

Module: Probability Basics

Module Outline

- Introduction
- Basic Axioms of probability
- Rules of probability
- Independence and dependence of events

Probability: Introduction

- Uncertainty is ubiquitous: *weather, economy, health, jobs, sports, stocks,.....*

Probability: Introduction

- Uncertainty is ubiquitous: *weather, economy, health, jobs, sports, stocks,.....*
- Lots of related decisions: *insurance, vaccinations, stocks vs bond, which stocks to buy,.....*

Probability: Introduction

- Uncertainty is ubiquitous: *weather, economy, health, jobs, sports, stocks,.....*
- Lots of related decisions: *insurance, vaccinations, stocks vs bond, which stocks to buy,.....*
- How to capture uncertainty/chance more formally?

Example 1: 6-sided Die

- A die is rolled; *possible outcomes*: $\{1, 2, 3, 4, 5, 6\}$



Example 1: 6-sided Die

- A die is rolled; *possible outcomes*: $\{1, 2, 3, 4, 5, 6\}$
- What is the probability that an even number comes up?

Example 1: 6-sided Die

- A die is rolled; *possible outcomes*: $\{1, 2, 3, 4, 5, 6\}$
- What is the probability that an even number comes up?
- What is the probability that the number exceeds 4?

Example 2: Office

- An office has 2 *secretaries*, 4 *interns*, 20 *data analysts*, 2 *accountants* and 2 *managers*.

One of them is randomly picked to go to a convention.



Example 2: Office

- An office has 2 *secretaries*, 4 *interns*, 20 *data analysts*, 2 *accountants* and 2 *managers*.

One of them is randomly picked to go to a convention.

- What is the probability that one of the interns gets picked?

Example 2: Office

- An office has 2 *secretaries*, 4 *interns*, 20 *data analysts*, 2 *accountants* and 2 *managers*.

One of them is randomly picked to go to a convention.

- What is the probability that one of the interns gets picked? $\frac{4}{30}$
- A family is expecting a child? Boy or girl?

Probability: Terminology

- *Sample space S* : Set of all possible outcomes
e.g. for a die: $\{1, 2, 3, 4, 5, 6\}$

Probability: Terminology

- *Sample space S* : Set of all possible outcomes
e.g. for a die: $\{1, 2, 3, 4, 5, 6\}$
- *Event*: a collection (subset) of outcomes

Probability: Terminology

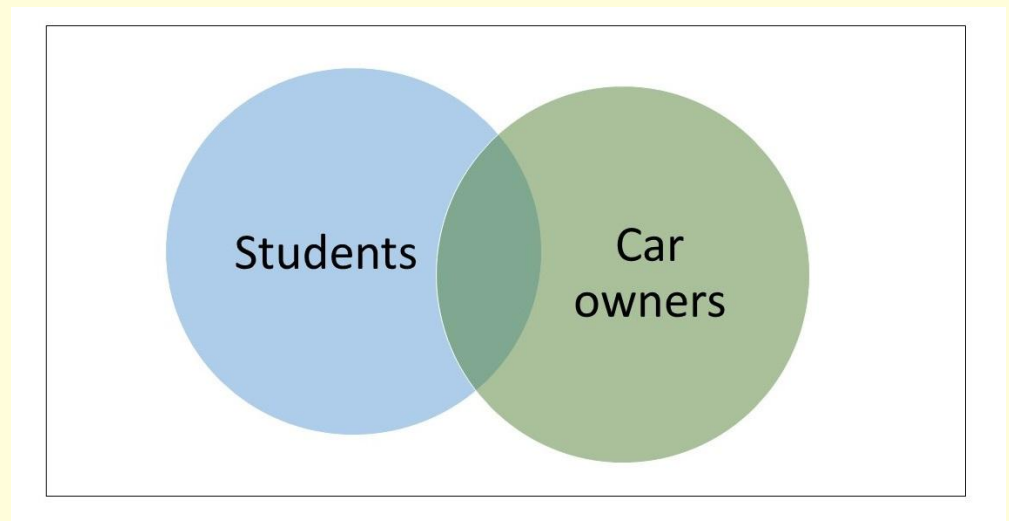
- *Sample space S* : Set of all possible outcomes
e.g. for a die: $\{1, 2, 3, 4, 5, 6\}$
- *Event*: a collection (subset) of outcomes
- Venn diagrams and sets

Example 3: Students and car-ownership

- 100 people were surveyed: 60 own a car
30 were students, 15 of them own a car

Example 3: Students and car-ownership

- 100 people were surveyed: 60 own a car
30 were students, 15 of them own a car
- Venn diagram:



Example 3: Students and car-ownership

- 100 people were surveyed: 60 own a car
30 were students, 15 of them own a car
- Venn diagram:
- $St.$ = set of students C = set of car owners

Example 3: Students and car-ownership

- 100 people were surveyed: 60 own a car
30 were students, 15 of them own a car
- Venn diagram:
- $St.$ = set of students C = set of car owners
- $St \cap C$ = students AND car-owners
 $St \cup C$ = students OR car-owners

