

Probability (Multiplication Rule)

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Estimating Probabilities

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 - ▶ The probability of a coin landing heads is 0.5 because it's what we'd expect after a large number of tosses
- ▶ So it makes sense to use proportions from a finite sample to *estimate* probabilities
 - ▶ For example, the probability of Stephen Curry making a free throw is 0.90
 - ▶ Obviously Steph hasn't shot infinitely many free throws, but he's taken enough for us to get a good estimate (also known as an *empirical probability*)

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- ▶ Most our examples involving categorical variables centered around contingency tables and conditional proportions
 - ▶ Analogous to *conditional proportions* (row and column percentages), is the idea of a **conditional probability**
- ▶ Conditional probability is used in scenarios involving *dependent events*
 - ▶ For example, the probability of getting the flu (event A) might depend on if you've received a flu shot (event B)
- ▶ We denote conditional probability with the following notation:
 $P(A|B)$
 - ▶ Conditional probabilities can be estimated from a contingency table

Example

ACTN3 is known as the fast twitch gene, everyone has one of three genotypes (XX, RR, or RX). The table below summarizes a sample of 301 elite athletes:

| | RR | RX | XX | Total |
|--------------|-----|-----|----|-------|
| Sprint/power | 53 | 48 | 6 | 107 |
| Endurance | 60 | 88 | 46 | 194 |
| Total | 113 | 136 | 52 | 301 |

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- 2) An athlete with the XX genotype is an endurance athlete?

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From this table, let's estimate a few different probabilities:

- 1) An endurance athlete has genotype XX? $46/194 = 0.237$
- 2) An athlete with the XX genotype is an endurance athlete?
 $46/52 = 0.885$
- 3) An athlete has the XX genotype *and* is an endurance athlete?

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- 3) An athlete has the XX genotype *and* is an endurance athlete?
 $46/301 = 0.153$

The Multiplication Rule

The relationship between these probabilities motivates the **multiplication rule**, which states:

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

In our previous example, notice:

- 1) $P(\text{XX}|\text{End}) = 46/194 = 0.237$
- 2) $P(\text{End}) = 194/301 = 0.645$
- 3) $P(\text{XX and End}) = 46/301 = 0.153$

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It's easy verify the multiplication rule: $46/194 = \frac{46/301}{194/301}$

The Multiplication Rule

- ▶ The multiplication rule can be used to calculate the probability of *intersections* (and statements)
 - ▶ Some simple algebra shows:

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

- ▶ Notice it's also true that:

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

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 - ▶ Notice that independence does not mean the events are *disjoint*
 - ▶ $P(A \text{ and } B) = 0$ for disjoint events
- ▶ Independence tends to greatly simplify probability calculations
 - ▶ Consider 3 coin flips:

$$P(H_1 \text{ and } H_2 \text{ and } H_3) = P(H_1) * P(H_2) * P(H_3) = (1/2)^3 = 1/8$$

- ▶ This is a much easier calculation to think about compared to:

$$P(H_1 \text{ and } H_2 \text{ and } H_3) = P(H_3) * P(H_2|H_1) * P(H_3|H_1 \text{ and } H_2)$$

Conclusion

We've now covered 3 probability rules:

- 1) The addition rule, $P(A \text{ or } B) = P(A) + P(B) - P(A \text{ and } B)$, allows us to calculate the probability of *unions* of events
- 2) The multiplication rule, $P(A \text{ and } B) = P(A|B) * P(B)$, allows us to calculate the probability of *intersections* of events
- 3) The complement rule, $P(A) + P(A^C) = 1$, allows simpler calculations for large sample spaces

The final video on probability will go through a few examples illustrating how to determine which rules to apply in different situations