Sample Spaces and (Un)conditional Probability

Notes 01

Associated Reading: Wackerly 7, Chapter 2, Sections 1-4 and 7-10

We'll start with a general question: What is probability?

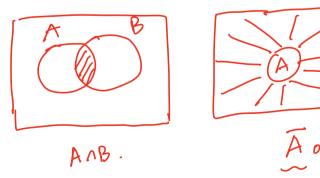
To begin our discussion of probability, we start with a review of set notation.

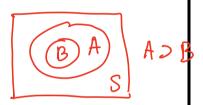
To match the book, we will:

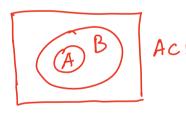
- denote sets with capital letters: A, B, C, \cdots ;
- denote the universal set (or the superset of all sets) with S; and
- denote the null or empty set with \emptyset .

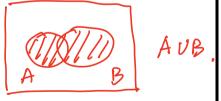
i	Term	Notation	Intuitive Terminology				
	superset	$A\supset B$	"encompasses"				
	subset	$A \subset B$	"within"				
	union	$A \cup B$	"or"				
	intersection	$A \cap B$	"and"				
4	complement	$ar{A}$	"not"				

Let's draw Venn diagrams illustrating each of these terms:









Note the international standards for set notation on http://en.wikipedia.org/wiki/ISO_31-11; in particular, do not use logic notation on homeworks and tests (e.g., use $A \cap B$, not $A \wedge B$).

A few more important definitions and we are finished:

- \bullet $A \cup \bar{A} = S$
- $A \cap B = \emptyset \implies A$ and B are mutually exclusive or disjoint
- the distributive and associative laws:

AU (BAC) = (AUB) A (AUC)

• De Morgan's laws:

→ **EXAMPLE**: Wackerly 7, Exercise 2.5

a)
$$A = (A \wedge B) \cup (A \wedge \overline{B})$$

$$= A \wedge (B \cup \overline{B}) = A$$
S

$$\frac{A = B U (A \wedge \overline{B})}{\int_{A}^{B} (A)} (A \wedge B) U (A \wedge B) = B U (A \wedge B)$$

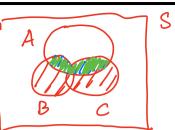
bc BCA: ANB=B

So: What is an experiment?

A process by which observations are made.

active. you control on apparatus and its settings and collect data.

passive: you observe and collect data.



 $(A \land (B \land C) = (A \land B) \land (A \land C)$

AU(BUC) = (AUB)/U(A

A VB

c)
$$(A \wedge B) \wedge (A \wedge B) = \phi$$
.

$$=A\Lambda\left(\underbrace{B\Lambda\overline{B}}\right).$$

→ **EXAMPLE**: A person tosses two coins. What are the possible outcomes? (Note that we will use this example to define some terminology.) Compound event

Sample a simple even: cannot be decomposed.

→ **EXAMPLE**: What is the sample space if

(a) a player shoots free throws until she misses?

$$S : Success$$

 $F : failure.$ $S = {F, SF, SSF, SSSF, --- }.$

(b) a person reads any two of three books A, B, and C?

order may or may not matter depending on experiment definition

In the example above, what are the relative frequencies of each of the listed events?

don't know: more into needed.

→ **EXAMPLE**: Rice (2nd edition), Problem 1.8.1:

A coin is tossed three times and the sequence of heads and tails is recorded.

- (a) List the sample space.
- (b) List the elements that make up the following events: (1) A = at least two heads, (2) B = the firsttwo tosses are heads, (3) C = the last toss is a tail.

(c) List the elements of the following events. (1) \overline{A} , 2) $A \cap B$, (3) $A \cup C$.