Example 3: Students and car-ownership

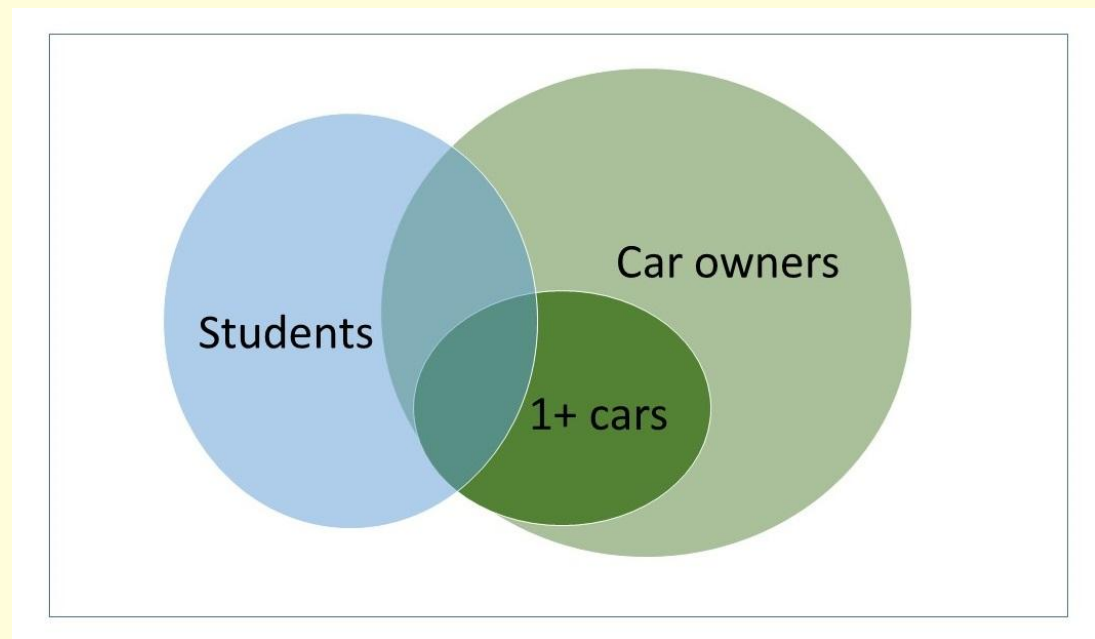
- 100 people were surveyed: 60 own a car
30 were students, 15 of them own a car
- Venn diagram:
- $St.$ = set of students C = set of car owners
- $St \cap C$ = students AND car-owners
 $St \cup C$ = students OR car-owners
- In the survey, what is the prob. of picking someone who is a car-owner, BUT not a student?

Example 3 extended: 100 surveyed

- 60 own cars; of them, 20 own 1+ cars
30 students, 15 of them own cars, 5 own 1+ cars

Example 3 extended: 100 surveyed

- 60 own cars; of them, 20 own 1+ cars
30 students, 15 of them own cars, 5 own 1+ cars
- Venn diagram:



Basic Axioms of Probability

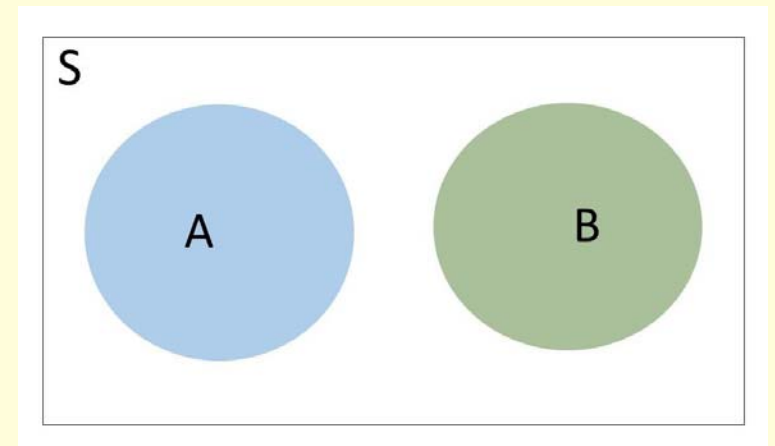
- [i] $0 \leq P(A) \leq 1$

Basic Axioms of Probability

- [i] $0 \leq P(A) \leq 1$
- [ii] $P(\text{Sample Space}) = 1$

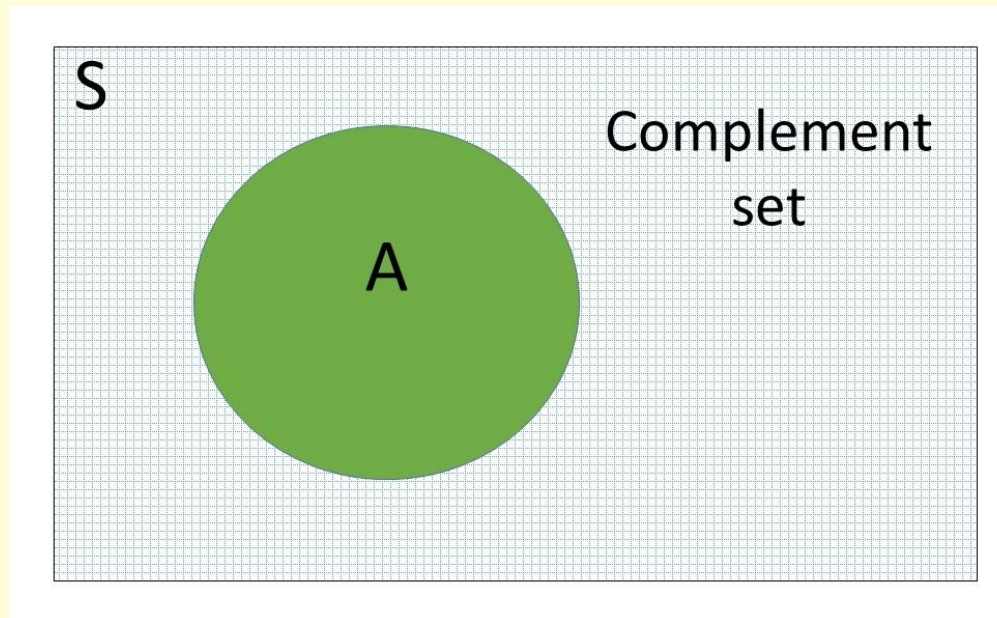
Basic Axioms of Probability

- [i] $0 \leq P(A) \leq 1$
- [ii] $P(\text{Sample Space}) = 1$
- [iii] If A and B are disjoint (*mutually exclusive*),
 $P(A \cup B) = P(A) + P(B)$



Probability rules

- **[Complement rule]** $P(A^c) = 1 - P(A)$



Example 4: Lottery

- A lottery has numbers 1, 2,, 50. What is the prob. that the number picked is not a multiple of 5?



