



## Probabilities

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## Program

- Probabilities
  - Sample space, events and probabilities
  - Rules for probability calculations
- Independence
- Conditional probability



## Probabilities

- Rules for probabilities are for statistics what arithmetic is for mathematics.
- Any probability statement, like a p-value or a confidence interval, is the result of a probability calculation.
- You will only see a tiny bit of it, but enough for computing precision of counts.



## Example: diagnostic tests

Known from earlier experiments that,

- For meat with E. coli O157 the test is positive in 90% of the cases **true positives**.
- For meat without E. coli O157 the test is negative in 95% of the cases E. coli O157 is in 0.01% of the meat samples (the prevalence of E. coli O157).



Problem: the test is not perfect!

What is the probability for a sample to be infected by the E. coli, if the test is positive?



## Example: inverse sampling

Estimation of the fraction of leaves with aphids.

- Method 1: **direct sampling**. Inspect 60 leaves for aphids. Result 12 leaves with aphids (for example). Estimated fraction  $12/60 = 0.20$ . Uncertainty?
- Method 2: **inverse sampling**. Count the number of leaves inspected until one with aphids is found. Do that 10 times, say. Results (for example): Aphids found on leaf number

2 7 2 9 1 3 7 1 3 2

Estimate for fraction of leaves aphids? Uncertainty?



## Sample space and events

The sample space,  $U$ , is the set of all possible results. When throwing a die, the sample space is the set  $U = \{1, 2, 3, 4, 5, 6\}$ .

An **event**,  $A$ , is a subset of  $U$ ,  $A \subseteq U$ .

Example: the event “an odd number” when throwing a die,

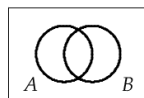
$$A = \{1, 3, 5\}$$



## Relations between events/sets



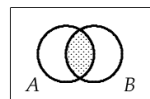
Sample space



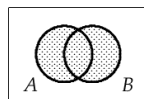
Events  
 $A$  og  $B$



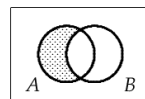
Disjoint  
events



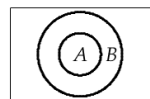
Intersection  
 $A \cap B$



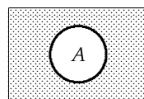
Union  $A \cup B$



Set difference  $A \setminus B$



$A$  implies  $B$   
 $A \subseteq B$



Complement set  $A^c$



## Definition of probability

Let  $U$  be the sample space for some trial. A **probability distribution** on  $U$  is a function  $P$  that assigns a number,  $P(A)$ , to any event,  $A$  say, and which satisfies the conditions,

- 1  $0 \leq P(A) \leq 1$  for any event,  $A$ .
- 2  $P(U) = 1$
- 3  $P(A \cup B) = P(A) + P(B)$  if  $A \cap B = \emptyset$ .



## Three important probability rules

- Addition rule
  - $P(\text{Either } A \text{ or } B \text{ occurs}) = P(A) + P(B)$ ,  
if  $A$  and  $B$  exclude each other
- Multiplication rule
  - $P(A \text{ and } B \text{ both occur}) = P(A) \cdot P(B)$ ,  
if  $A$  and  $B$  are independent
- Bayes' rule

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

A formula for "switching" a conditional probability



## More computation rules

Let  $A$  and  $B$  be events in the sample space  $U$ . Then,

- 4  $P(B \setminus A) = P(B) - P(A \cap B)$ .
- 5  $P(A) \leq P(B)$  if  $A \subseteq B$ .
- 6  $P(A^c) = 1 - P(A)$ .
- 7  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$ .
- 8  $P(\emptyset) = 0$
- 9  $P(A_1 \cup \dots \cup A_k) = P(A_1) + \dots + P(A_k)$  if  $A_1, \dots, A_k$  is pairwise disjoint events,  $A_i \cap A_j = \emptyset$  for all  $i \neq j$ .



## Addition rule: use it with care!

If the probability of finding a certain DNA-sequence in a DNA-sample is 0.03, then what is the probability of finding the sequence in at least one out of five DNA-samples?

## Conditional probabilities

Let  $A$  and  $B$  be events with  $P(B) > 0$ . The **conditional probability** for  $A$  given  $B$  is defined as

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

Interpretation: the probability of  $A$  **among those cases where  $B$  occurs**.

If  $P(A|B) = P(A)$ ,  $A$  is said to be **independent of  $B$** , (see next slide).

Interpretation:  $P(A)$  is **unaffected of whether  $B$  occurs**.



## Independence

Two events,  $A$  and  $B$ , are said to be **independent**, if

$$P(A \cap B) = P(A) \cdot P(B).$$

This is, in fact, the **multiplication rule**. Thus, the multiplication rule just repeats the definition of independent events.

**Independent replications** of a trial (or an experiment) means a series of trials for which events from the different trials are independent. (The trials do not affect each other).



## Exercise

Two parents both have genotype  $Aa$  for eye color, that is, one allele (gene) for blue eyes ( $a$ ) and one for brown eyes ( $A$ ). What is the probability for their child to have brown eyes (genotype  $AA$  or  $Aa$ , but not  $aa$ )?

**NOT ALLOWED** to add, subtract, multiply or divide without mentioning which rule you use to allow it!



## Bayes' rule

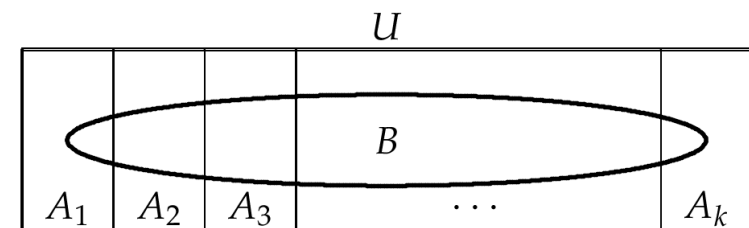
For events  $A$  and  $B$  with  $P(A) > 0$  and  $P(B) > 0$ , Bayes' rule states that

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

Useful for "switching" conditional probabilities. (This essentially just repeats the definition of a conditional probability.)



## Bayes' rule II



$$P(B) = P(B|A_1)P(A_1) + \dots + P(B|A_k)P(A_k)$$

provided that the sets  $A_1, \dots, A_k$  partition the sample space (as shown in the figure), and  $P(A_i) > 0$ .



## *Salmonella* Manhattan and smoked ham

Case-control investigation of a series of *Salmonella* Manhattan infections. Infected persons are compared with a control group.

Have eaten smoked ham from slaughterhouse S	Infected?		Total
	Yes	No	
Yes	16	80	96
No	2	2500	2502
Total	18	2580	2598

We want:  $P(\text{inf}|\text{ham})$ . Hmm...

We have:  $P(\text{ham}|\text{inf})$ .

We need:  $P(\text{inf})$ : from hospitals:  $P(\text{inf}) = 0.002$ .

We need also  $P(\text{ham})$ : from sales statistics:  $P(\text{ham}) = 0.033$ .

Actually, it suffices to know either  $P(\text{inf})$  or  $P(\text{ham})$ .



## Lecture summary: main points

- Probabilities and rules of computation
- Conditional probabilities
- Bayes' rule

