# Introduction to Probability

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### Key terms

- Outcome the result of a process or experiment
- Random Trial a process or experiment that has two or more possible outcomes whose occurrence can not be predicted with certainty
- ► Event a subset of the possible outcomes of a random trial

### Random Trials and Events – Classical examples

- Random Trials
  - ► Flip a coin
  - Roll a six-sided die
  - Draw a card from a standard deck
- Events
  - Coins heads or tails
  - ▶ Dice roll a 1; roll 4 or greater
  - ► Cards draw a heart; draw an ace; draw an ace of hearts

# Random Trials and Events – Biological examples

- Random Trials
  - Sex of the next offspring of a mating pair of birds in Duke forest
  - Change in resting heart rate in a group of healthy volunteers following treatment with a drug
  - Number of tree species at three field sites
- Events
  - ▶ Birds sex male or female
  - Drug trial Heart rate increased by more than 10 bpm; heart rate did not change or decreased; etc
  - ► Tree survey 5 species counted; 8 spcies; more than 10 species

### Probability: frequentist definition

### Probability of an event

The proportion of times the event would occur if we repeated a random trial an infinite (or very large) number of times under the same conditions.

### **Notation**

▶ To indicate the probability of an event A, we write P(A)

### Probability: Examples

### Classical examples

When we understand the physical constraints and symmetries of a random trial, we can often assign theoretical probabilities:

- ► Coins: With a fair coin, the probability of each face is 0.5
- ▶ Dice: Given a fair 20-side die, the probability of each outcome is 1/20 = 0.05; the probability of rolling a 15 or better is 6/20 = 0.3
- ▶ Cards: In randomly shuffled standard (French) 52-card deck, the probability of drawing a heart is 13/54 = 0.25; the probability of getting an ace is  $4/52 = \sim 0.077$

### Biology

For real-world problems, we can not usually invoke physical symmetries to assign theoretical probabilities *a prioiri* to events. We must estimate such probabilities from data!

In human populations, the sex ratio at birth is not 1:1. The probability of a child being male is ~0.512, and the probability of having a female child is ~0.488.

### Probability distribution

*Probability distribution* – A list, or equivalent representation, of the probabilities of all mutually exclusive outcomes of a random trial.

A probability distribution is a relative frequency distribution as the number of observations approaches the size of the population (in the broad sense) under study.

### Examples of discrete probability distributions

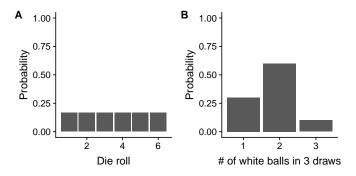


Figure 1: Discrete probability distributions. A) Probability distribution for a single roll of a fair 6-sided die; B) Probability distribution for the number of white balls observed in three draws, without replacement, from an urn filled with 3 white balls and 2 black balls.

## Example of a continuous probability distribution

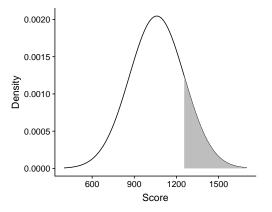


Figure 2: Distribution of total SAT scores for 2017 high school graduates. Assuming a normal distribution with mean =1060, standard deviation =195, based on data reported in the 2017 SAT annual report. The probability that a randomly chosen student got a score better than 1255 is represented by the shaded area;  $P(\mbox{Score} > 1255) = 0.1587.$ 

# Rules for working with probability

### Complement

The *complement*,  $A^c$ , of an event, A, is all the possible outcomes of a random trial that are *not* the event.

$$P(A^c) = 1 - P(A)$$

Sometimes it is easier to calculate the probability of an event's comoplement rather than the probability of an event itself.

Mutually exclusive events are events that can not both occur simultaneously in the same random trial.

### Addition rule, mutually exclusive events

Two events are *mutually exclusive* if they can *not* both occur *simultaneously* in the same random trial.

If events A and B are mutually exclusive, then the probability of either event occuring is the sum of their individual probabilities:

$$P(A \text{ or } B) = P(A) + P(B)$$

### Independence

- ► Independence two events are independent if the occurrence of one does not inform us about the probability that the second.
- ▶ Dependence any events that are not independent are considered to be dependent.

Multiplication rule, independent events

If events A and B are independent than:

$$P(A \text{ and } B) = P(A)P(B)$$

### General addition rule

The general form of the addition rule states:

$$P(A \text{ or } B) = P(A) + P(B) - P(A \text{ and } B)$$

# Conditional probability

Conditional probability – is the probability that an event occurs given that a condition is met.

▶ Denoted: P(A|B). Read this as "the probability of A given B"or "the probability of A conditioned on B".

# Conditional probability example

Consider our urns and balls example, in which we make draws (without replacement) from an urn filled with three white balls and two black balls.

The initial probability of drawing a black ball

$$P(B) = 2/5 = 0.4$$

▶ If the first draw was a white ball, the probability of drawing a black ball is now

$$P(B|1\text{st ball W})) = 2/4 = 0.5$$

### General multiplication rule

The general form of the multiplication rule is:

$$P(A \text{ and } B) = P(A)P(B|A)$$

## Probability trees

Probability trees are diagrams that help calculate the probabilities of combinations of events.

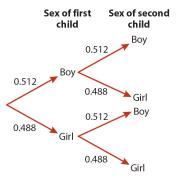


Figure 3: Probability tree for two-child families, from Whitlock and Schluter, Ch. 5