# Probability

Session 1 Module 1 Probability & Statistical Inference **The Summer Institutes** 

DEPARTMENT OF BIOSTATISTICS SCHOOL OF PUBLIC HEALTH

UNIVERSITY of WASHINGTON



#### Liber de ludo aleae

(Book on Games of Chance) by Gerolamo Cardano

- Written 1526 (published 1663)
- First systematic treatment of probability

OTHING IN LIFE IS CERTAIN. IN EVERYTHING WE DO, WE GAUGE THE CHANCES OF SUCCESSFUL OUTCOMES, FROM BUSINESS TO MEDICINE TO THE WEATHER. BUT FOR MOST OF HUMAN HISTORY, PROBABILITY, THE FORMAL STUDY OF THE LAWS OF CHANCE, WAS USED FOR ONLY ONE THING: GAMBLING.



Session 1



**1 Probability** 

A measure of uncertainty associated with the occurrence of events or outcomes.



**APPROACH 1** 

**Classical**: P(E) = m/N

If an event can occur in N <u>mutually exclusive, equally likely</u> ways, and if **m** of these possess characteristic **E**, then the probability of **E** is equal to **m/N** 

**Example** What is the probability of rolling a total of 7 on two dice?

> E = two dice sum to 7 N = 36 m = 6 P(E) = m / N = 6/36 = 1/6



A measure of uncertainty associated with the occurrence of events or outcomes.

**1 Probability** 

**Example** Around 1900, the English statistician Karl Pearson heroically tossed a coin 24,000 times and recorded 12,012 heads, giving a proportion of 0.5005.

**APPROACH 2** 

#### **Relative Frequency**: Pr(E) ≈ m/n

If a process or an experiment is repeated a large number of times **N**, and if the characteristic **E**, occurs m times, then the relative frequency, **m/N**, of **E** will be approximately equal to the probability of **E**.



#### Session 1 Session 1 PROBABILITY AND INFERENTIAL STATISTICS UNIVERSITY of WASHINGTON 0 0 0 0 0 0 1000 n

**1 Probability** 

A measure of uncertainty associated with the occurrence of events or outcomes.

**APPROACH 3** 

**Personal Probability** What is the probability of life on Mars?



Sample Space

The **sample space** consists of the possible outcomes of an experiment. An event is an outcome or set of outcomes.

For a coin flip the sample space is (H,T).

THE SAMPLE SPACE OF THE THROW OF A SINGLE DIE IS A LITTLE BIGGER.



AND FOR A PAIR OF DICE, THE SAMPLE SPACE LOOKS LIKE THIS (WE MAKE ONE DIE WHITE AND ONE BLACK TO TELL THEM APART):



### **Basic Properties of Probability**

> Two events A and B are said to be **mutually exclusive (disjoint)** if only one or the other, but not both, can occur in a particular experiment.



- > Given an experiment with n mutually exclusive events,  $E_1, E_2, ..., E_n$ , the probability of any event is non-negative and less than 1:  $0 \le P(E_i) \le 1$
- The sum of the probabilities of an exhaustive collection (i.e., at least one must FERENTIAL STATISTIC occur) of mutually exclusive outcomes is 1:
  PROBABILITY AN

$$\sum_{i=1}^{n} P(E_i) = P(E_1) + P(E_2) + \dots + P(E_n) = 1$$

The probability of all events other than an event A is denoted by P(A<sup>c</sup>). Note that P(A<sup>c</sup>) = 1 - P(A)



### Break #1

Pause the video, take a break, stretch, then review relevant exercises from worksheet.

Afterwards, continue on!



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### **Notation for Joint Probabilities**

If A and B are any two events then we write

P(A or B) or P(A  $\cup$  B)

to indicate the probability that event A or event B (or both) occurred.

If A and B are any two events then we write

P(A and B) or P(AB) or P(A  $\cap$  B)

to indicate the probability that both A and B occurred.





### **Notation for Joint Probabilities**

If A and B are any two events then we write the conditional probability

$$P(A \mid B) = rac{P(A \cap B)}{P(B)}$$

to indicate the probability of A among the subset of cases in which B is known to have occurred.





## General Probability Rules Addition Rule

If two events A and B are not mutually exclusive, then the probability that event A or event B occurs is:

P(A or B) = P(A) + P(B) - P(AB)

**Example** Of the students at Anytown High school, 40% have had the mumps, 70% have had measles and 32% have had both. What is the probability that a randomly chosen student has had at least one of the above diseases?







# General Probability Rules

Two events A and B are said to be **independent** if and only if P(A | B) = P(A) or P(B | A) = P(B) or P(AB) = P(A)P(B)

(Note: If any one holds then all three hold)

**Example** Of the students at Anytown High school, 40% have had the mumps, 70% have had measles and 32% have had both.

Are the two events independent?

No, because P(mumps and measles) = 0.32 while P(mumps) P(measles) = 0.28

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# General Probability Rules Multiplication Rule

Two events A and B are "independent" (probability of one does not depend on whether the other occurred) if

 $P(AB) = P(A \mid B)P(B) = P(B \mid A)P(A)$ 

**Example** Of the students at Anytown High school, 40% have had the mumps, 70% have had measles. The probability of having measles given you have mumps is 80%.

What's the probability of having both?

P(both) = P(measles | mumps) P(mumps) = 0.80 \* 0.40 = 0.32



Break #2

Pause the video, take a break, stretch, then review relevant exercises from worksheet.

Afterwards, continue on!



Image Credit: indg0.com

## General Probability Rules Total Probability

If  $A_1$ , ...,  $A_n$  are mutually exclusive, exhaustive events, then

$$P(B) = \sum_{i=1}^n P(B \cap A_i) = \sum_{i=1}^n P(B \,|\, A_i) P(A_i)$$





# General Probability Rules Bayes' Rule

Bayes' rule combines multiplication rule with total probability rule

$$P(A_j | B) = \frac{A_j \cap B}{P(B)} = \frac{P(B | A_j) P(A_j)}{P(B)} = \frac{P(B | A_j) P(A_j)}{\sum_{i=1}^n P(B | A_i) P(A_i)}$$

We will only apply this to the situation where A and B have two levels each, say, A and A<sup>c</sup>, B and B<sup>c</sup>. The formula becomes

 $P(A \mid B) = rac{P(B \mid A) P(A)}{P(B \mid A) P(A) + P(B \mid A^c) P(A^c)}$ 





## An Application of Bayes' Rule Screening

Suppose we have a random sample of 1100 people from a population...

A = disease pos.

B = test pos.

**Prevalence** = P(A) = 100/1100 = 0.091

**Sensitivity** = P(B | A) = 90/100 = 0.9

**Specificity** = P(B<sup>c</sup> | A<sup>c</sup>) = 970/1000 = 0.97

**PVP** = P(A | B) = 90/120 = 0.75 (predictive value of a positive test)

**PVN** = P(A<sup>c</sup> | B<sup>c</sup>) = 970/980 = 0.99 (predictive value of a negative test)

#### **Disease Status**

