



ŠKODA AUTO University

# Operational Research I

Lectures

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# Literature



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## Basic

- FÁBRY, J. Operational Research I for full-time and distance form of studies. Mladá Boleslav: ŠAU, 2022. 150 pp. ISBN 978-80-7654-048-4.
- EISELT, H. and SANDBLOM, C. *Operations Research.: A Model-Based Approach*. 1st edition, Heidelberg: Springer, 2010. 446 pp. ISBN 978-3-642-10325-4.
- Fábry, J. *Management Science*. University of Economics Prague, 2003. ISBN 80-245-0586–X (Available at <https://janfabry.cz/Management-Science.pdf>).

## Recommended

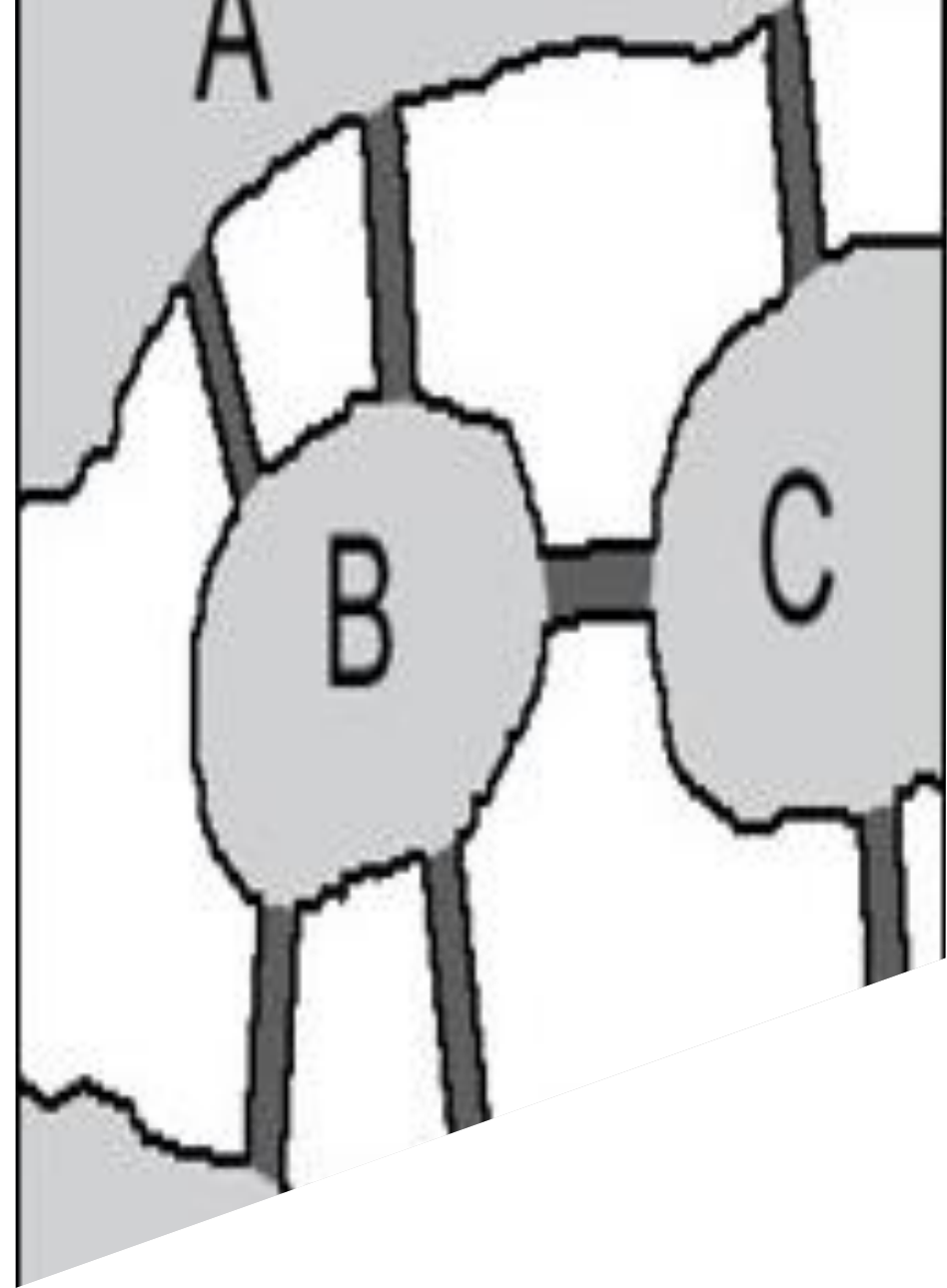
- HILLIER, F. S. and LIEBERMAN, G. J. *Introduction to Operations Research*. 11th edition, McGraw-Hill, 2021. 964 pp. ISBN 9781260575873
- BOUCHERIE, R. J., BRAAKSMA, A. and TIJMS, H. *Operations Research: Introduction to Models and Methods*. World Scientific, 2022. 499 pp. ISBN 9789811239342
- RARDIN, R. L. *Optimization in Operations Research*. 2nd edition, Pearson, 2018. 1144 pp. ISBN 978-93-530-6636-9



