

# INF5820/INF9820

## LANGUAGE TECHNOLOGICAL APPLICATIONS

Jan Tore Lønning, 2014 fall

# Probability theory

# Exercises

- Khan academy
- [http://www.statlect.com/probability\\_exercises.htm](http://www.statlect.com/probability_exercises.htm)
  - ▣ Probability
  - ▣ Conditional probability
  - ▣ Bayes' rule
  - ▣ Independent events
- S1, videregående skole:
  - ▣ <http://ndla.no/nb/node/57934>

# Basic concepts

- **Random experiment** (or trial) (no: **forsøk**)
  - ▣ Observing a chance event
- **Outcomes** (**utfallene**)
  - ▣ The possible results of the experiment
- **Sample space** (**utfallsrommet**)
  - ▣ The set of all possible outcomes

# Examples

	Experiment	Sample space, $\Omega$
1	Flipping a coin	{H, T}
2	Rolling a dice	{1,2,3,4,5,6}
3	Flipping a coin three times	{HHH, HHT, HTH, HTT, THH, THT, TTH, TTT}
4	Will it rain tomorrow?	{Yes, No}

# Examples

	Experiment	Sample space, $\Omega$
1	Flipping a coin	{H, T}
2	Rolling a dice	{1,2,3,4,5,6}
3	Flipping a coin three times	{HHH, HHT, HTH, HTT, THH, THT, TTH, TTT}
4	Will it rain tomorrow?	{Yes, No}
5	The first word you hear tomorrow	{u   u is a word}
6	Throwing a dice until you get 6	{1,2,3,4, ...}
7	The maximum temperature at Blindern for a day	{t   t is a real}

Discrete		Continuous
Finite	Infinite	Infinite
1-4	6	7

# Event

- An **event** (**begivenhet**) is a set of elementary outcomes

	Experiment	Event	Formally
2	Rolling a dice	Getting 5 or 6	$\{5,6\}$
3	Flipping a coin three times	Getting at least two heads	$\{HHH, HHT, HTH, THH\}$

# Event

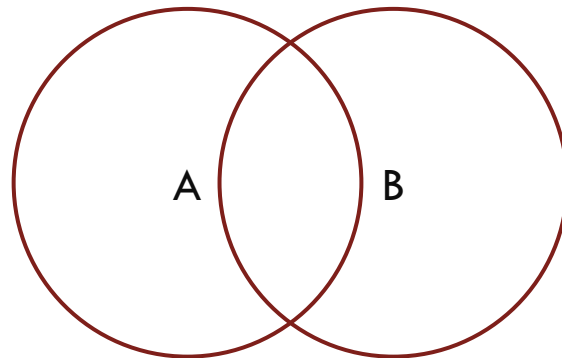
- An **event** (**begivenhet**) is a set of elementary outcomes

	Experiment	Event	Formally
2	Rolling a dice	Getting 5 or 6	$\{5,6\}$
3	Flipping a coin three times	Getting at least two heads	$\{HHH, HHT, HTH, THH\}$
5	The first word you hear tomorrow	You hear a noun	$\{u \mid u \text{ is a noun}\}$
6	Throwing a dice until you get 6	An odd number of throws	$\{1,3,5, \dots\}$
7	The maximum temperature at Blindern	Between 20 and 22	$\{t \mid 20 \leq t \leq 22\}$



# Operations on events

- **Union:**  $A \cup B$
- **Intersection (schnitt):**  $A \cap B$
- **Complement**



- Venn diagram
- <http://www.google.com/doodles/john-venns-180th-birthday>

# Probability measure, sannsynlighetsmål

□ A probability measure  $P$  is a function from events to the interval  $[0,1]$  such that:

1.  $P(\Omega) = 1$

2.  $P(A) \geq 0$

3. If  $A \cap B = \emptyset$  then  $P(A \cup B) = P(A) + P(B)$

□ And if  $A_1, A_2, A_3, \dots$  are disjoint, then 
$$P\left(\bigcup_{j=1}^{\infty} A_j\right) = \sum_{j=1}^{\infty} P(A_j)$$