Example 4: Lottery

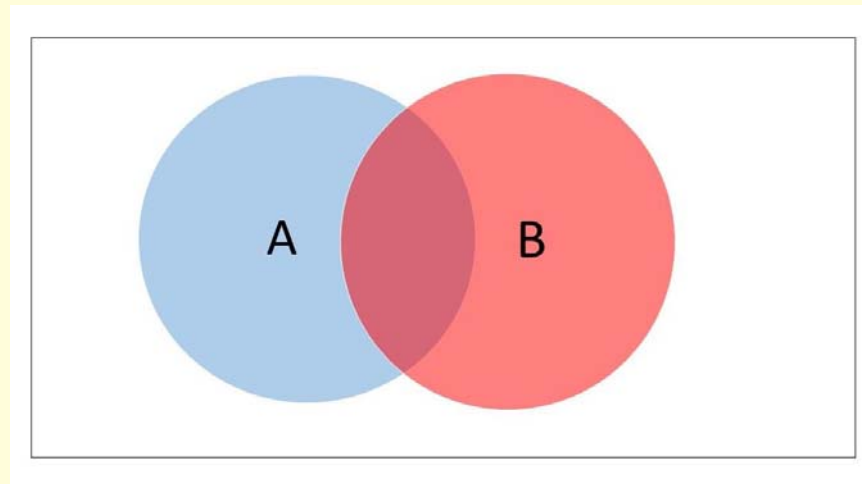
- A lottery has numbers 1, 2, ..., 50. What is the prob. that the number picked is not a multiple of 5?
- Prob(multiple of 5) =

Example 4: Lottery

- A lottery has numbers 1, 2, ..., 50. What is the prob. that the number picked is not a multiple of 5?
- $\text{Prob}(\text{multiple of 5}) =$
- $P(A^c) = 1 - P(A) :$ $\text{Prob}(\text{not a multiple of 5}) =$

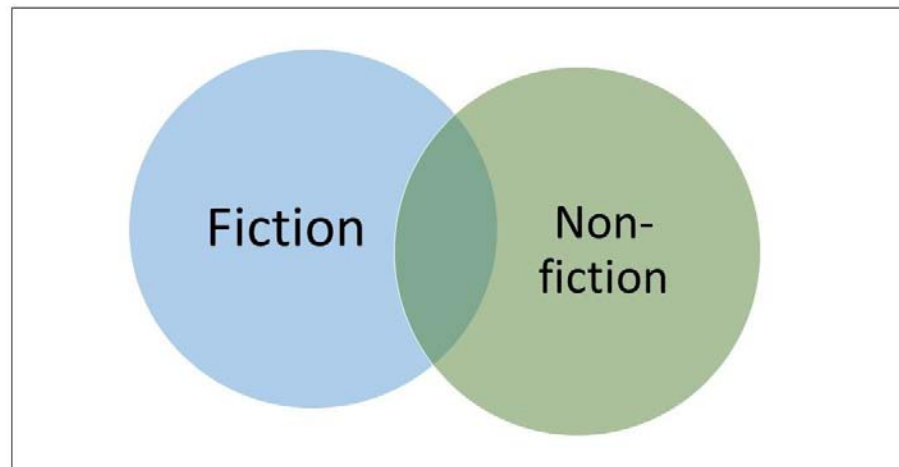
Probability rules: Addition rule

- **[Addition rule]** $P(A \cup B) = P(A) + P(B) - P(A \cap B)$



Example 5: Bookstore

- 200 customers visit a bookstore
75 bought a non-fiction book, 100 bought a fiction
25 bought both



Example 5: Bookstore

- 200 customers visit a bookstore

75 bought a non-fiction book, 100 bought a fiction

25 bought both

- What is the prob. of a customer buying a book?

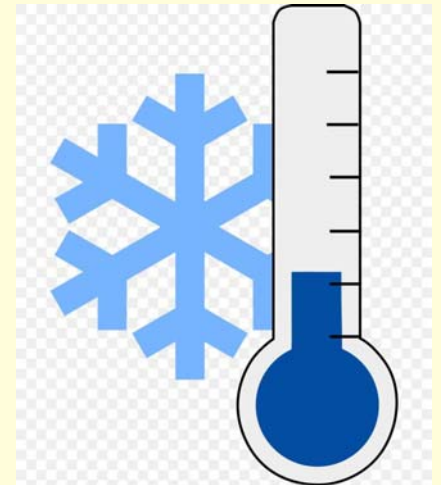
[Addition rule] $P(A \cup B) = P(A) + P(B) - P(A \cap B)$

Example 6: Winterfest in Ottawa

- Organizing a festival in Ottawa on Feb. 5th.

Past 10 yrs: snowed: $\frac{2}{10}$, very cold : $\frac{5}{10}$,

snow AND very cold : $\frac{1}{10}$



Example 6: Winterfest in Ottawa

- Organizing a festival in Ottawa on Feb. 5th.

Past 10 yrs: snowed: $\frac{2}{10}$, very cold : $\frac{5}{10}$,

snow AND very cold : $\frac{1}{10}$

- What is the prob. of there being snow OR being very cold on the day of fest?

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

Example 6: Winterfest in Ottawa

- Organizing a festival in Ottawa on Feb. 5th.

Past 10 yrs: snowed: $\frac{2}{10}$, very cold : $\frac{5}{10}$,

snow AND very cold : $\frac{1}{10}$

- What is the prob. of there being snow OR being very cold on the day of fest?

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

- Prob. of good weather?

Clicker question 1

- Toronto, Dec. 25th, *past 10 yrs*:

snowed: $\frac{2}{10}$, cold: $\frac{4}{10}$, snow AND cold: $\frac{1}{10}$

Q: What is the prob. of there being neither snow NOR being cold on Dec. 25th?

(a) $\frac{2}{10}$

(b) $\frac{4}{10}$

(c) $\frac{5}{10}$

(d) $\frac{6}{10}$

Solution to Clicker question 1

- Toronto, Dec. 25th, *past 10 yrs*:

snowed: $\frac{2}{10}$, cold: $\frac{4}{10}$, snow AND cold: $\frac{1}{10}$

Q: What is the prob. of there being neither snow NOR being cold on Dec. 25th?

