

$$P[A|B] = \frac{P[A \cap B]}{P[B]} \quad \text{"Bayes' Rule"}$$

1.5 Law of Total Probability

*Note: The equation for the **law of conditional probability** (1.3) is also known as **Bayes Rule**.*

Section (1.5) in the textbook is called "Bayes Rule", but the only new thing introduced in this section is the "Law of Total Probability".

A = vendor A

D = defective

Introductory Example

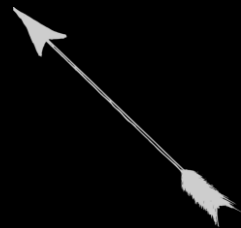
Hawkeye purchases arrows from 3 vendors: A, B and C. Out of his entire collection, 25% of his arrows are from **vendor A**, 35% from **vendor B**, and the rest are from **vendor C**. Assume we know:

$$P[A] = 0.25$$

$P[D|A]$ = 5% of the arrows from Vendor A are defective

4% from vendor B are defective

2% from vendor C are defective.



After a battle, he picks up an arrow at random and finds that it is defective. What is the probability that it came from vendor A?

$$P[A|D]$$

Law of Total Probability

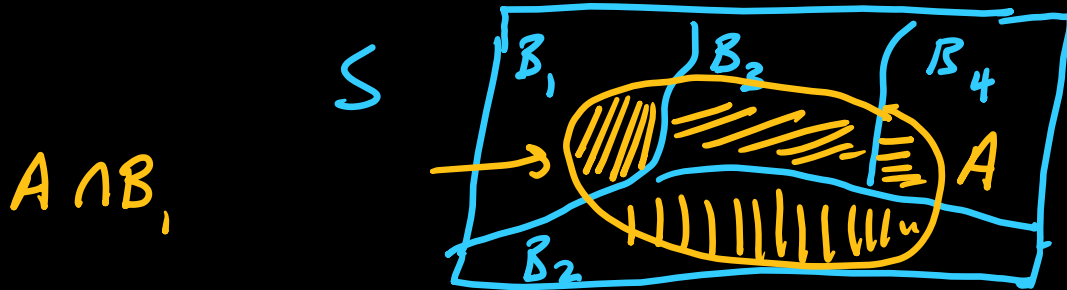
Let B_1, B_2, \dots, B_m be a **partition** of the sample space, S .

$$S = B_1 \cup B_2 \cup \dots \cup B_m \text{ and } B_i \cap B_j = \emptyset, i \neq j.$$

Now, let A be an event.

We can write A as the union of m mutually exclusive events:

$$A = (B_1 \cap A) \cup (B_2 \cap A) \cup \dots \cup (B_m \cap A).$$



Bayes Rule

Let B_1, B_2, \dots, B_m be a **partition** of the sample space, S .

$$P[A] = \sum_{i=1}^m P(B_i \cap A) \quad \text{(using Multiplication Rule)}$$

$$P[A] = \sum_{i=1}^m P(B_i)P(A|B_i) \quad \text{Law of Total Probability}$$

$$P[B_i | A] = \frac{P[B_i \cap A]}{P[A]} = \frac{P[A | B_i]P[B_i]}{\sum_{i=1}^m P(B_i)P(A|B_i)}$$

Conditional Probability (Bayes Theorem)

$$P(B_k | A) = \frac{P(B_k \cap A)}{P(A)}, \quad k = 1, 2, \dots, m.$$

Using the Law of Total Probability to re-write $P[A]$, we can re-write **Bayes Theorem**:



$$P(B_k | A) = \frac{P(B_k)P(A | B_k)}{\sum_{i=1}^m P(B_i)P(A | B_i)}, \quad k = 1, 2, \dots, m.$$

Shortcut for 2 cases

If we are only considering B and B^c,
we can write Bayes rule as follows:



$$P[\underline{B}|A] = \frac{P(B)P(A|B)}{P(B)P(A|B) + P(B^c)P(A|B^c)}$$

$$P[A \cap B] + P[A \cap B^c]$$

P[A]



25% of arrows come from **vendor A**, 35% from **vendor B**, and the rest are from **vendor C**.

Assume we know:

5% of the arrows from Vendor A are defective

4% from vendor B are defective

2% from vendor C are defective.

