

# STAT 320: Principles of Probability

## Unit 4: Conditional Probability & Statistical Independence

United Arab Emirates University

Department of Statistics

# Outline

- 1 Conditional Probability
- 2 Law of Total Probability
- 3 Bayes' Theorem
- 4 The Notion of Statistical Independence

# Conditional Probability

# Example0

Example :

Suppose that we toss 2 dice, and suppose that each of the 36 possible outcomes is equally likely to occur and hence has probability  $\frac{1}{36}$ . Suppose further that we observe that the first die is a 3. Then, given this information, what is the probability that the sum of the 2 dice equals 8?

### Definition (Conditional Probability)

Let  $E$ , and  $F$  are two events such that  $P(F) > 0$ , then the conditional probability of  $E$  **given**  $F$  is defined to be,

$$P(E | F) := \frac{P(E \cap F)}{P(F)}.$$

# Example

**Question :** Suppose that a balanced die is tossed once. Find the conditional probability that 1 appears, given that an odd number was obtained.

$A := \{ \text{Observe a 1.} \}, B := \{ \text{Observe an odd number.} \}$

$$P(A | B) = \frac{P(A \cap B)}{P(B)} = \frac{\frac{1}{6}}{\frac{3}{6}} = \frac{1}{3}.$$

# Example

Example :

A student is taking a one-hour-time-limit makeup examination. Suppose the probability that the student will finish the exam in less than  $x$  hours is  $\frac{x}{2}$ , for all  $0 \leq x \leq 1$ . Then, given that the student is still working after 0.75 hour, what is the conditional probability that the full hour is used?

Solution: Let  $L_x$  denote the event that the student finishes the exam in less than  $x$  hours,  $0 \leq x \leq 1$ , and let  $F$  be the event that the student uses the full hour. Because  $F$  is the event that the student is not finished in less than 1 hour,

$$P(F) = P(\overline{L_1}) = 1 - P(L_1) = 0.5.$$

Now, the event that the student is still working at time 0.75 is the complement of the event  $L_{0.75}$ , so the desired probability is obtained from

$$P(F \mid \overline{L_{0.75}}) = \frac{P(F \cap \overline{L_{0.75}})}{P(\overline{L_{0.75}})} = \frac{P(F)}{1 - P(L_{0.75})} = \frac{0.5}{0.625} = 0.8$$

# Example

**Example :** A coin is flipped twice. Assuming that all four points in the sample space  $\mathcal{S} = \{HH, HT, TH, TT\}$  are equally likely, what is the conditional probability that both flips land on heads, given that (a) the first flip lands on heads? (b) at least one flip lands on heads?

Solution:



# Example

**Example :**

A total of  $n$  balls are sequentially and randomly chosen, without replacement, from an urn containing  $r$  red and  $b$  blue balls ( $n \leq r + b$ ). Given that  $k$  of the  $n$  balls are blue, what is the conditional probability that the first ball chosen is blue?

**Solution:** Show that this probability is  $\frac{k}{n}$ .

## Definition (Multiplication Rule )

Let  $E$  and  $F$  are two events, then

$$P(E \cap F) := P(E | F) \times P(F) .$$

# Example

**Example :**

Celine is undecided as to whether to take a French course or a chemistry course. She estimates that her probability of receiving an A grade would be  $\frac{1}{2}$  in a French course and  $\frac{2}{3}$  in a chemistry course. If Celine decides to base her decision on the flip of a fair coin, what is the probability that she gets an A in chemistry?

Solution: .

# Example

## Example :

Suppose that an urn contains 8 red balls and 4 white balls. We draw 2 balls from the urn without replacement. If we assume that at each draw each ball in the urn is equally likely to be chosen, what is the probability that both balls drawn are red?

**Solution:** Let  $R_1$  and  $R_2$  denote, respectively, the events that the first and second balls drawn are red. Now, given that the first ball selected is red, there are 7 remaining red balls and 4 white balls, so  $P(R_2 | R_1) = \frac{7}{11}$ . As  $P(R_1) = \frac{8}{12}$ , the desired probability is

$$P(R_1 \cap R_2) = P(R_2 | R_1) \times P(R_1) = \frac{7}{11} \frac{8}{12} = \frac{14}{33}.$$

