

**Slides**  
**Probability Theory**  
**Chapter 1**

**Where do we use Probability Theory for?**

**Ch1: Introduction to the probability concept**

# Organization of this part of the module

- **Combined tutorials and lectures (“colstructions”):**  
First questions about the home made exercises will be discussed, where after there is time to solve exercises  
Second hour: new theory illustrated with examples.  
At home: make a summary and solve exercises.
- **4 homework assignments: each HWA will count 5% in the end result, if beneficial for the student) .**  
HWA’s are **not mandatory**: submit your own solutions (no plain copying!) on one A4 and do not send e-mails  
Aim: pass the course by regularly working on it.
- **Blackboard-info:** slides, solutions, assignments, sample tests with solutions, study aids, etc.

# Goals of this course

- **Giving proper models of real life situations where “chance” plays a role:** the model enables us to compute desired probabilities and expected values.
- **Probability Theory:** if the probability model is fully specified we can, for example, compute the probability of certain outcomes of experiments.  
Application e.g. in performance analysis of computer systems.
- Probability Theory is also a preparation for **Statistics:** if the model is not fully known, we will try to make statements about the population on the basis of a (small) random sample, drawn from the (large) population. Concepts as Level of confidence or significance are based on probability statements.  
Applications: users tests and simulation of performance

# Model: sample space $S$ and probability $P$

- Example 1: one roll with a dice:

Outcomes are 1, 2, 3, 4, 5 or 6  $\rightarrow S = \{1, 2, \dots, 6\}$

Event  $A =$  “even number”  $= \{2, 4, 6\}$

$A$  occurs in 3 out of 6 outcomes:  $P(A) = \frac{3}{6}$

*Condition* for the correctness of this calculation:

The dice is “fair”: every outcome is **equally likely**.

- Example 2: We observe the times (in *min*) between the consecutively arriving customers: 24 interarrival times.

$$S = \{(x_1, \dots, x_{24}) \mid x_i \geq 0, i = 1, 2, \dots, 24\}$$

$A =$  “the totale interval of time is greater than 50 *min*.”

$$S = \{(x_1, \dots, x_{24}) \text{ in } S \mid \sum_{i=1}^{24} x_i \geq 50\}$$

# Concepts (1)

- **Stochastic experiment:** outcome depends on chance
- **Sample space**  $S = \{\text{all outcomes}\}$ : an outcome  $s \in S$
- **Event**  $A \subset S$ :  $A$  is a subset of  $S$

Special events:

The largest is  $S$  itself: the **certain** event and the smallest is  $\emptyset$ , the **impossible** event

*Note that in this course  $A \subset S$  means the same as  $A \subseteq S$*

(**math A**)

- Properties:  $A \cap (B \cup C) = (A \cap B) \cup (A \cap C)$   
 $A \cup (B \cap C) = (A \cup B) \cap (A \cup C)$   
 $A \cup B = A \cup (\bar{A} \cap B)$  and  $A = (A \cap B) \cup (A \cap \bar{B})$

De Morgan`s rules:

$$\overline{A \cup B} = \bar{A} \cap \bar{B} \quad \text{and} \quad \overline{A \cap B} = \bar{A} \cup \bar{B}$$

# Concepts (2)

- The **P**robability of an event  $A$ :  $P(A)$
- Evident properties that should be true:  
 $0 \leq P(A) \leq 1$  ,  $P(\emptyset) = 0$  and  $P(S) = 1$
- **the frequency-interpretation** of e. g.  $P(A) = 0.80$ :  
**“If the stochastic experiment is repeated many times,  $A$  will occur in about in 80% of the repetitions”.**
- This notion reflects an “experimentally determined probability”: the **relative frequency of an event  $A$**  is the proportion of occurrences of  $A$  in  $n$  repetitions of the experiment:  
$$f_n(A) \approx \frac{n(A)}{n}$$
- **Experimental law of large numbers**  
for large  $n$  we have  $f_n(A) \approx P(A)$

# Basic rules of probability (1)

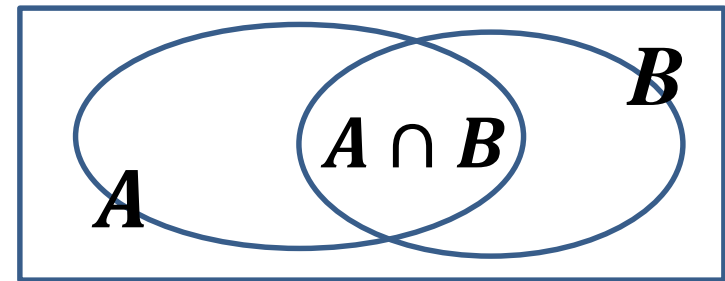
- The **complement** of  $A$ :  
*say “not- $A$ ”*

$$\bar{A} = \{s \in S \mid s \notin A\}$$



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

- The **intersection**  $A \cap B = AB$ :  
set of outcomes in  $A$  and  $B$ .  
*say “ $A$  and  $B$ ”*