(a) $\frac{2}{10}$

(b) $\frac{4}{10}$

(c) $\frac{5}{10}$

(d) $\frac{6}{10}$

Addition rule: Application

- *Example 7: Candn. immigrants in 2017:*

Total: 300,000; Economic class: 160,000

Ontario: 110,000; Economic class in ON: 50,000

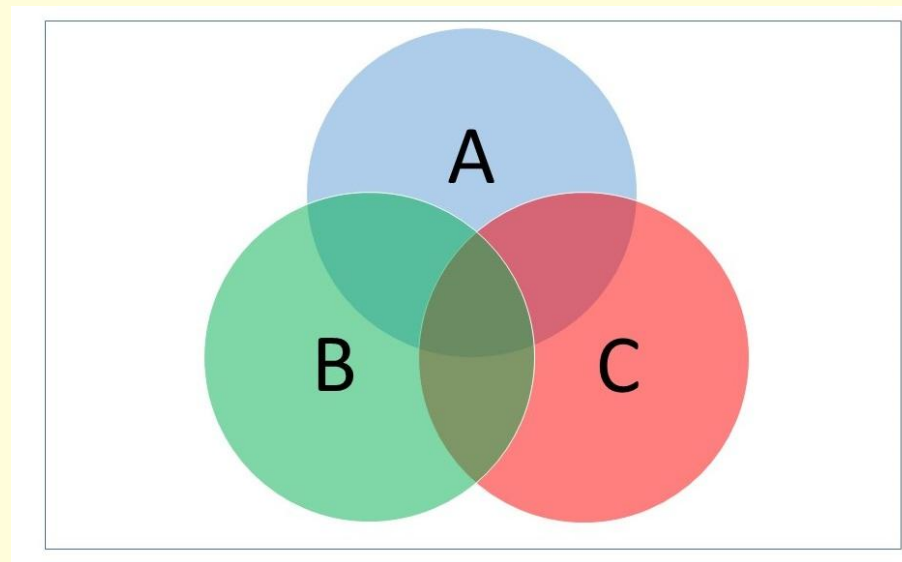
Addition rule: Application

- *Example 7: Candn. immigrants in 2017:*
Total: 300,000; Economic class: 160,000
Ontario: 110,000; Economic class in ON: 50,000
- What is the prob. that a randomly selected immigrant is
(a) of economic class, **(b)** of economic class or in ON?

Probability rules

- **[Addition rule extension]**

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



Addition Rule Extension: Application

- *Example 8:* 100 students in a class did projects $A/B/C$

A	B	C	A and B	B and C	A and C	all 3
30	40	20	10	12	15	5

What is the prob. that a random student did at least one of the assignments?

Addition Rule Extension: Application

- *Example 8:* 100 students in a class did projects $A/B/C$

A	B	C	A and B	B and C	A and C	all 3
30	40	20	10	12	15	5

What is the prob. that a random student did at least one of the assignments?

-

$$\begin{aligned} P(A \cup B \cup C) = & P(A) + P(B) + P(C) - P(A \cap B) \\ & - P(B \cap C) - P(A \cap C) + P(A \cap B \cap C) \end{aligned}$$

Clicker question 2

- In the above example, what is the prob. that a random student did not submit any of the projects?

(a) 0.10

(b) 0.42

(c) 0.55

(d) 0.62

Solution to Clicker question 2

- In the above example, what is the prob. that a random student did not submit any of the projects?