So: what do we know about relative frequencies of events? must be 7,0 and 61. 1 the frequency of S is 1. 3) the frequency of compound event equals to sum of the frequencies of its constituent simple events. Let S be a sample space. A probability measure on S is a function P from subsets of S to \mathbb{R} that satisfies the following axioms: P: subset of S -> IR if ACS P(A) 30 P(A) &1. (3) if A1 Az ... Ax are disjoint events then $P(A_1 \cup A_2 \cdots \cup A_K) = P(A_1) + P(A_2) + \cdots + P(A_K) = \sum_{i=1}^K P(A_i)$ **EXAMPLE**: Use the axioms of probability to express P[A] as a function of $P[\bar{A}]$. AUA = S $A \cap A = \phi$ (disjoint) $= P(S) = P(AU\overline{A}) = P(A) + P(\overline{A}) \Rightarrow P(A) = 1 - P(\overline{A}). \checkmark$ → **EXAMPLE**: Wackerly 7, Problem 2.15 An oil prospecting firm hits oil or gas on 10% of its drillings. If the firm drills two wells, the four possible simple events and three of their associated probabilities are as given in the accompanying table. Find the probability that the company will hit oil or gas a on the first drilling and miss on the second. B b on at least one of the two drillings. A P(AAB) P(AAB) Outcome of Outcome of Simple Second Drilling Probability First Drilling Event Hit (oil or gas) .01 Hit (oil or gas) P(AAB) P(AAB) Miss Hit .09 Miss Hit E_3 Miss P(B) Hib oil on the first drilling. denote H1: Lossab hit oil on ----D(AAB)+P(AAB) Hit oil on the second - - . ? P((AAB) U (AAB) Hz P(BA(AUA)) 0.0 P(HINAZ) 18.0 0.09

= [-0.0] - 0.09 - 0.8[= 0.09]

The probability of an event (e.g., A) may depend on whether other events (e.g., B) occur. If so, we compute conditional probabilities, with conditions placed to the right of a vertical bar (e.g., P[A|B]).

When parsing word problems, one can easily identify when the probability is conditional: the words if of given will generally be used. For instance:

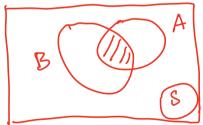
- What is the probability of selecting a red ball in the second draw from a jar of m black balls and n red balls **if** a black ball is drawn first? (Sampling bere is done without replacement.)
- What is the probability of being a French speaker given that one lives in Brussels?

F: "speaks French" $P(F) = \frac{3}{70}$ B: "lives in Brussels" $P(B) = \frac{1}{7000}$

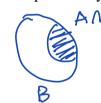
 $P(F|B) = \frac{3}{5} \qquad P(B|F) = \frac{1}{5000} \quad \textcircled{2} \quad P(F|B)$

①.P(F) = P(F|B) unconditional x conditional prob. = P(BIF). Important: in conditional probability, causality is not implied! In other words, event A does not have to follow B. B simply has to occur at some point.

The following will help you to see intuitively how the conditional probability is computed:



P(A | B).



 $P(B|A) = \frac{P(A \wedge B)}{P(A)}$ \rightarrow **EXAMPLE:** Given the following 2 × 2 table of experimental outcomes, compute P[A|B]. Does it equal P[B|A]?

 $P(A|B) = \frac{P(A\cap B)}{P(B)} = \frac{2/(2+6+1+9)}{3/(2+6+1+9)} = \frac{2}{3}$

 $P(B|A) = \frac{P(A \land B)}{P(A)} = \frac{2/18}{8/18} = \frac{1}{4}$

EXAMPLE: If
$$P[A] = 0.5$$
, $P[B] = 0.3$, and $P[A \cap B] = 0.1$, what is $P[A|A \cup B]$ and $P[A|A \cap B]^2$

P(A | AUB) = $P(A \cap (A \cup B))$ | $P(A \cap B)$ |

(B A)

(AB).

use area to denote

probability of event.

Now that we've learned the concepts of conditional probabilities and independence, we can write down two important laws of probability.