- The **union** of  $A$  and  $B$ :  
*say “ $A$  or  $B$  (or both)”*

$$A \cup B$$

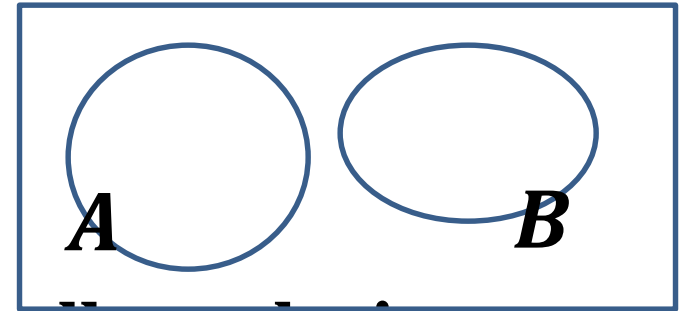
- **General addition rule**:

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

# Basic rules of probability (2)

- **Mutually exclusive or disjoint** events.

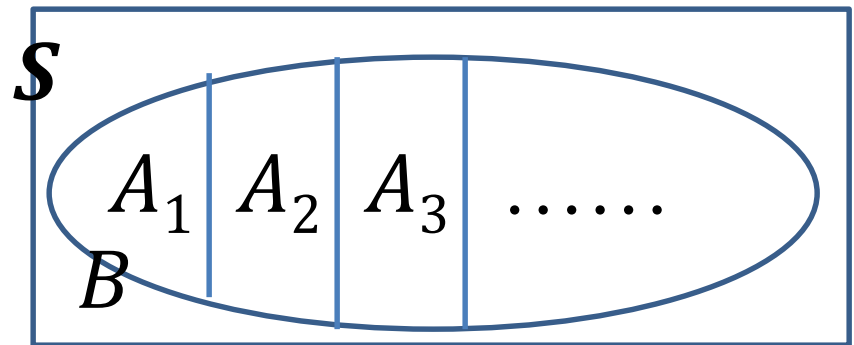
$$A \cap B = \emptyset, \text{ so } P(A \cap B) = 0$$



- (Special) **addition rule for mutually exclusive events:**
- A series of events  $A_1, A_2, \dots$  are **mutually exclusive** if  $A_i \cap A_j = \emptyset$ , for each pair  $(i, j)$
- A **partition** of  $B$ :

$$B = \bigcup_i A_i$$

such that  $A_1, A_2, \dots$   
are mutually exclusive.



Computing probabilities if all **outcomes are equally likely**: **count** the favourable and the total number.

- This principle can be applied often when random samples are conducted: an arbitrary choice from a finite population: every outcome of the population is equally likely.
- **Probability definition of Laplace**: compute the probability of  $A$  by counting the proportion of favourable outcomes.

$$P(A) = \frac{N(A)}{N(S)} = \frac{\text{Number of favourable outcomes of } A}{\text{Total number of outcomes in } S}$$

- A pair  $(S, P)$  of a finite sample space  $S$  and its Laplace probability  $P$  is called a **symmetric probability space**.

**What conditions should we impose on  $P$  for any (arbitrary) probability space  $(S, P)$ , e.g. if  $N(S)$  is finite?**

# Foundation Probability Theory: Kolmogorov's axioms

A function  $P$ , that assigns a real number  $P(A)$  to each event  $A$

**Probability (measure)** if:

1.  $P(A) \geq 0$
2.  $P(S) = 1$
3. If  $A_1, \dots, A_n$  or  $A_1, A_2, \dots$  are mutually exclusive, then

$$P\left(\bigcup_i A_i\right) = \sum_i P(A_i)$$

All other desirable properties can be derived from the axioms:

- $P(\emptyset) = 0$  and  $0 \leq P(A) \leq 1$
- $P(\overline{A}) = 1 - P(A)$
- $P(A \cup B) = P(A) + P(B) - P(A \cap B)$
- If  $A \subset B$ , then  $P(A) \leq P(B)$