(a) 0.10

(b) 0.42

(c) 0.55

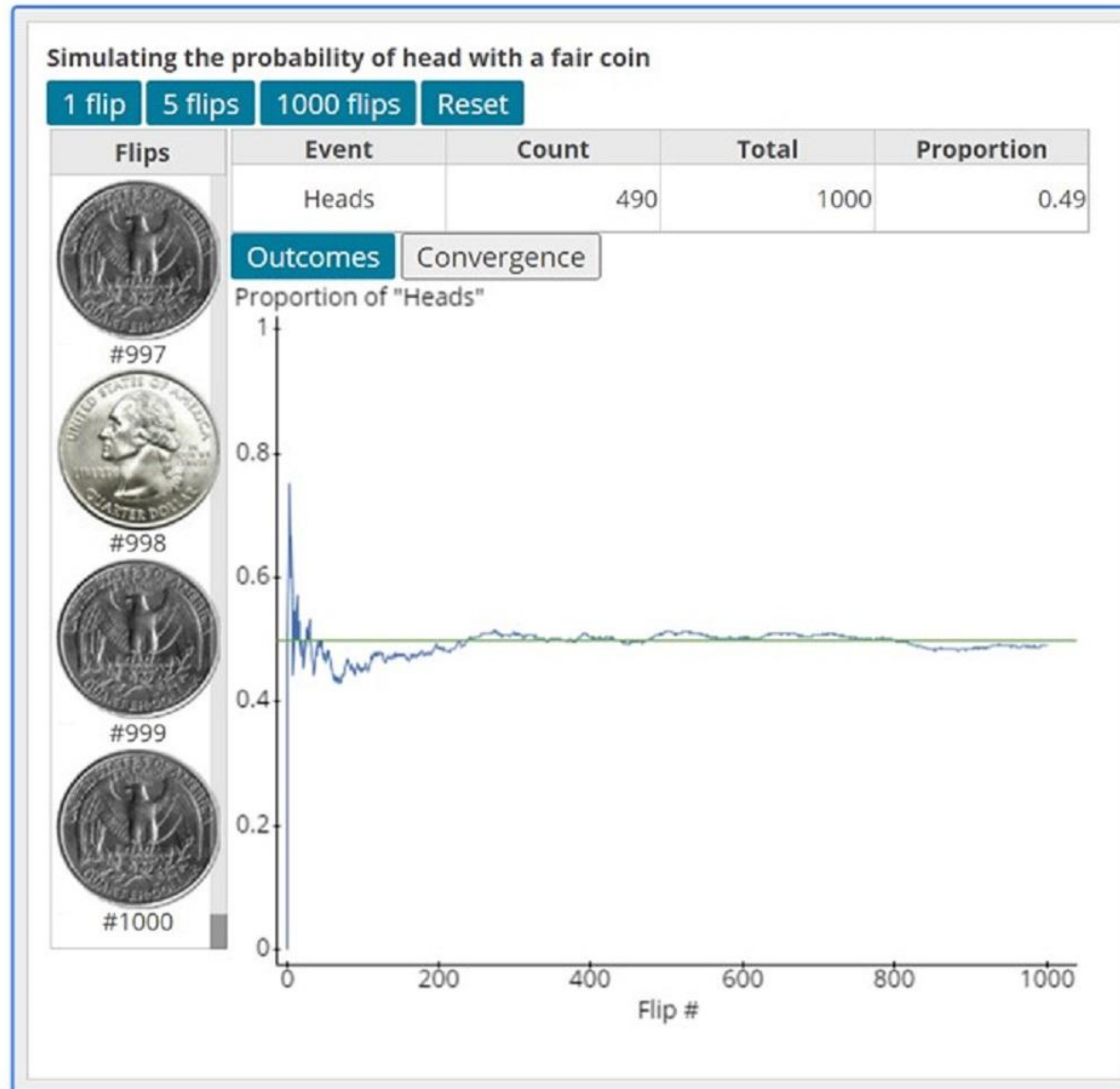
(d) 0.62

Interpretation of probability

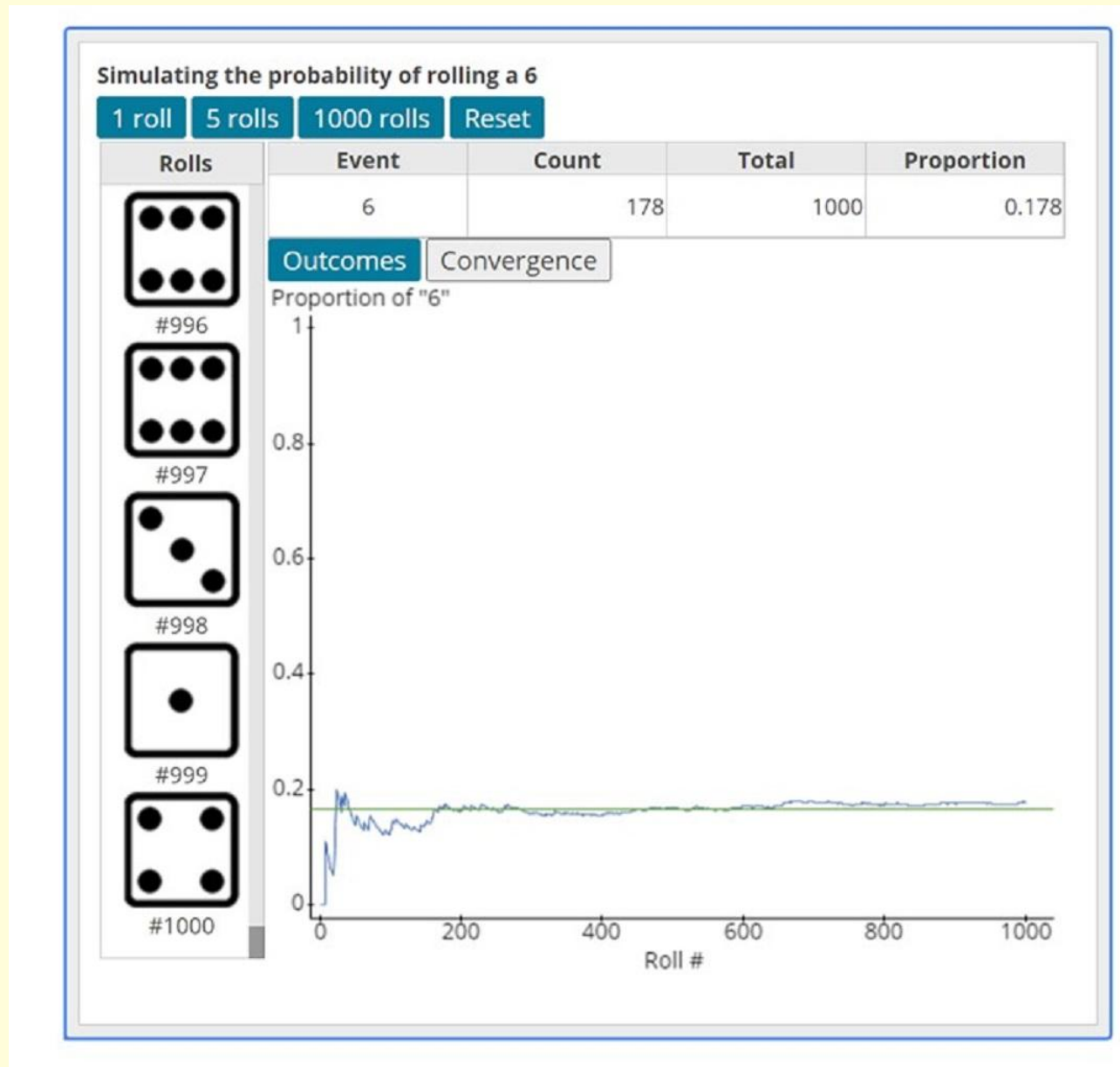
- *Frequentist:*

If you repeat the experiment many, many times, the fraction will go to probability

Frequentist: Tossing a coin 1000 times (statcrunch.com)



Frequentist: Rolling a die 1000 times (statcrunch.com)



Interpretation of probability

- *Frequentist:*

If you repeat the experiment many, many times, the fraction will go to probability

