

**Slides**  
**Probability Theory**  
**Chapter 2**

**Combinatorial probability**

Computing probabilities combinatorically is possible when all outcomes are **equally likely: count the numbers.**

- The “**art of counting**” is applied often when we have a random sample taken from a finite population at hand: if we arbitrarily choose one element of the population, then every outcome has the **same probability of occurrence.**

- **Example:**

A car company buys a group of 20 old VW Golf cars, of which the company does not know that 5 suffer from severe hidden defects.

The company decides to check 4 of the 20 cars at random.

What is the probability that:

1. Two of the 4 checked cars suffer from severe defects?
2. None of the 4 cars has severe defects?

# Basic rules of combinatorics

**The product rule:** if partial experiment 1 has  $m$  outcomes and partial experiment 2  $n$  outcomes (no matter what the result of experiment 1 was), then the combination of the two experiments has  $m \times n$  outcomes.

“Drawing  $n$  individuals from a population of  $N$  individuals” can be executed in different ways:

- Drawing **with** or **without** replacement:  
With replacement  $\rightarrow$  repeated outcomes possible
- Two kinds of outcomes:  
**permutations: ordered outcomes**  
**combinations: unordered outcomes,**  
**subsets of the population**

In statistics a **random sample of  $n$  out of  $N$**  usually consists of **combinations without replacement.**

# Examples of counting

## 1. We roll a dice 3 times:

3 partial experiments with each 6 equally likely outcomes:

Every (ordered) outcome, such as (1, 5, 1) has probability  $\frac{1}{216}$ , since there are  $6 \times 6 \times 6 = 216$  outcomes.

## 2. How many lists of the 6 participants of a song contest are possible, if the order of appearance is randomly chosen?

Determine the number of permutations - without replacement:

$6 \times 5 \times 4 \times 3 \times 2 \times 1 = 720$ . **Notation: 6! (“6 factorial”)**

## 3. Generalization: the number of lists with $n$ participants is $n!$

## 4. How many lists of 6 persons are there if we choose them arbitrarily from a group of 15 persons (without replacement)?

15 outcomes for the 1<sup>st</sup> choice, 14 for the 2<sup>nd</sup>, etc.:

$$15 \times 14 \times 13 \times 12 \times 11 \times 10 = \frac{15!}{9!}$$

# Numbers of permutations and combinations of $n$ out of $N$

- The numbers of permutations (variations) of  $n$  out of  $N$

$$N \times (N - 1) \times \cdots \times (N - n + 1) = \frac{N!}{(N - n)!}$$

**Calculator: use the button  $nPr$**

- The numbers of combinations of 6 out of 15  
(= the numbers subsets of 6 elements chosen out of 15):  
For **each** combination of 6 there are  $6!$  permutations.  
So: the number of permutations = (# of combinations)  $\times 6!$

$$\text{The number of combinations} = \frac{\frac{15!}{9!}}{6!} = \frac{15!}{6!9!}$$

- In general: the number of combinations of  $n$  out of  $N$  is  
$$\frac{(\text{\#permutations of } n \text{ out of } N)}{n!} = \frac{N!}{n!(N-n)!}$$
 (say: “ $N$  choose  $n$ ”)

**Notation:** binomial coefficient  $\binom{N}{n}$ , calculator button:  $nCr$

# Combinatorics and probabilities of sample results

If a **combination** of  $n$  person is chosen arbitrarily and without replacement from a population of  $N$  persons, then the

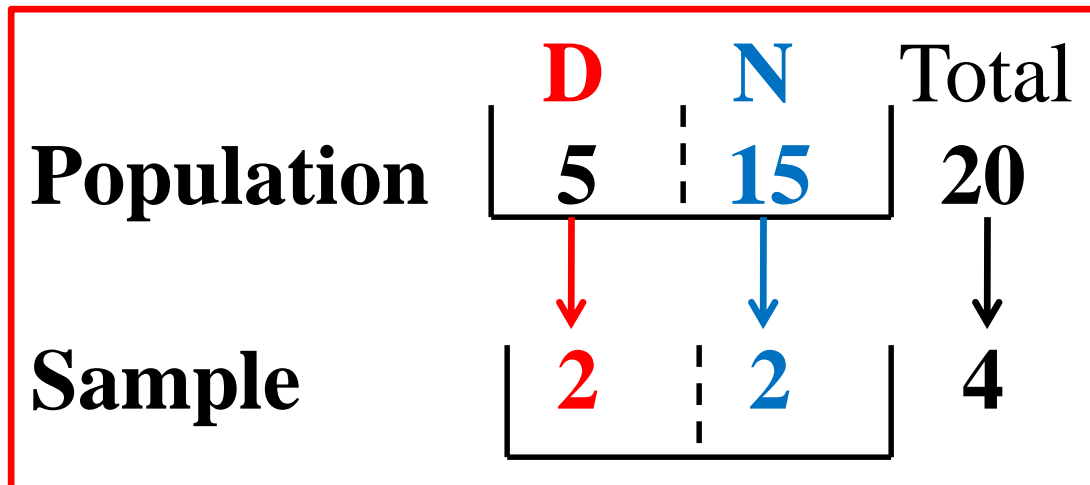
probability of each combination of  $n$  persons is the same:  $\frac{1}{\binom{N}{n}}$