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$$P(E_1 \cap E_2 \cap E_3) = P(E_1 \mid E_2 \cap E_3) \times P(E_2 \mid E_3) \times P(E_3) .$$

$$P(E_1 \cap E_2 \cap E_3) P(E_2 \cap E_1 \cap E_3) = P(E_2 \mid E_1 \cap E_3) \times P(E_1 \mid E_3) \times P(E_3) .$$

$$P(E_1 \cap E_2 \cap E_3) = P(E_3 \cap E_2 \cap E_1) = P(E_3 \mid E_2 \cap E_1) \times P(E_2 \mid E_1) \times P(E_1) .$$

$$P(A \cap B \cap C) = P(A | B \cap C) \times P(B | C) \times P(C).$$

$$P(A \cap B \cap C \cap D) = P(A | B \cap C \cap D) \times P(B | C \cap D) \times P(C | D) \times P(D).$$

$$P(A \cap B \cap C \cap D \cap E) = P(D \cap A \cap C \cap E \cap B) = P(D | A \cap C \cap E \cap B) \times P(A \cap C \cap E \cap B).$$

## Definition ( The Generalized Multiplication Rule:)

$$P(E_1 \cap E_2 \cap \dots \cap E_k) := P(E_1) \times P(E_2 | E_1) P(E_3 | E_2 \cap E_1) \times \dots \times P(E_k | E_1 \cap E_2 \cap \dots \cap E_{k-1}).$$

$$P(E_1 \cap E_2 \cap \dots \cap E_k)$$

$$:= P(E_1 | E_2 \cap \dots \cap E_k) \times P(E_2 | E_3 \cap \dots \cap E_k) \times \dots \times P(E_{k-1} | E_k) \times P(E_k).$$

$$P(E_1, E_2, \dots, E_k)$$

$$:= P(E_1 | E_2, \dots, E_k) \times P(E_2 | E_3, \dots, E_k) \times \dots \times P(E_{k-1} | E_k) \times P(E_k).$$



# Example

**Example :** An ordinary deck of 52 playing cards is randomly divided into 4 piles of 13 cards each. Compute the probability that each pile has exactly 1 ace.

**Solution:** Define events  $E_i$ ,  $i = 1, 2, 3, 4$ , as follows:  $E_1 = \{\text{the ace of spades is in any one of the piles}\}$ ,

$E_2 = \{\text{the ace of spades and the ace of hearts are in different piles}\}$ ,

$E_3 = \{\text{the aces of spades, hearts, and diamonds are all in different piles}\}$ ,

$E_4 = \{\text{all 4 aces are in different piles}\}$ ,

The desired probability is  $P(E_1 \cap E_2 \cap E_3 \cap E_4)$ , and by the multiplication rule,

$$P(E_1 \cap E_2 \cap E_3 \cap E_4) = P(E_1)P(E_2 | E_1)P(E_3 | E_1 \cap E_2)P(E_4 | E_1 \cap E_2 \cap E_3)$$

Note that  $P(E_1) = 1$ , because  $E_1$  is equal to the sample space.  $P(E_2 | E_1) = \frac{39}{51}$ ,  $P(E_3 | E_1 \cap E_2) = \frac{26}{50}$ ,

$$P(E_4 | E_1 \cap E_2 \cap E_3) = \frac{13}{49}.$$

$$\text{Therefore, } P(E_1 \cap E_2 \cap E_3 \cap E_4) = P(E_1)P(E_2 | E_1)P(E_3 | E_1 \cap E_2)P(E_4 | E_1 \cap E_2 \cap E_3) = 1 \times \frac{39}{51} \times \frac{26}{50} \times \frac{13}{49} = 0.105$$

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## Law of Total Probability

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$$E = (E \cap F) \cup (E \cap \bar{F})$$

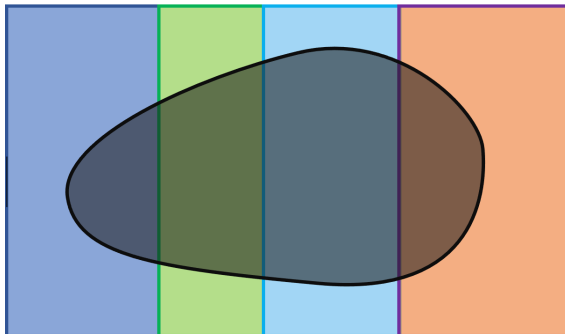
$$P(E) = P(E \cap F) + P(E \cap \bar{F})$$