 \rightarrow **THEOREM 2.5.** The Multiplicative Law: the probability of the intersection of two events A and B is given by:

$$P[A \cap B] = P[A]P[B|A] = P[B]P[A|B]$$

$$= 0 \text{ if } A \text{ and } B \text{ are disjoint}$$

$$= P[A]P[B] \text{ if } A \text{ and } B \text{ are independent}$$

We can generalize this result to n events $\{A_1, \dots, A_n\}$:

A

$$P(A_1 \land A_2 \cdots \land A_n) = P(A_2 \land A_3 \cdots \land A_n) P(A_1 \mid A_2 \cdots \land A_n)$$

$$= P(A_3 \land A_4 \cdots \land A_n) \cdot P(A_2 \mid A_3 \cdots \land A_n) \cdot P(A_1 \mid A_2 \cdots \land A_n)$$

$$C$$

THEOREM 2.6. The Additive Law: the probability of the union of two events A and B is $P(A_n) P(A_n A_n) P(A_$

$$P[A \cup B] = P[A] + P[B] - P[A \cap B]$$

$$= P[A] + P[B] \text{ if } A \text{ and } B \text{ are independent}$$

$$= P[A] + P[B] - P[A]P[B] \text{ if } A \text{ and } B \text{ are independent}$$

Now, after stating one more result, we'll have sufficient tools at our disposal to extend our probabilistic modeling abilities beyond the sample-point method:

 \rightarrow **THEOREM 2.7.** If *A* is an event, then $P[A] = 1 - P[\bar{A}]$.

However, before we solve problems, I'll show one more tool for probabilistic modeling, the decision

However, before we solve problems. If show one more tool for probabilistic modeling, the decision tree:

$$P(B|A) \bullet A \cap B \quad P(A \cap B) \quad P(B|A) + P(B|A) = 1$$

$$P(A) \bullet P(B|A) \quad P(A) \quad P(A \cap B) \quad P(A$$

The event-composition method presented in Section 2.9 of Wackerly 7 can be boiled down to:

- 1. When faced with a problem, define your events (e.g., F = "a crashed plane was found" and B = "the plane had an emergency locator beacon").
- √2. Write down what you know (both unconditional and conditional probabilities). Be careful to parse the problem correctly, i.e., to write any conditional probabilities in the correct "order" (e.g., "if a plane has a locator beacon, there is a 90% chance it will be found after a crash" $\Rightarrow P[F|B] = 0.9 \neq P[B|F]$).
- 3. Write down what quantity you want to solve for. P(FAB)
- /4. Link the items in (2) with the desired result in (3) via the laws of probability, in any way possible.

The book itself says "the best way to learn how to solve probability problems is to learn by doing," so let's go ahead and do . . .

- ✓→ **EXAMPLE** (courtesy O. Meyer): the information you get with a certain prescription drug states:
 - There is a 10% chance of experiencing headaches (denoted H). P(H) = 0.5
 - There is a 15% chance of experiencing nausea (denoted N). P(N) = 0.15
 - There is a 5% chance of experiencing both side effects (i.e., $H \cap N$).
 - (a) Are the events *H* and *N* disjoint? (b) What is the probability of experiencing at least one of the two side effects? (c) What is the probability of experiencing exactly one of the side effects? (d) If you experience nausea, what is the probability that you'll also experience headaches?

a).
$$P(H \wedge N) = 0.05 \neq 0$$

Not disjoint.

b). P(at least one of two side effects)
$$= P(H \cup N)$$

$$= P(H) + P(N) - P(H \wedge N)$$

$$= 0.2$$

$$P(H \cap \overline{N}) + P(N \cap \overline{H}).$$

$$= 0.05 + 0.1$$

$$= 0.15.$$

$$P(H|N).$$

$$= \frac{P(H \land N)}{P(N)} = \frac{0.05}{0.15}$$

$$P(\text{shaded}) = P(\text{HUN})$$

$$P(\text{Shaded}) = P(\text{HUN})$$

$$P(\text{HAN})$$

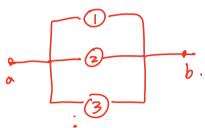
$$0.05 0.05 0.1 = 0.2$$

$$-0.05$$

$$0.15$$

→ **EXAMPLE:** Wackerly 7, Exercise 2.97.

