

# MATH 205: Statistical methods

September 22nd, 2021

## Lecture 6: Conditional probability

# Tentative schedule

Date	Theme/Topic	Labs	Assignments
Sep 1	Syllabus		
Sep 8	Chapter 1: Describing dataset	Section 2: Handling data	
Sep 13 - 15	Chapter 2: Looking at Relationships	Section 3: Univariate data	
Sep 20-22	Chapter 3: Basic Ideas in Probability	Section 4: Bivariate Data	Homework 1 (due 09/22)
Sep 27-29	Chapters 3-4	Section 4: Correlation	
Oct 4-6	Chapter 4: Random variables and expectations	Section 6: Random data	Homework 2 (due 10/06)
Oct 11-13	Chapter 5: Useful distributions	Section 7: The central limit theorem	
Oct 18-20	Chapter 6: Samples and populations	Section 9: Confidence interval estimation	Homework 3 (due 10/20)
Oct 25-27	Review and midterm exam		Midterm: Oct 27 (lecture), Oct 25-27 (labs)
Nov 1-3	Chapter 7: The significance of evidence	Section 10: Hypothesis testing	
Nov 8-10	Goodness of Fit	Section 12: Goodness of Fit	Homework 4 (due 11/10)
Nov 15-17	Linear Regression	Section 13: Linear regression	
Nov 22-24	Thanksgiving break		
Nov 29 - Dec 1	One-Way Analysis of Variance	Section 15: Analysis of variance	Homework 5 (due 12/01)
Dec 6-8	Selected topics + Review		
Exam week			

# Think like a Bayesian statistician

- Given an experiment and a sample space, we can define many different probabilities
- Experiment: tossing a coin,  $\Omega = \{H, T\}$
- If you believe the coin is fair:

$$P(\emptyset) = 0, \quad P(\{H\}) = 0.5, \quad P(\{T\}) = 0.5, \quad P(\{H, T\}) = 1.$$

- If you do not, then maybe

$$P(\emptyset) = 0, \quad P(\{H\}) = 0.7, \quad P(\{T\}) = 0.3, \quad P(\{H, T\}) = 1.$$

## Example: the JEDI contract (2019)

- is a large United States Department of Defense cloud computing contract that worths 10 billion.
- three outcomes: All-others (1), Microsoft (2), and Amazon (3)

$$\Omega = \{1, 2, 3\}$$

- Let's say, originally, we believed that

$$P(1) = 1/5, \quad P(2) = 2/5, \quad P(3) = 2/5$$

## *Amazon Accuses Trump of ‘Improper Pressure’ on JEDI Contract*

In a legal complaint, Amazon said the president had attacked it behind the scenes to harm its C.E.O., Jeff Bezos, “his perceived political enemy.”



Amazon had been considered the front-runner for the Joint Enterprise Defense Infrastructure project, known as JEDI. Mark Lennihan/Associated Press

# Probability updated with new information

- Let's say, originally, we believe that

$$P(1) = 1/5, \quad P(2) = 2/5, \quad P(3) = 2/5$$

- Suppose that we learn that the outcome is 1 or 2 (This means, the event  $A = \{1, 2\}$  happens)
- How should we adapt our model?

# Conditional probability

- Denote the new probability by  $\tilde{P}$
- We know  $\tilde{P}(3) = 0$ , and  $\tilde{P}(1) + \tilde{P}(2) = 1$
- The new information should not alter the relative chances of 1 and 2
- We can obtain these by setting

$$\tilde{P}(1) = \frac{P(1)}{P(A)}, \quad \tilde{P}(2) = \frac{P(2)}{P(A)}$$

## Definition

Let  $P(A) > 0$ , the conditional probability of  $B$  given  $A$ , denoted by  $P(B|A)$ , is

$$P(B|A) = \frac{P(B \cap A)}{P(A)}$$



## Definition

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$$P(B|A) = \frac{P(B \cap A)}{P(A)}$$

- This definition does not make sense if  $P(A) = 0$  (we will learn how to deal with this later)
- The newly defined probability satisfies the 3 rules of probability

- Rearrange the definition

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

→ sometimes called the **law of multiplication**.

- **Bayes' rule**

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

- Remember  $P(A) = P(A \cap B) + P(A \cap B^c)$ ? We deduce that

$$P(A) = P(A|B)P(B) + P(A|B^c)P(B^c)$$

→ sometimes called the **law of total probability**.

## Useful Facts 3.3 (Conditional Probability Formulas)

You should remember the following formulas:

- $P(\mathcal{B}|\mathcal{A}) = \frac{P(\mathcal{A}|\mathcal{B})P(\mathcal{B})}{P(\mathcal{A})}$
- $P(\mathcal{A}) = P(\mathcal{A}|\mathcal{B})P(\mathcal{B}) + P(\mathcal{A}|\mathcal{B}^c)P(\mathcal{B}^c)$
- Assume (a)  $\mathcal{B}_i \cap \mathcal{B}_j = \emptyset$  for  $i \neq j$  and (b)  $\mathcal{A} \cap (\cup_i \mathcal{B}_i) = \mathcal{A}$ ; then  $P(\mathcal{A}) = \sum_i P(\mathcal{A}|\mathcal{B}_i)P(\mathcal{B}_i)$

# Example 1

## Problem

*We throw two fair six-sided dice. What is the conditional probability that the sum of spots on both dice is greater than six, conditioned on the event that the first die comes up five?*

## Example 2

### Problem

*We flip the coin 3 times and encodes the outcomes of a flip as 0 for head and 1 for tails.*

- *What is the probability of getting two heads out of three?*
- *Suppose the first flip is revealed to be head, what is the probability of getting two heads out of three?*

## Example 3

### Problem

*Suppose an urn contains 8 red and 4 white balls. Draw two balls without replacement. What is the probability that both are red?*

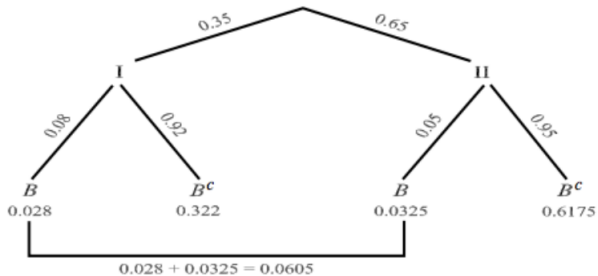
## Example 4

$$P(A) = P(A|B)P(B) + P(A|B^c)P(B^c)$$

### Problem

*An insurance company rents 35% of the cars for its customers from agency I and 65% from agency II. If 8% of the cars of agency I and 5% of the cars of agency II break down during the rental periods, what is the probability that a car rented by this insurance company breaks down?*

# Example 4





## Example 4b

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

### Problem

*An insurance company rents 35% of the cars for its customers from agency I and 65% from agency II. If 8% of the cars of agency I and 5% of the cars of agency II break down during the rental periods, what is the probability that a car rented by this insurance company breaks down?*

Question: Assuming that a randomly selected car broke down, what is the probability that this car is from agency I?