## **COSC 290 Discrete Structures**

Lecture 34: Independence

Prof. Michael Hay Monday, Apr. 30, 2018

Colgate University

# **Plan for today**

- 1. Logistics
- 2. Review Bayes' rule
- 3. Independence

Logistics

### Logistics

- Last PLTL workshops are tonight/tomorrow.
- · Lab due W night
- Last pset is out and due on Friday.
- Honors thesis presentations tomorrow (11:30 in lounge)
- Department lunch + senior awards on Thursday 11:30 in lounge.

**Review Bayes' rule** 

#### **Recall Bayes' Rule**

For any two events A and B,

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

$$= \frac{Pr(B|A)Pr(A)}{Pr(B|A)Pr(A) + Pr(B|\bar{A})Pr(\bar{A})} \text{ applying total law to } Pr(B)$$

Why useful? Think of settings where A is the cause (disease) and B is the effects (positive test result). Bayes' rule lets us reason about the likelihood of the *cause* given presence of certain effects.

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#### Exercise: Bayes' rule

Complete the following exercise in groups. When you are done, raise your hand. I will give you several minutes to work on it, so take the time to work out the calculation.

Bayes' rule:

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

Total law:

$$Pr(B) = Pr(B|A)Pr(A) + Pr(B|\overline{A})Pr(\overline{A})$$

Students from upstate NY attend either Colgate or Cornell and they are either happy or sad. Students prefer Colgate to Cornell at a rate of 75%. Among Colgate students, 75% are happy; among Cornell students, 50% are happy.

- 1. What is the probability that a student is happy?
- 2. Given that a student is happy, what is the probability they attend Colgate?

# Independence

### Poll: Arnauld's reasoning

Consider the following game: you roll a six-sided die twice. If it comes up 6 on either roll, you win. Arnauld reasons that the probability of winning is 2/6. Here is his flawed reasoning. At which step does he err?

Let WIN denote the event of winning the game. Let  $A_1$  be the event that the first roll is a six; let  $A_2$  be the even that the second roll is a six.

- A)  $Pr(A_1) = \frac{1}{6}$  because each side is equally likely.
- B)  $Pr(A_2) = \frac{1}{6}$  for the same reason.
- C)  $Pr(WIN) = Pr(A_1 \cup A_2)$
- D)  $Pr(A_1 \cup A_2) = Pr(A_1) + Pr(A_2)$
- E)  $Pr(A_1) + Pr(A_2) = \frac{2}{6}$

Vote F) if you think Arnauld's reasoning is correct.

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### Independence

#### **Definition (Independence)**

Two events  $A_1$  and  $A_2$  are independent if and only if

$$Pr(A_1 \cap A_2) = Pr(A_1)Pr(A_2)$$

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#### Revisiting the dice game

Let's calculate the probability of WIN two ways:

- 1.  $Pr(WIN) = Pr(A_1 \cup A_2)$
- 2. Pr(WIN) = 1 Pr(LOSE)

#### Revisiting the dice game

Let's calculate the probability of WIN two ways:

- 1.  $Pr(WIN) = Pr(A_1 \cup A_2)$
- 2. Pr(WIN) = 1 Pr(LOSE)

Let  $\bar{A_1}$  mean a six was *not* rolled on first roll. Let  $\bar{A_2}$  mean a six was *not* rolled on second roll.

$$Pr(WIN) = 1 - Pr(LOSE)$$

$$= 1 - Pr(\bar{A}_1 \cap \bar{A}_2)$$

$$= 1 - Pr(\bar{A}_1) \cdot Pr(\bar{A}_2)$$
 because independent
$$= 1 - \frac{5}{6} \cdot \frac{5}{6}$$

$$= \frac{11}{36}$$

Note  $\frac{11}{36} < \frac{12}{36} = \frac{2}{6}$  so Arnauld over-estimated the probability of winning.

#### **Poll: Independence**

Recall that two events  $A_1$  and  $A_2$  are independent if and only if  $Pr(A_1 \cap A_2) = Pr(A_1)Pr(A_2)$ .

Flip three fair coins.

- Let A<sub>1</sub> be event that coins 1 and 2 match.
- Let  $A_2$  be event that coins 2 and 3 match.
- Let  $A_3$  be event that coins 1 and 3 match.

#### Questions:

- 1. Are  $A_1$  and  $A_2$  independent?
- 2. Are  $A_2$  and  $A_3$  independent?
- 3. Are  $A_1$  and  $A_3$  independent?
- A) Yes, for all three questions
- B) Yes, for some questions but not all
- C) No, for all three questions

### **Previous poll**

Independent does not simply mean "unrelated."

Events  $A_1$  and  $A_2$  are related because they both involve coin 2.

However, they are nevertheless independent.

The moral of the story: to check for independence, do the calculation!

#### **Exercise**

Given that we won't have a problem set on probability and yet it will be on your final exam, it is important that you practice using probability concepts.

Simpson's paradox: http://vudlab.com/simpsons/(This link may be broken, or just temporarily down.)

Original research paper about the Berkeley data: https://homepage.stat.uiowa.edu/~mbognar/1030/ Bickel-Berkeley.pdf