- Consider the following portion of an electric circuit with three relays. Current will flow from 2.97 point a to point b if there is at least one closed path when the relays are activated. The relays may malfunction and not close when activated. Suppose that the relays act independently of one another and close properly when activated, with a probability of .9.
 - a What is the probability that current will flow when the relays are activated? Given that current flowed when the relays were activated, what is the probability that relays were activated, what is the probability that relays were activated.



Ai . relay i works well . $P(A_i) = 0.9$.

A1 A2 A3 are indep.

P (will flow) = P (A1 UA2 UA3)

= additive law Az

(exercise!)

= I- P(A, VA, VA) all foil.

what if you have $= 1 - P(\overline{A_1} \wedge \overline{A_2} \wedge \overline{A_3}) . \text{ independent}$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$ $= 1 - P(\overline{A_1}) \cdot P(\overline{A_2}) \cdot P(\overline{A_3}) .$

b)
$$P(A_1 \mid A_1 \cup A_2 \cup A_3) = P(A_1 \cap (A_1 \cup A_2 \cup A_3))$$

$$= \frac{P(A_1)}{P(A_1 \cup A_2 \cup A_3)} = \frac{0.9}{0.999}$$

$$P(M_2|M_1) = \frac{P(M_1 \cap M_2)}{P(M_1)}.$$

- → **EXAMPLE:** Wackerly 7, Exercise 2.101.
 - Articles coming through an inspection line are visually inspected by two successive inspectors. 2.101 When a defective article comes through the inspection line, the probability that it gets by the first inspector is .1, The second inspector will "miss" five out of ten of the defective items that get past the first inspector. What is the probability that a defective item gets by both inspectors?

inspector 1 gets the outile. $P(M_1) = 0.1$

 M_2 : inspector 2 gets the auticle. $P(M_2 | M_1) = \frac{1}{2}$

- P(MINMZ) = P(MI) - P(MZ | MI). = 0.05.

A useful thing to have at your fingertips are the probabilities for each outcome of rolling two fair six-sided dice D(ann at two like = 6) = =

510	ieu uice.		1				Gan	N 9.7	1000		0/	<u> 36</u> .
r)	Roll	2	3	4	5	6	7	8	9	10	11	12
	Probability	1/36	2/36	3/36	4/36	5/36	6/36	5/36	4/36	3/36	2/36	1/36

- \rightarrow **EXAMPLE:** Wackerly 7. Exercise 2.119(a).
 - Suppose that two balanced dice are tossed repeatedly and the sum of the two uppermost faces *2.119 is determined on each toss. What is the probability that we obtain

a sum of 3 before we obtain a sum of 7? a sum of 4 before we obtain a sum of 7?

p(F1) - p(F2) · p(S3) Fi : Seeing "3" on throw = 4 P (Sum 3 comes defore cm 7)

P(W) P(S₁) + P(F₁S₂) + P(F₁F₃S₃)

= { S₁, F₁S₂, F₁F₂S₃, F₁F₂F₃S₄,

P(F₁) · P(S₂) f · · · · }

P(Fi). P(Si)f ···

 $=\frac{2}{36}+\left(1-\frac{2}{36}-\frac{6}{35}\right)\cdot\frac{2}{36}$

 $+\frac{28}{36},\frac{28}{36},\frac{2}{36}$ $+\left(\frac{28}{36}\right)^3,\frac{2}{36}$ $+\left(\frac{28}{36}\right)^6,\frac{2}{36}$ +

 $=\frac{2}{36}\left[1+\frac{28}{36}+\left(\frac{28}{36}\right)^2+\left(\frac{28}{76}\right)^3+\cdots\right]$

2 3 |+×+×+×+

Assume that $\{B_1, \dots, B_k\}$ is a *partition* of the sample space S, i.e., that

$$S = B_1 \cup \cdots \cup B_k$$
, with $B_i \cap B_j = \emptyset \ \forall \ i \neq j$.

