

Bayes' and Law of Total Probability



For an event space $\{B_1, \dots, B_m\}$ with $P[B_i] > 0$ for all i ,

$$\begin{aligned} P[B_i|A] &= \frac{P[AB_i]}{P[A]} = \frac{P[A|B_i]P[B_i]}{P[A]} \\ &= \frac{P[A|B_i]P[B_i]}{\sum_{i=1}^m P[A|B_i]P[B_i]} \end{aligned}$$

We know the a priori probabilities of the B_i (s) and also the probability of an observable event A given B_i . Having seen A (the effect) we want to know the chance that a certain B_i is the cause (that caused A)

Bayes' and Law of Total Probability



- Let A be the event {A world class athlete is seen}
- Consider the event space (World) contains countries of origins. It is $W = \{\text{China, Jamaica, India, Malaysia, Pakistan, Sri Lanka, UK, US, ...}\}$. Let $B_1 = \text{China}$ and so on...
- $P[B_i]$ is the probability of the event that the country of origin of a human is B_i
- A priori we could calculate $P[B_i]$ as the ratio of the population of B_i and the population of the world.
- We could also arrive at $P[A | B_i]$, say based on past statistics
- Now say I tell you that I saw an athlete, that is observed A , and I want to know what is probability that the athlete is from India
 - I want to know $P[\text{India} | A]$ or $P[B_3 | A]$

INNOCENT OR GUILTY

From the book
"Randomness"

85% of cabs in your city are red.

$$P(R) = 0.85$$

$$P(B) = 0.15$$

The rest are blue.

$R \equiv$ Event that a randomly chosen car is red.

A cab is involved in a hit and run incident.

A witness identifies the cab as blue.

A judge declares that a blue cab is guilty.

$$P(\text{Witness identifies blue} | B) = 0.8$$

$$P(\text{Witness identifies red} | R) = 0.8$$

Did the judge get this right?

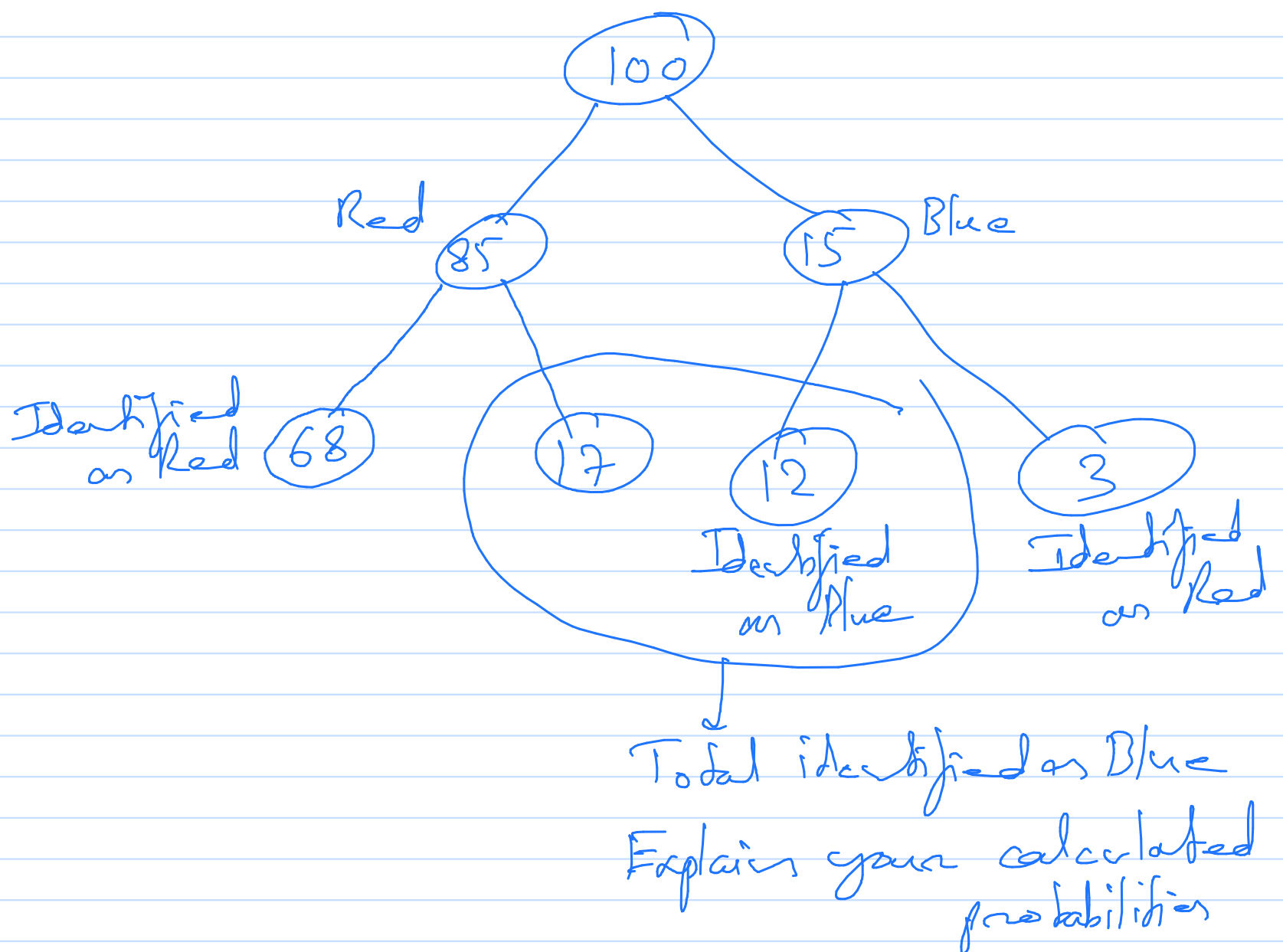
What may make this problem interesting?