# Contents

- **Introduction to Operational Research**
  - Definition and history
  - Decision-Making
  - Modeling Process
  - Models
- **Linear Programming**
  - Introduction
  - Production Planning Problem
  - Blending Problem
  - Cutting Stock Problem
  - Portfolio Selection Problem
  - Transportation Problem
  - Container Transportation Problem
  - Assignment Problem
  - Covering Problem
  - Traveling Salesman Problem
- **Graph Modeling**
  - Introduction
  - Minimal Spanning Tree
  - Other optimization problems
- **Project Management**
  - Introduction
  - Critical Path Method
  - Program Evaluation and Review Technique
- **Inventory Models**
  - Introduction
  - Economic Order Quantity Model
  - Economic Production Lot Size Model
  - Single-Period Decision Model
- **Waiting Line Models**
  - Introduction
  - Standard Single-Server Exponential Model
  - Standard Multi-Server Exponential Model

# 1 Introduction to Operational Research





# Introduction to Operational Research

## Alternative Names and Related Fields

- Operational / Operations Research (OR)
- Management Science (MS)
- Operations Analysis
- Quantitative Analysis
- Quantitative Methods
- Systems Analysis
- Decision Analysis
- Decision Science
- Computer Science



# Introduction to Operational Research

## Definition

1. OR is the application of **scientific methods, techniques and tools** to problems involving the operations of systems so as to provide those in control of the operations with **optimum solutions** to the problems.
2. MS/OR is the application of the **scientific method** to the study of the **operations of large, complex organizations or activities**.
3. MS/OR is the application of the **scientific method** to the analysis and solution of **managerial decision problems**.

### ▪ **Summary**

- Application of **SCIENTIFIC METHOD**.
- Study of **LARGE & COMPLEX SYSTEMS**.
- Analysis of **MANAGERIAL PROBLEMS**.
- Finding **OPTIMAL SOLUTION**.
- Use of **MATHEMATICAL MODELS**.
- Use of **COMPUTERS & SPECIAL SOFTWARE**.



# Introduction to Operational Research

## Software

- MPL for Windows
- AMPL
- Lingo (LINDO)
- XPRESS (FICO)
- CPLEX (IBM ILOG)
- Gurobi
- AIMMS
- NEOS
- MS Excel (FRONTLINE SOLVERS)
- PLANT SIMULATION
- SIMPROCESS
- SIMUL 8
- Matlab

# Introduction to Operational Research

## Decision-making

- Two or more alternatives.
- Conclusion = Decision.
- Systematic process.