(The B_i 's need not be simple events.) Assuming $P[B_i] > 0 \,\forall i$, then we can write down . . .

 \rightarrow **THEOREM 2.8.** Law of <u>Total Probability</u> (LoTP): for any event A

THEOREM 2.8. Law of Total Probability (LoTP): for any event
$$A$$

$$P(A) = P(A \land S)$$

$$= P(A \land (U \land S))$$

$$\Rightarrow THEOREM 2.9. Bayes' Rule: the conditional probability of each event in the partition of S is$$

$$P[B_{j}|A] = \frac{P[A|B_{j}]P[B_{j}]}{\sum_{i=1}^{k} P[A|B_{i}]P[B_{i}]} = \frac{P[A|B_{j}]P[B_{j}]}{P[A]}$$

$$= \sum_{i=1}^{k} P(A|B_{i})P[B_{i}]$$

 \rightarrow **EXAMPLE:** Show $P[A \cap C|B] + P[A \cap \overline{C}|B] = P[A|B]$.

$$P(A \cap C \mid B) + P(A \cap C \mid B)$$

$$= P((A \cap C) \cap B) + P((A \cap C) \cap B)$$

$$P(B) + P(B) = P(A \cap B) + P(B)$$

$$= P(B)$$

$$P(B)$$

 \rightarrow **EXAMPLE:** You are diagnosed with a disease, which has two types, A and \overline{A} . In the population at large, the probability of having types \overline{A} and \overline{A} are 10% and 90%, respectively. You undergo a test that is 80% accurate (i.e., if you have type X, the test will indicate you have type X 80% of the time, and the other type 20% of the time). The test indicates that you have type A. Do you immediately start treatment for type A?

$$P(A) = 10\% \quad P(\overline{A}) = 90\%.$$

$$P(\overline{A}) = 90\%.$$

P (Test gives
$$\overline{A} \mid \overline{A} \rangle = 80\%$$

$$P(Test gives \overline{A} \mid A) = 80\%.$$

$$P(A) = P(T \mid A)$$

$$P(A) = P(A) P(T \mid A) + P(A) P(T \mid A)$$

$$P(A) = P(A \cap T) + P(A \cap T) = P(A) P(T \mid A)$$

$$P(A) \cdot P(T \mid A) \cdot P(T \mid A) \cdot P(T \mid A)$$

$$P(A) \cdot P(T \mid A) \cdot P(T \mid A) \cdot P(T \mid A)$$

$$P(A) \cdot P(T \mid A) \cdot P(T \mid A) \cdot P(T \mid A)$$

$$=\frac{4}{13}$$
.

$$P(\overline{A}|T) = \frac{9}{13}$$

→ The Monty Hall Problem

The Monty Hall Problem is named for the long-time host of the game show *Let's Make a Deal*. The simple version goes as follows: you are shown three doors; behind two of the doors are goats and behind the other is a car. You choose a door (say Door #1), Monty Hall then opens, say, Door #3 to reveal a goat, and asks you if you want to switch to Door #2.

So: do you stick with Door #1 or switch to Door #2?

P(See a corr behind Door#| | Monty opens door #3).

Define
$$O_i$$
, Monty opens door i.

 C_i : corr is behind door i.

 $P(C_1 | O_3)$ = $P(C_1) P(O_3 | C_1)$.

 $P(C_1) P(O_3 | C_1)$ + $P(C_2) P(O_3 | C_2)$.

 $P(C_3) P(O_3 | C_1) = \frac{1}{3}$.

 $P(O_3 | C_1) = \frac{1}{2}$ = $\frac{\frac{1}{2} \cdot \frac{1}{3}}{\frac{1}{2} \cdot \frac{1}{3} + 1 \cdot \frac{1}{3} + 0}$ = $\frac{1}{3}$
 $P(O_3 | C_3) = 0$

Since $P(C_1 | O_3) + P(C_1 | O_3) + P(C_3 | O_3) = 1$.

 $P(C_1 | O_3) = 1 - \frac{1}{3} = \frac{2}{3}$.

Switch!