## • Solution of the defect Golf cars problem

1. For a combination of 2 **D**efective and 2 **N**on-defective cars we have to choose (first) 2 out of 5 defect Golfs and then 2 out of 15 non-defective Golfs. # of these combinations is  $\binom{5}{2} \times \binom{15}{2}$  on a total  $\binom{20}{4}$ .

$$P(2\mathbf{D} \text{ and } 2\mathbf{N}) = \frac{\binom{5}{2} \times \binom{15}{2}}{\binom{20}{4}}$$

$$2. P(\text{no Defective Golfs}) = \frac{\binom{5}{2} \times \binom{15}{2}}{\binom{20}{4}} \approx 0.217$$



# Combinatorial Probability

Applying definition by Laplace:  $P(A) = \frac{N(A)}{N(S)}$

For  $k$  draws out of  $n$  (different) “things”, we distinguish:

|                 |            | Way of drawing                             |   |
|-----------------|------------|--|---|
|                 |            | Without replacement                        | With replacement                                    |
| Type of outcome | Ordered    | $\frac{n!}{(n-k)!}$<br><i>permutations</i> | $n^k$ permutations with repetition                  |
|                 | Un-ordered | $\binom{n}{k}$<br><i>combinations</i>      | <i>Combinations with repetition: non-symmetric!</i> |

# Generalizing the example: hypergeometric formula

Applicable for situation of **draws without replacement and unordered outcomes**, e.g. choose  $n$  out of  $N$  balls:

**$R$  red** and  $N - R$  **white**.

The diagram shows  
the outcome of  
 $k$  red and  $n - k$  white.

|             | <b>red</b>            | <b>white</b>              | <b>total</b>          |
|-------------|-----------------------|---------------------------|-----------------------|
| population: | <b><math>R</math></b> | <b><math>N - R</math></b> | <b><math>N</math></b> |
|             | ↓                     | ↓                         | ↓                     |
| sample      | <b><math>k</math></b> | <b><math>n - k</math></b> | <b><math>n</math></b> |

*Random variable*

$X$  = “the number of red balls  
in  $n$  draws”

$$P(X = k) = \frac{\binom{R}{k} \binom{N-R}{n-k}}{\binom{N}{n}},$$
$$k = 0, \dots, n$$

$X$  has a **hypergeometric distribution**.



# Instruments of Combinatorial Probability

- **Product rule:** the numbers of outcomes of partial experiments can be multiplied (if “independent”).
- Use in case of “arbitrary draws from populations” the so called **vase model** to visualize the problem.
- Are the draws **with** or **without replacement**?  
Can outcomes repeatedly occur?
- Is the order of the outcomes of interest for the problem?  
Use **Permutations** (orders, variations) or  
**Combinations** (unordered, subsets).
- Is **the probability of the complement** easier to compute?
- Avoid “**double counting**” of outcomes.

# Overview Basic Probability in Ch. 1+2

**Axioms of Kolmogorov: 1.  $P(A) \geq 0$**

**2.  $P(S) = 1$**

**3.  $P(\cup_i A_i) = \sum_i P(A_i)$ ,**

if the  $A_i$ 's are mutually exclusive

**Complement rule:  $P(\bar{A}) = 1 - P(A)$**

**Addition Rule:  $P(A \cup B) = P(A) + P(B) - P(A \cap B)$**

For **disjoint** events we have:  $P(A \cap B) = 0$

**Symmetric probability space (Laplace):  $P(A) = \frac{N(A)}{N(S)}$**

**number of permutations of  $n$  out of  $N$  is  $\frac{N!}{(N-n)!}$**

**number of combinations of  $n$  out of  $N$  is  $\binom{N}{n} = \frac{N!}{n!(N-n)!}$**

# Examples of draws without replacement

**How many matches are there in a competition of 6 teams?**

- A full competition (home and away games  $a-b$  and  $b-a$ )?

Solution:  $6 \cdot 5$  games:  $\frac{6!}{4!}$  permutations of 2 out of 6.

- A tournament (unordered pairs  $\{a, b\}$  of 2 teams  $a$  and  $b$ ).

Solution:  $\frac{6 \cdot 5}{2}$  games:  $\frac{6!}{4!2!} = \binom{6}{2}$  combinations of 2 out of 6.

**How many (different) compositions** are possible, if you have 10 persons to compose

- A board with the chair, secretary and treasurer?

Solution:  $10 \cdot 9 \cdot 8 = \frac{10!}{(10-3)!}$  **permutations of 3 out of 10**

- A **committee** of 3 persons?

$\frac{10 \cdot 9 \cdot 8}{3!} = \frac{10!}{3!7!} = \binom{10}{3}$  **combinations of 3 out of 10**