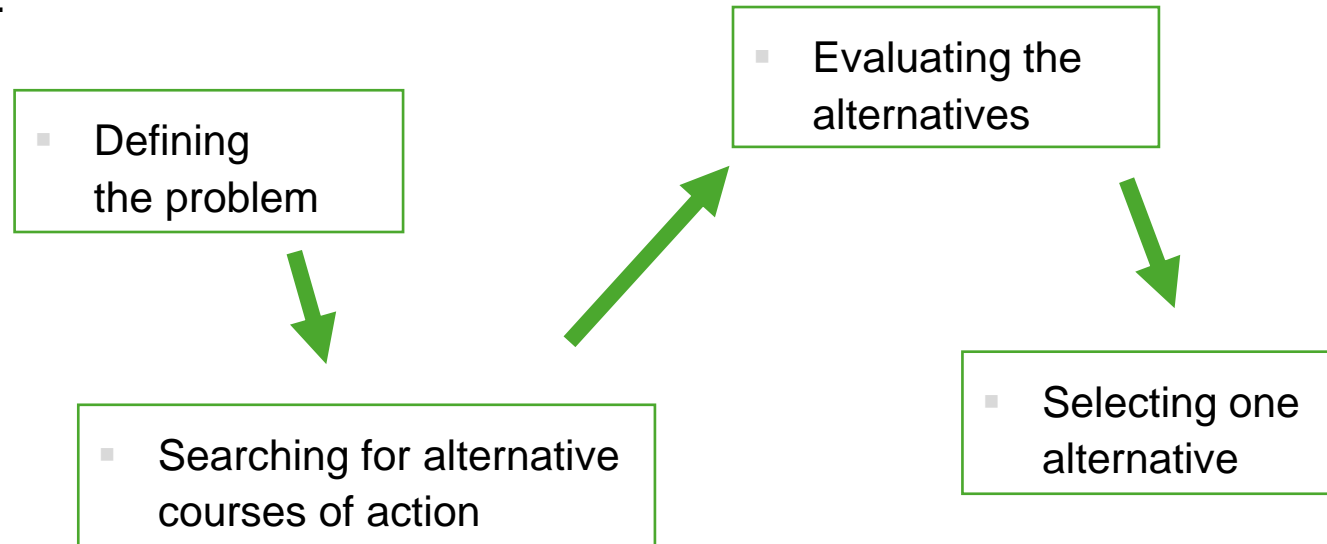


Fig. 1 – Scheme of Decision-making Process



# Introduction to Operational Research

## Modeling Process (Analytical Approach)

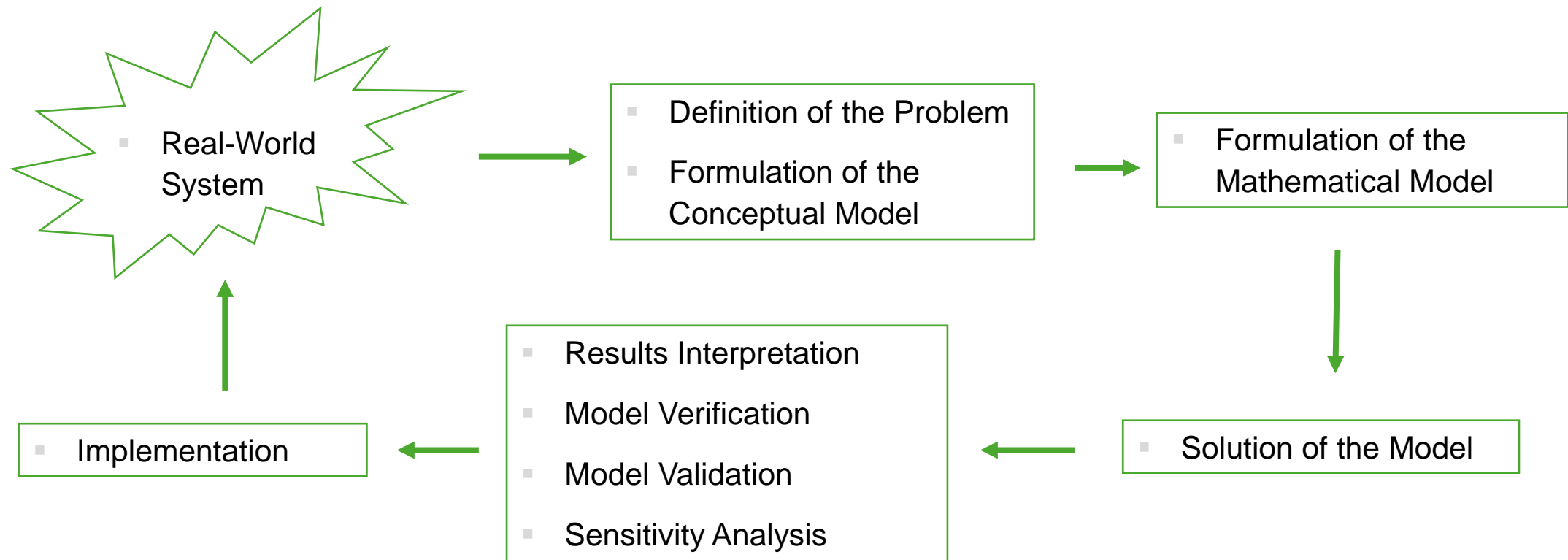


Fig. 2 – Scheme of Modeling Process

# Introduction to Operational Research



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## Modeling

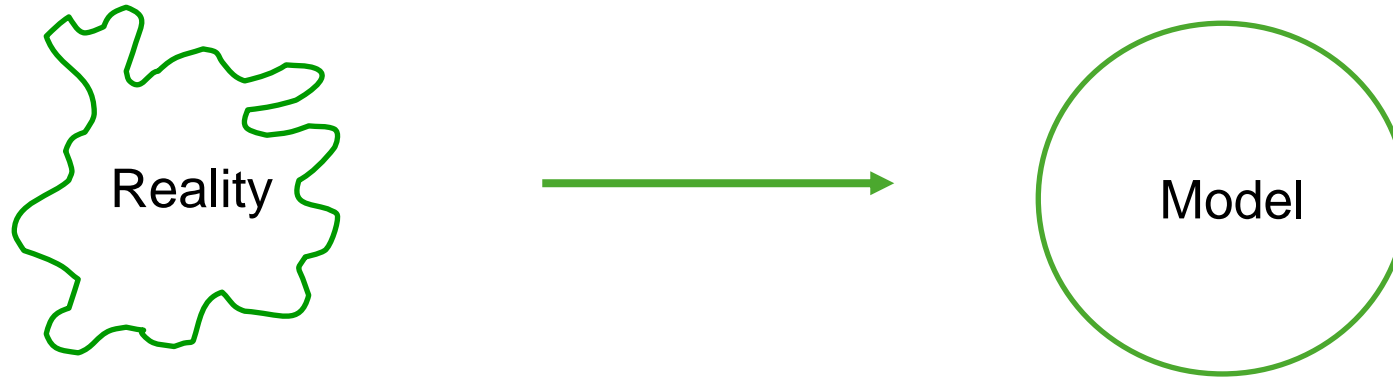


Fig. 3 – Simplification of Reality