After a battle, an arrow is picked at random and found to be defective. What is the probability that it came from vendor A?

$$P[A|D] = \frac{P[A \cap D]}{P[D]}$$

$$\begin{aligned} P(A|D) &= \frac{P(D|A)P(A)}{\underbrace{P(D|A)P(A)} + \underbrace{P(D|B)P(B)} + \underbrace{P(D|C)P(C)}} \\ &= \frac{0.05 \times 0.25}{0.05 \times 0.25 + 0.04 \times 0.35 + 0.02 \times 0.4} \\ &= 0.362 \end{aligned}$$

1.5 Bayes' Rule

Examples

1. Jack Sparrow believes he has a

$A_1 : \text{GPA } 3.5-4.0$

25% chance of ending up with a GPA between 3.5 - 4.0,

$$P[A_1] = 0.25$$

35% chance of ending up with a 3.0 - 3.5, A_2

40% chance of ending up with a GPA less than 3.0. A_3

His advisor, Captain Hook, tells him that Jack has the following chances of getting into grad school for each GPA bracket:

$P[G | A_i]$

3.5 - 4.0 GPA: $p = 0.8$

3.0 - 3.5 GPA: $p = 0.5$

Below 3.0 GPA: $p = 0.1$

$G = \text{grad school}$

1. Based on this information, what is the probability that Jack gets into grad school?

$$P[G] = P[G | A_1] \cdot P[A_1] +$$

$$P[G | A_2] \cdot P[A_2] + P[G | A_3] \cdot P[A_3] = \boxed{0.415}$$

2. Suppose Jack has been accepted into grad school. What is the probability that Jack ended up with a GPA between 3.0 and 3.5?

$$P[A_2 | G] = \frac{P[A_2 \cap G]}{P[G]}$$

$$= \frac{P[G | A_2] \cdot P[A_2]}{P[G]}$$

$$= \frac{0.5 \cdot 0.35}{0.415} = 0.42$$

A_1 3.5 - 4.0: $p = 0.25$

A_2 3.0 - 3.5: $p = 0.35$ ←

A_3 < 3.0: $p = 0.4$

If 3.5 - 4.0 GPA: $p = 0.8$

If 3.0 - 3.5 GPA: $p = 0.5$

If < 3.0 GPA: $p = 0.1$

A

B

C

3. Albus Dumbledore, Bill Weasley, and Cornelius Fudge are about to be executed. A crystal ball reveals that one will be randomly spared but won't show who is spared.

Albus convinces it to show him one of the people that will be executed.

- "If Bill is going to live, show me Cornelius' execution.
- If Cornelius is going to live, show me Bill's execution.
- If I am going to live, open **RStudio** and use `sample(1:2,1)` to decide which execution to show me"

multiple
choice

→ The ball shows him Bill's execution. Given this new information, what is the probability that Albus will live?

a. 0

b. $\frac{1}{3}$

c. $\frac{1}{2}$

d. $\frac{2}{3}$

e. depends

$$P[A] = 1/3$$

$$P[B] = 1/3$$

$$P[C] = 1/3$$

A = Albus lives

B = Bill lives

C = Cornelius Lives

→ b = sees Bill execution

c = sees Cornelius execution

$P[b]$

$$\begin{aligned}
 \underline{P(A|b)} &= \frac{\overset{\rightarrow}{P(b|A)P(A)}}{P(b|A)P(A) + \underbrace{P(b|B)P(B)} + \underbrace{P(b|C)P(C)}} \\
 &= \frac{\frac{1}{2} \times \frac{1}{3}}{\frac{1}{2} \times \frac{1}{3} + \underbrace{0} \times \frac{1}{3} + \underbrace{1} \times \frac{1}{3}} = \frac{1}{3}.
 \end{aligned}$$

$\downarrow \quad \uparrow \quad \uparrow \quad \uparrow$

A = Albus lives

B = Bill lives

C = Cornelius Lives

b = sees Bill execution

c = sees Cornelius execution

$$P(C|b) = \frac{P(b|C)P(C)}{P(b|A)P(A) + P(b|B)P(B) + P(b|C)P(C)}$$

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3/2

When someone comes to the house, Chloe barks **90%** of the time if they ring the doorbell. When they do **not** ring the doorbell, she barks 30% of the time anyway.

Assume people ring the doorbell **80%** of the time.

4. Find the overall probability that Chloe barks when ~~someone comes to the door~~.

D : doorbell

B : bark

$$P[B] = P[B \cap D] + P[B \cap D^c]$$

$$= P[B|D] \cdot P[D] + P[B|D^c] P[D^c]$$

$$= (0.9)(0.8) + (0.3)(0.2)$$

$$= \boxed{0.78}$$



5. Given that Chloe barked when someone came to the door, what is the probability that they rang the bell?

$$P[D | B] = \frac{P[D \cap B]}{P[B]} = \frac{P[B|D]P[D]}{P[B]}$$

$$= \frac{(0.9)(0.8)}{0.78}$$

$$= 0.923$$

$$A^c = A$$

$$[B^c | D^c]^c = B | D$$

↑