# Examples

- An **event** (**begivenhet**) is a set of elementary outcomes

	Experiment	Event	Probability
2	Rolling a dice	Getting 5 or 6	$P(\{5,6\})=2/6=1/3$
3	Flipping a coin three times	Getting at least two heads	$P(\{HHH, HHT, HTH, THH\}) = 4/8$

# Examples

- An **event** (**begivenhet**) is a set of elementary outcomes

	Experiment	Event	Probability
2	Rolling a dice	Getting 5 or 6	$P(\{5,6\})=2/6=1/3$
3	Flipping a coin three times	Getting at least two heads	$P(\{HHH, HHT, HTH, THH\}) = 4/8$
5	The first word you hear tomorrow	You hear a noun	$P(\{u \mid u \text{ is a noun}\})= 0.43?$
6	Throwing a dice until you get 6	An odd number of throws	$P(\{1,3,5, \dots\})=?$
7	The maximum temperature at Blindern	Between 20 and 22	$P(\{t \mid 20 \leq t \leq 22\})=0.1$

# Some observations

- $P(\emptyset) = 0$
- $P(A \cup B) = P(A) + P(B) - P(A \cap B)$
- If  $\Omega$  is discrete, then  $P(A) = \sum_{a \in A} P(\{a\})$

# Examples

6-sided fair dice

- Two throws: the probability of 2 sixes?
- The probability of getting a six in two throws?
- 5 dices: the probability of getting 5 equal dices?
- 5 dices: the probability of getting 1-2-3-4-5?
- 5 dices: the probability of getting no 6-s?

# Counting methods

Given all outcomes equally likely

- $P(A) = \frac{\text{number of ways } A \text{ can occur}}{\text{total number of outcomes}}$
- Multiplication principle:
  - if one experiment has  $m$  possible outcomes and another has  $n$  possible outcomes, then the two have  $mn$  possible outcomes

# Sampling

## Ordered sequences:

- Choose  $k$  items from a population of  $n$  items with replacement:  $n^k$
- Without replacement:  $n(n-1)(n-2)\dots(n-k+1) = \frac{n!}{(n-k)!}$

## Unordered sequences

- Without replac.:  $\frac{1}{k!} \left( \frac{n!}{(n-k)!} \right) = \left( \frac{n!}{k!(n-k)!} \right) = \binom{n}{k}$ 
  - ▣ = the number of ordered sequences/  
The number of ordered sequences containing the same  $k$  elements



# Conditional probability

□  $P(A \cap B)$

▣ Both A and B happens

□ **Conditional probability** (betinget sannsynlighet)

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

▣ The probability of A happens if B happens

□ **Multiplication rule**  $P(A \cap B) = P(A | B)P(B) = P(B | A)P(A)$

□ A and B are **independent** iff  $P(A \cap B) = P(A)P(B)$

# Example

## □ Throwing two dice

▣ A: the sum of the two is 7

▣ B: the first dice is 1

■  $P(A) = 6/36 = 1/6$

■  $P(B) = 1/6$

■  $P(A \cap B) = P(\{(1,6)\}) = 1/36 = P(A)P(B)$

■ Independence

▣ C: the sum of the two is 5

■  $P(C) = 4/36 = 1/9$

■  $P(C \cap B) = P(\{(1,4)\}) = 1/36$

■  $P(C)P(B) = 1/9 * 1/6 = 1/54$

■ Not independent

# Bayes theorem

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

- Jargon:
  - ▣  $P(A)$  – prior probability
  - ▣  $P(A | B)$  – posterior probability

# Example

- Disease: 1 out of 1000 are infected
- Test:
  - ▣ Detects 99% of the infected
  - ▣ 2% of the non-infected get a positive test
- Given a positive test: what is the chance you are ill?

# What are probabilities?

- Example throwing a dice:
  1. Classical view:
    - ▣ The six outcomes are equally likely
  2. Frequentist:
    - ▣ If you throw the dice many, many, many times, the number of 6s approach  $16.6666\dots\%$
  3. Bayesian: subjective beliefs