# Law of Total Probability

Let  $E$  and  $F$  be two events, then

$$P(E) = P(E | F)P(F) + P(E | \bar{F})(\bar{F})$$

# Law of Total Probability (General)



# Law of Total Probability (General)

Law of Total Probability (General):

Let  $E$  be an event. Assuming that the collection of sets  $\{F_1, F_2, \dots, F_k\}$  forms a partition of  $\mathbb{S}$ , we have

$$P(E) = \sum_{j=1}^k P(E | F_j)P(F_j)$$



# Example

## Example :

An insurance company believes that people can be divided into two classes: those who are accident prone and those who are not. The company's statistics show that an accident-prone person will have an accident at some time within a fixed 1-year period with probability 0.4, whereas this probability is 0.2 for a person who is not accident prone. If we assume that 30% of the population is accident prone, what is the probability that a new policyholder will have an accident within a year of purchasing a policy?

**Solution:** Let  $A_1$  denote the event that the policyholder will have an accident within a year of purchasing the policy, and let  $A$  denote the event that the policyholder is accident prone. Hence, the desired probability is given by

$$P(A_1) = P(A_1 | A)P(A) + P(A_1 | \bar{A})P(\bar{A}) = (0.4)(0.3) + (0.2)(0.7) = 0.26$$

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# Bayes' Theorem

## Theorem

Let  $F_1, F_2, \dots, F_K$  be a set of mutually exclusive and exhaustive events (meaning that exactly one of these events must occur). Suppose now that  $E$  has occurred and we are interested in determining which one of the  $F_j$  also occurred. Then, we have the following theorem

$$P(F_i | E) = \frac{P(E | F_i)P(F_i)}{\sum_{j=1}^K P(E | F_j)P(F_j)}$$

- This theorem is well known as Bayes's theorem, after the English philosopher **Thomas Bayes**.
- We can use the following Applet to find the conditional probability using Bayes's theorem:
- [http://www.thomsonedu.com/statistics/book\\_content/0495110817\\_wackerly/applets/seeingstats/Chpt2/bayesTree.html](http://www.thomsonedu.com/statistics/book_content/0495110817_wackerly/applets/seeingstats/Chpt2/bayesTree.html)

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Suppose that a new policyholder has an accident within a year of purchasing a policy. What is the probability that he or she is accident prone?

**Solution:** The desired probability is

$$P(A | A_1) = \frac{P(A \cap A_1)}{P(A_1)} = \frac{(0.4)(0.3)}{0.26} = \frac{6}{13}$$

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# Bayes' Theorem: Example

**Question :** A diagnostic test for a disease is such that it (correctly) detects the disease in 90% of the individuals who actually have the disease. Also, if a person does not have the disease, the test will report that he or she does not have it with probability 0.9. Only 1% of the population has the disease in question. If a person is chosen at random from the population and the diagnostic test indicates that she has the disease, what is the conditional probability that she does, in fact, have the disease? Are you surprised by the answer? Would you call this diagnostic test reliable?

$A = \{\text{The individual has the disease}\}$ ,  $\bar{A} = \{\text{does not have the disease}\}$ ,  $B = \{\text{The test shows a POSITIVE result}\}$   
 $\bar{B} = \{\text{The test shows a NEGATIVE result}\}$

$P(B | A) = 0.9$ ,  $P(\bar{B} | A^c) = 0.9$  and  $P(A) = 0.01$

$$P(A | B) = \frac{P(B | A)P(A)}{P(B | A)P(A) + P(B | \bar{A})P(\bar{A})} = \frac{(0.9)(0.01)}{(0.9)(0.01) + (0.1)(0.99)} = 91\%$$

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$$P(A | B) = \frac{P(B | A)P(A)}{P(B | A)P(A) + P(B | \bar{A})P(\bar{A})} = \frac{(0.9)(0.01)}{(0.9)(0.01) + (0.1)(0.99)} = 91\%$$

# Example

**Example :**

Suppose that we have 3 cards that are identical in form, except that both sides of the first card are colored red, both sides of the second card are colored black, and one side of the third card is colored red and the other side black. The 3 cards are mixed up in a hat, and 1 card is randomly selected and put down on the ground. If the upper side of the chosen card is colored red, what is the probability that the other side is colored black?