# Examples (1)

**Example:** roll a dice twice:

- $S = \{(i, j) | i, j = 1, 2, \dots, 6\}$

- $A = \text{"total} = 4\text{"}$   
 $= \{(1, 3), (2, 2), (3, 1)\}$

$$P(A) = \frac{N(A)}{N(S)} = \frac{3}{36}$$

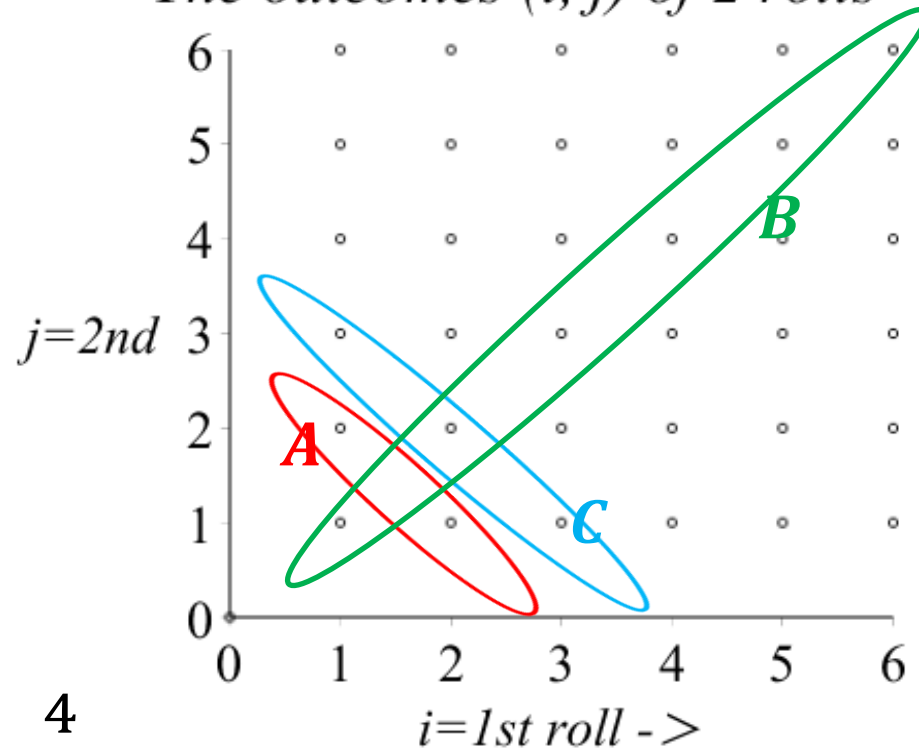
- $B = \text{"1}^{st} = 2^{nd} \text{ roll"}$

$$P(B) = \frac{6}{36}$$

- $C = \text{"total} = 5\text{": } P(C) = \frac{4}{36}$

- $P(\bar{A}) = \frac{33}{36} = 1 - P(A)$

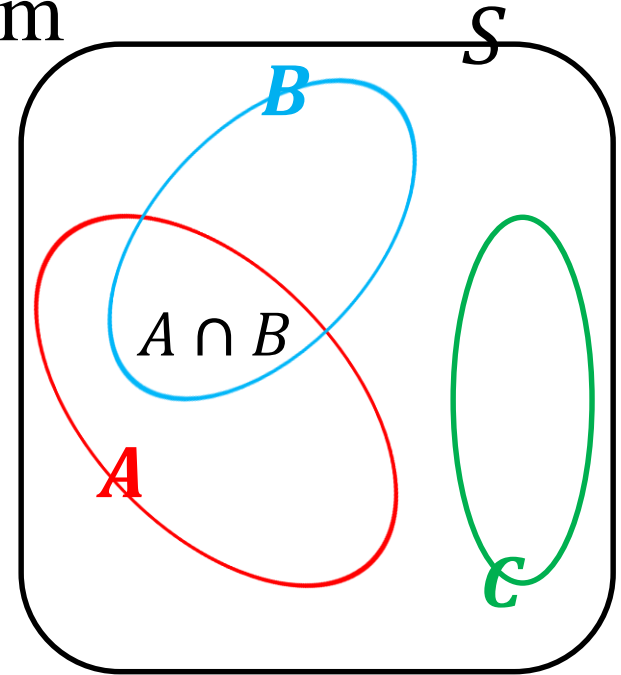
*The outcomes (i, j) of 2 rolls*



# Examples (2)

**Example** (continues): Venn-diagram

- $P(A \cap B) = P((2,2)) = \frac{1}{36}$
- $P(A \cup B) = P(A) + P(B) - P(AB)$   
 $\frac{8}{36} = \frac{3}{36} + \frac{6}{36} - \frac{1}{36}$
- $A$  and  $C$  are mutually exclusive,  
 $B$  and  $C$  as well,  
but  $A$  and  $B$  are not:  $P(AB) \neq 0$
- Since  $A = AB \cup A\bar{B}$ , we have:  $P(A) = P(AB) + P(A\bar{B})$ ,  
so  $P(A\bar{B}) = P(A) - P(AB) = \frac{3}{36} - \frac{1}{36} = \frac{2}{36}$   
(correct, since  $A\bar{B} = \{(1,3), (3,1)\}$ )



# Examples (3)

**Example:** The probability of a prize in a lottery is (about) 10% at each draw

- What is the probability of the first win at the tenth draw?
- What is the probability that the first win after the 20th draw?

Solutions: each outcome is the number of draws, needed for the first win:  $S = \{1, 2, 3, \dots\}$

a.  $P(10) = 0.9 \cdot \dots \cdot 0.9 \cdot 0.1 = 0.9^9 \cdot 0.1 \approx 3.9\%$

Reasoning: at each draw you will have a success probability of 0.1 and a 0.9 probability of no prize. “10” will occur if the in the first 9 draws no prize is won and at the tenth draw a prize is won.

b.  $A = \{21, 22, \dots\}$ , so  $P(A) = 0.9^{20} \approx 12.2\%$

$A$  occurs if in all first 20 draws you win no prize.