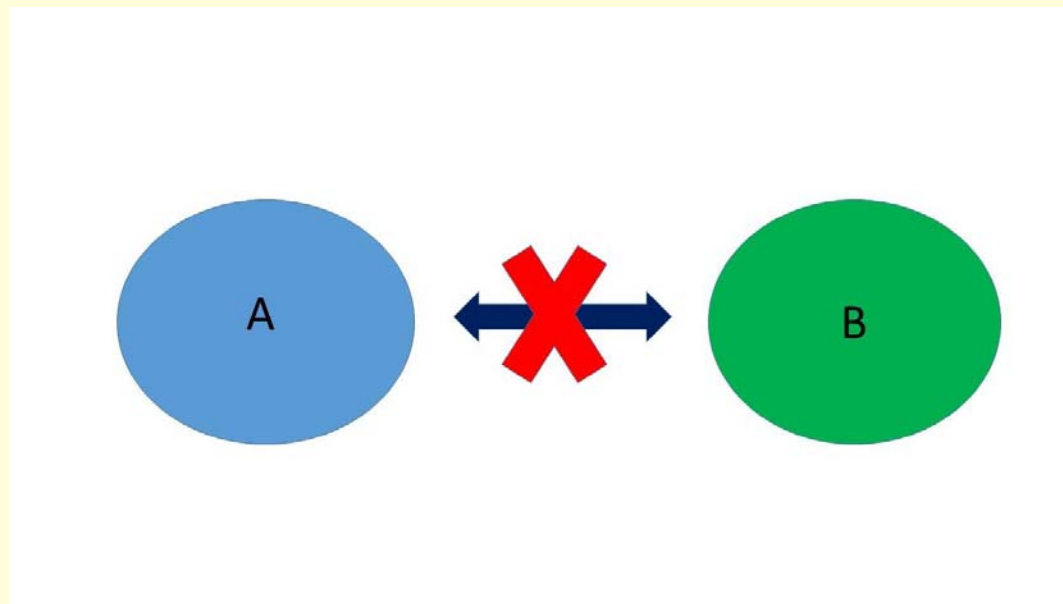
- *Personal prob.:*

Beliefs around rare events (e.g. will I do well in the course?, will Trump get re-elected?.....)



Relationship between events

- Independence: Two events A and B are independent if the occurrence of one does not influence the prob. of the other occurring.



Relationship between events

- Independence: Two events A and B are independent if the occurrence of one does not influence the prob. of the other occurring.
- Example: coin tosses, gender of children,.....

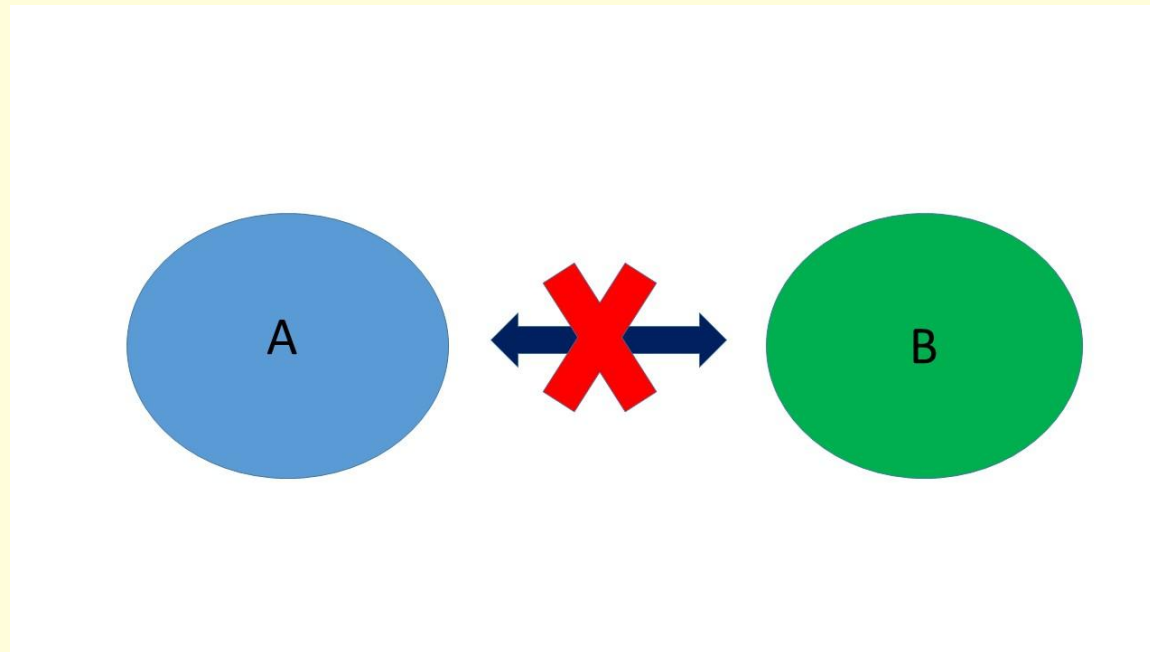
Relationship between events

- Independence: Two events A and B are independent if the occurrence of one does not influence the prob. of the other occurring.
- Example: coin tosses, gender of children,.....
- *Example*: draw a card from a deck of 52 cards
1st one is King of Hearts: Replace it back or not
Effect on 2nd card drawn?



Independent and Dependent events

- **Independent:** No relationship between the events.



Independent and Dependent events

- **Independent:** No relationship between the events.
- Examples: *has a pet and owns a car, wins a lottery ticket and finds \$10 on the street, rainy in NY and rainy in TO,.....*

Independent and Dependent events

- **Independent:** No relationship between the events.
- Examples: *has a pet and owns a car, wins a lottery ticket and finds \$10 on the street, rainy in NY and rainy in TO,.....*
- **Dependent:** Some relationship between the events.

Independent and Dependent events

- **Independent:** No relationship between the events.
- Examples: *has a pet and owns a car, wins a lottery ticket and finds \$10 on the street, rainy in NY and rainy in TO,.....*
- **Dependent:** Some relationship between the events.
- Examples: *has a pet and owns a vaccum, drives over the speed limit and gets a ticket, is snowy and flights are delayed,*

Independent and Dependent events

- **Independent:** No relationship between the events.
- Examples: *has a pet and owns a car, wins a lottery ticket and finds \$10 on the street, rainy in NY and rainy in TO,.....*
- **Dependent:** Some relationship between the events.
- Examples: *has a pet and owns a vaccum, drives over the speed limit and gets a ticket, is snowy and flights are delayed,*
- *Random walk theory of stock prices*

Independence

- If events A and B are independent:

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

Independence

- If events A and B are independent:

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

- **Example 9:** draw a card from a deck of 52 cards

With replacement: Prob. that first two are *Hearts*?



Independence

- If events A and B are independent:

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

- **Example 9:** draw a card from a deck of 52 cards

With replacement: Prob. that first two are *Hearts*?