$$P(B | \underbrace{\text{Witness identified blue}}_{W_B}) = \frac{P(B, W_B)}{P(W_B)} = \frac{P(W_B | B) P(B)}{P(W_B | B) P(B) + P(W_B | R) P(R)}$$

$\{B, R\}$ is an Event Space.

$$\frac{P(W_B | B) P(B)}{P(W_B | B) P(B) + P(W_B | R) P(R)} = \frac{(0.8)(0.15)}{(0.8)(0.15) + (0.2)(0.85)} = \frac{12}{29}$$

$$P(R | \text{Witness identified blue}) = \frac{17}{29}$$



DIAGNOSTIC TESTS.

A disease has a prevalence rate of $1/1000$.

A person decides to get tested. What is the probability that the person is infected before the test result is out?

The test has a false +ve rate of $1/1000$
A false -ve rate of 0.

↓ The corresponding probabilities?

$$P[\text{Test is +ve} | \text{Person is not infected}] = 10^{-3}$$

$$P[\text{Test is -ve} | \text{Person is infected}] = 0$$

The test result is +ve. Is the person infected?

$$P[\text{Person is infected} | \text{Test result is +ve}]$$

$$= \frac{P[\text{Test result is +ve} | \text{Person is infected}] P[\text{Person is infected}]$$

$$+ P[\text{Test result is +ve} | \text{Person is not infected}] P[\text{Person is not infected}]$$

$$= \frac{P[\text{Test result is +ve} | \text{Person is infected}] P[\text{Person is infected}]}{P[\text{Test result is +ve} | \text{Person is infected}] P[\text{Person is infected}] + P[\text{Test result is +ve} | \text{Person is not infected}] P[\text{Person is not infected}]}$$

SCREAM DETECTION APP

$$P(\text{Voice sample is scream}) = p.$$

FPR

$$P(\text{App detects scream} \mid \text{Audio isn't scream})$$

App has false +ve rate > 0 Δ

a false -ve rate > 0 .
FNR

$$\text{TDR: } P(\text{App detects scream} \mid \text{Sample is a scream})$$

$$P(\text{Scream happened} \mid \text{App detected scream})$$

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↓

$$= \frac{(\text{TDR}) p}{(\text{TDR}) p + \text{FPR}(1-p)}$$

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$$= \frac{p}{p + \frac{\text{FPR}(1-p)}{\text{TDR}}}$$

- **Two Events** A and B are independent *iff* $P[AB] = P[A]P[B]$
- The occurrence of event B does not change your belief about whether event A has occurred or not
 - Implies $P[A | B] = P[A]$
- **Definition 1.9**
 - If $n > 3$, the sets A_1, A_2, \dots, A_n are independent *if*
 - Every set of $n-1$ sets taken from A_1, A_2, \dots, A_n is independent,
 - $P[A_1 \cap A_2 \cap \dots \cap A_n] = P[A_1] P[A_2] \dots P[A_n]$

Quiz 1.6

Monitor two consecutive phone calls going through a telephone switching office. Classify each one as a voice call (v) if someone is speaking, or a data call (d) if the call is carrying a modem or fax signal. Your observation is a sequence of two letters (either v or d). For example, two voice calls corresponds to vv . The two calls are independent and the probability that any one of them is a voice call is 0.8. Denote the identity of call i by C_i . If call i is a voice call, then $C_i = v$; otherwise, $C_i = d$. Count the number of voice calls in the two calls you have observed. N_V is the number of voice calls. Consider the three events $N_V = 0$, $N_V = 1$, $N_V = 2$. Determine whether the following pairs of events are independent:

- (1) $\{N_V = 2\}$ and $\{N_V \geq 1\}$
- (2) $\{N_V \geq 1\}$ and $\{C_1 = v\}$
- (3) $\{C_2 = v\}$ and $\{C_1 = d\}$
- (4) $\{C_2 = v\}$ and $\{N_V \text{ is even}\}$

Problem 1.6.7



For independent events A and B , prove that

- (a) A and B^c are independent.
- (b) A^c and B are independent.
- (c) A^c and B^c are independent.

Sequential Diagrams



Example 1.25 Problem

Suppose traffic engineers have coordinated the timing of two traffic lights to encourage a run of green lights. In particular, the timing was designed so that with probability 0.8 a driver will find the second light to have the same color as the first. Assuming the first light is equally likely to be red or green, what is the probability $P[G_2]$ that the second light is green? Also, what is $P[W]$, the probability that you wait for at least one light? Lastly, what is $P[G_1|R_2]$, the conditional probability of a green first light given a red second light?