**Solution:** Let RR, BB, and RB denote, respectively, the events that the chosen card is all red, all black, or the redblack card. Also, let R be the event that the upturned side of the chosen card is red. Then the desired probability is obtained

$$P(RB | R) = \frac{P(R | RB)P(RB)}{P(R | RR)P(RR) + P(R | RB)P(RB) + P(R | BB)P(BB)} = \frac{\frac{1}{2} \times \frac{1}{3}}{(1) \times \frac{1}{3} + \frac{1}{2} \times \frac{1}{3} + (0) \times \frac{1}{3}} = \frac{1}{3}.$$

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Suppose that we have 3 cards that are identical in form, except that both sides of the first card are colored red, both sides of the second card are colored black, and one side of the third card is colored red and the other side black. The 3 cards are mixed up in a hat, and 1 card is randomly selected and put down on the ground. If the upper side of the chosen card is colored red, what is the probability that the other side is colored black?

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# Example

**Example :**

A new couple, known to have two children, has just moved into town. Suppose that the mother is encountered walking with one of her children. If this child is a girl, what is the probability that both children are girls?

Solution:

# Example

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**Solution:**

# Example

## Example :

A bin contains 3 different types of disposable ashlights. The probability that a type 1 ashlight will give over 100 hours of use is 0.7, with the corresponding probabilities for type 2 and type 3 ashlights being 0.4 and 0.3, respectively. Suppose that 20 percent of the ashlights in the bin are type 1, 30 percent are type 2, and 50 percent are type 3.

- 1 What is the probability that a randomly chosen ashlight will give more than 100 hours of use?
- 2 Given that a ashlight lasted over 100 hours, what is the conditional probability that it was a type  $j$  ashlight,  $j = 1, 2, 3$ ?

Solution:

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## The Notion of Statistical Independence

# Statistical Independence

## Definition (Statistically Independent Event)

Two events  $E$  and  $F$  are said to be statistically independent if

$$P(E \cap F) = P(E) \times P(F)$$

Corollary: Two events  $E$  and  $F$  are independent if and only if  $P(E | F) = P(E)$  and  $P(F | E) = P(F)$ .

# Statistical Independence

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# Example

**Example :** A card is selected at random from an ordinary deck of 52 playing cards. If  $E$  is the event that the selected card is an ace and  $F$  is the event that it is a spade, then  $E$  and  $F$  are independent.

**Solution:** This follows because  $P(E \cap F) = \frac{1}{52}$  whereas  $P(E) = \frac{4}{52}$  and  $P(F) = \frac{13}{52}$ .

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# Example

**Example :** Two coins are flipped, and all 4 outcomes are assumed to be equally likely. If  $E$  is the event that the first coin lands on heads and  $F$  the event that the second lands on tails, then  $E$  and  $F$  are independent, since  $P(E \cap F) = P(\{HT\}) = \frac{1}{4}$ . Where as  $P(E) = P(\{HH, HT\}) = \frac{1}{2}$  and  $P(F) = P(\{HT, TT\}) = \frac{1}{2}$

# Example

## Example :

Suppose that we toss 2 fair dice. Let  $E_1$  denote the event that the sum of the dice is 6 and  $F$  denote the event that the first die equals 4. Is  $E_1$  statistically independent of  $F$ ?

**Answer:**  $P(E_1 \cap F) = P(\{(4, 2)\}) = \frac{1}{36}$  where as  $P(E_1) = \frac{5}{36}$  and  $P(F) = \frac{1}{6}$ . Therefore,  $E_1$  and  $F$  are not statistically independent because,  $P(E_1 \cap F) \neq P(E_1) \times P(F)$ .

## Example :

Now, suppose that we let  $E_2$  be the event that the sum of the dice equals 7. Is  $E_2$  statistically independent of  $F$ ?

**Answer:**  $P(E_2 \cap F) = P(\{(4, 3)\}) = \frac{1}{36}$  where as  $P(E_2) = \frac{1}{6}$  and  $P(F) = \frac{1}{6}$ . Therefore,  $E_2$  and  $F$  are statistically independent because,  $P(E_2 \cap F) = P(E_2) \times P(F)$ .

Proposition: If  $E$  and  $F$  are independent, then so are  $E$  and  $\overline{F}$ .

Solution:



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# Generalized Definition of Statistical Independence

## Definition (Statistically Independent Events)

Three events  $E$ ,  $F$ , and  $G$  are said to be statistically independent if

$$P(E \cap F \cap G) = P(E) \times P(F) \times P(G)$$

$$P(E \cap F) = P(E) \times P(F)$$

$$P(E \cap G) = P(E) \times P(G)$$

$$P(F \cap G) = P(F) \times P(G)$$

Questions?