- Without replacement: Prob. that first two are *Hearts*?

Independence Rule: Extension

- If events $A_1, A_2, \dots, A_n$ are independent:

$$P(A_1 \cap A_2 \cap \dots \cap A_n) = P(A_1)P(A_2)\dots P(A_n)$$

Independence Rule: Extension

- If events $A_1, A_2, \dots, A_n$ are independent:

$$P(A_1 \cap A_2 \cap \dots \cap A_n) = P(A_1)P(A_2)\dots P(A_n)$$

- **Example 10:** A family has 3 children. What is the prob. that all 3 are boys?



Independence Rule: Extension

- If events $A_1, A_2, \dots, A_n$ are independent:

$$P(A_1 \cap A_2 \cap \dots \cap A_n) = P(A_1)P(A_2)\dots P(A_n)$$

- **Example 10:** A family has 3 children. What is the prob. that all 3 are boys?
- $P(\text{all boys}) = P(BBB)$

Independence Rule: Extension

- If events $A_1, A_2, \dots, A_n$ are independent:

$$P(A_1 \cap A_2 \cap \dots \cap A_n) = P(A_1)P(A_2)\dots P(A_n)$$

- **Example 10:** A family has 3 children. What is the prob. that all 3 are boys?
- $P(\text{all boys}) = P(BBB)$
- $P(BBB) = \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) = \left(\frac{1}{2}\right)^3 = \frac{1}{8}$

Example 10 continued

- **Q:** A family has 3 children. What is the prob. that at least one of them is a girl?



Example 10 continued

- **Q:** A family has 3 children. What is the prob. that at least one of them is a girl?
- $1 - P(\text{all boys}) = 1 - P(BBB) =$

Example 10 continued

- **Q:** A family has 3 children. What is the prob. that at least one of them is a girl?
- $1 - P(\text{all boys}) = 1 - P(BBB) =$
- $P(\text{at least one girl}) = 1 - \left(\frac{1}{8}\right) = 0.875$

Example 10 continued

- **Q:** A family has 3 children. What is the prob. that exactly two of them are girls?



Example 10 continued

- **Q:** A family has 3 children. What is the prob. that exactly two of them are girls?
- $P(GGB) = \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) = \left(\frac{1}{2}\right)^3 = \frac{1}{8}$

Example 10 continued

- **Q:** A family has 3 children. What is the prob. that exactly two of them are girls?
- $P(GGB) = \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) * \left(\frac{1}{2}\right) = \left(\frac{1}{2}\right)^3 = \frac{1}{8}$
- GGB, GBG, BGG Total prob. = $\frac{3}{8}$

Clicker question 3

- Which of the following events are independent?
 - (a) *Parking illegally and getting a ticket*
 - (b) *Owning a phone and being a hockey fan*
 - (c) *A dry summer and forest fires*
 - (d) *Buying more lottery tickets and winning the lottery*

Solution to Clicker question 3

- Which of the following events are independent?
 - (a) *Parking illegally and getting a ticket*
 - (b) *Owning a phone and being a hockey fan*
 - (c) *A dry summer and forest fires*
 - (d) *Buying more lottery tickets and winning the lottery*

Independence: Implications

- **Gambler's fallacy:** "The last ten flips were tails. I am now surely due for a head."



Independence: Implications

- **Gambler's fallacy:** "The last ten flips were tails. I am now surely due for a head."
- "Since he didn't score a goal in the last 10 games, he is due for one"

Independence: Implications

- **Gambler's fallacy:** "The last ten flips were tails. I am now surely due for a head."
- "Since he didn't score a goal in the last 10 games, he is due for one"
- "Since last 3 winters were brutal, we are due for a mild one this year"

Independence: Implications

- **Gambler's fallacy:** "The last ten flips were tails. I am now surely due for a head."
- "Since he didn't score a goal in the last 10 games, he is due for one"
- "Since last 3 winters were brutal, we are due for a mild one this year"
- Random sampling

Independence: Application

- **Example 11:** 15% of Canadians are smokers (2017 UWaterloo study)



Independence: Application

- **Example 11:** 15% of Canadians are smokers (2017 UWaterloo study)
- Suppose you survey 10 persons at random. What is the prob. that:
 - (a) none is a smoker:

Independence: Application

- **Example 11:** 15% of Canadians are smokers (2017 UWaterloo study)
- Suppose you survey 10 persons at random. What is the prob. that:
 - (a) none is a smoker:
 - (b) exactly one of them is a smoker?



Independence: Application

- **Example 11:** 15% of Canadians are smokers (2017 UWaterloo study)
- Suppose you survey 10 persons at random. What is the prob. that:
 - (a) none is a smoker:
 - (b) exactly one of them is a smoker?
 - (c) at least two of them are smokers



Clicker question 4

- A family has 3 children. What is the prob. that exactly one of them is a boy?

(a) $\frac{1}{8}$

(b) $\frac{1}{2}$

(c) $\frac{3}{8}$

(d) $\frac{1}{3}$

Solution to Clicker question 4

- A family has 3 children. What is the prob. that exactly one of them is a boy?

(a) $\frac{1}{8}$

(b) $\frac{1}{2}$

(c) $\frac{3}{8}$

(d) $\frac{1}{3}$

Example of dependent event

- **Example:** Free-throws in basketball (NBA)

1st throw: success-rate 73% (2005-10):

Example of dependent event

- **Example:** Free-throws in basketball (NBA)

1st throw: success-rate 73% (2005-10):

- 2nd throw: success-rate depends on if 1st was a success



Example of dependent event

- **Example:** Free-throws in basketball (NBA)
1st throw: success-rate 73% (2005-10):
- 2nd throw: success-rate depends on if 1st was a success
- **if 1st successful:** success-rate on 2nd : 79%
- **if 1st unsuccessful:** success-rate on 2nd : 72%

Checking for independence

- **Example 12:** In a university sample, 70% of the students reported living off-campus. 40% reported belonging to some club, 20% reported living off-campus and belonging to a club.



