positive rate of 10^{-6} .

$$P(T|B)$$

Approximately 2 million people pass through airports on a given day, and you need to find where this fugitive is. You snap a picture, at random, of a passenger, and the detector says it's the fugitive. Is it more likely to be the fugitive or a bystander?

$$P(F|T) = \frac{P(T|F)P(F)}{P(T)} \leftarrow \frac{1}{2 \times 10^6} \approx .5 \times 10^{-6}$$

$$\approx 1$$

$$P(T) = \frac{1}{.119} \frac{1}{2 \times 10^6} + 10^{-6}$$

$$\frac{P(T|F)P(F)}{P(T|B)P(B)} = \frac{.5 \times 10^{-6} + 10^{-6}}{1.5 \times 10^{-6}} \approx \text{approx} \rightarrow .33$$

$$P(T|B) = 10^{-6} \quad P(B) = \frac{2 \times 10^6 - 1}{2 \times 10^6} \approx 1$$

Testing and Bayes Rule

Bayes Rule in Machine Learning

M - models.

$$P(M|D) = \frac{P(D|M) P(M)}{P(D)}$$

Diagram annotations:

- An arrow points from the text "prior simplicity" to the term $P(M)$ in the numerator.
- An arrow points from the text "ignore" to the denominator $P(D)$.
- An arrow points from the text "searching for best M " to the entire expression $P(M|D)$.

Discrete Random Variables

"Random Variables" RV

Sample space Ω .

RV function $X: \Omega \rightarrow \mathbb{R}$.

meaning

finite RVs.

a_1, a_2, \dots, a_m

$|\Omega| = n$

infinite RVs

a_1, a_2, \dots

$|\Omega| = \infty$

countably

Examples:

Sum of two dice

$$\{(1,1), (1,2), \dots, (6,6)\}.$$

$$X = i+j \quad \forall (i,j) \text{ in } \Omega.$$

$$\Pr(X=2) = \Pr(\{(1,1)\}).$$

$$a=3$$

Difference of two dice

$$X = i-j \quad \forall (i,j) \text{ in } \Omega.$$