Checking for independence

- **Example 12:** In a university sample, 70% of the students reported living off-campus. 40% reported belonging to some club, 20% reported living off-campus and belonging to a club.
- Suppose: $C \equiv$ belongs to a club
 $O \equiv$ lives off-campus
Q: Are C and O independent?

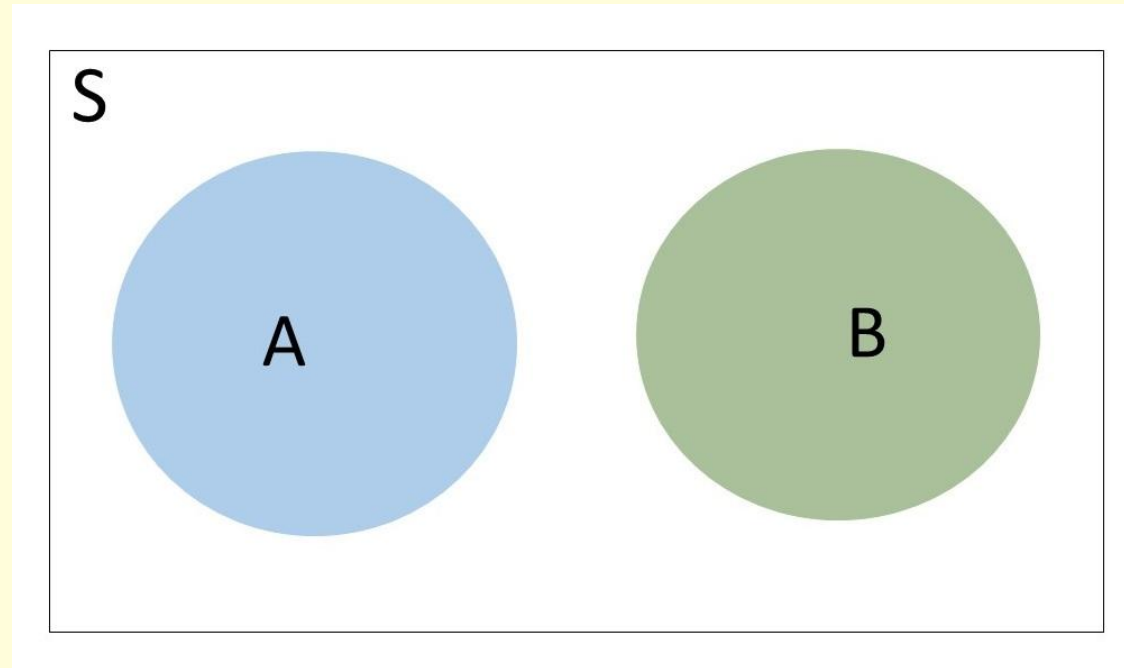
Checking for independence

- **Example 12:** In a university sample, 70% of the students reported living off-campus. 40% reported belonging to some club, 20% reported living off-campus and belonging to a club.
- Suppose: $C \equiv$ belongs to a club
 $O \equiv$ lives off-campus
Q: Are C and O independent?
- If C and O are independent:

$$P(C \cap O) = P(C)P(O)$$

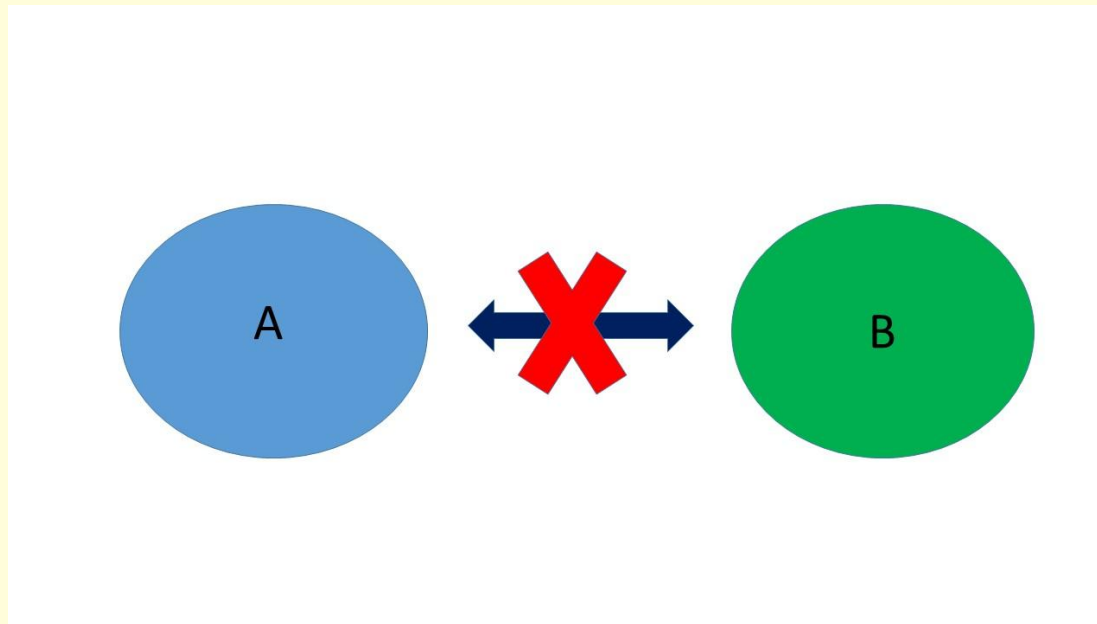
Independence vs Mutually Exclusive

- *Mutually exclusive*: two events cannot occur at the same time



Independence vs Mutually Exclusive

- *Mutually exclusive*: two events cannot occur at the same time
- *Independence*: one event does not influence the other



Independence vs Mutually Exclusive

- *Mutually exclusive*: two events cannot occur at the same time
- *Independence*: one event does not influence the other
- Example: $P \equiv$ Jim passes the course
 $F \equiv$ Jim fails the course

Independence vs Mutually Exclusive

- *Mutually exclusive*: two events cannot occur at the same time
- *Independence*: one event does not influence the other
- Example: $P \equiv$ Jim passes the course
 $F \equiv$ Jim fails the course
- P and F are disjoint, but not independent