- Finding a proper balance between the level of **simplification of the model** and the good **representation of reality**.

# Introduction to Operational Research



## Models

- **Deterministic** – all parameters are known with certainty.
- **Probabilistic (stochastic)** – some parameters are values of random variables.
- **Static** – all data is known in advance (before solution process).
- **Dynamic** – data can be changed after solution is obtained.

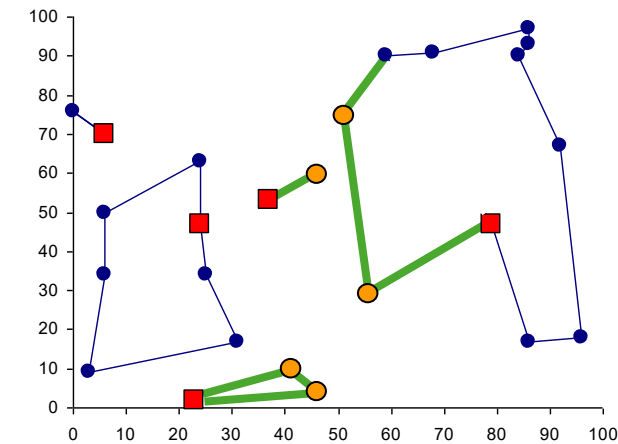
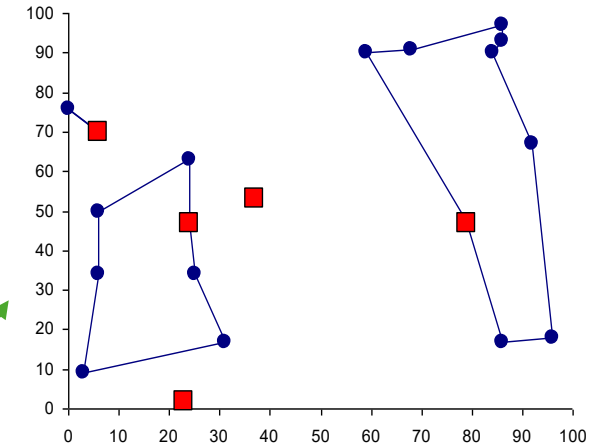
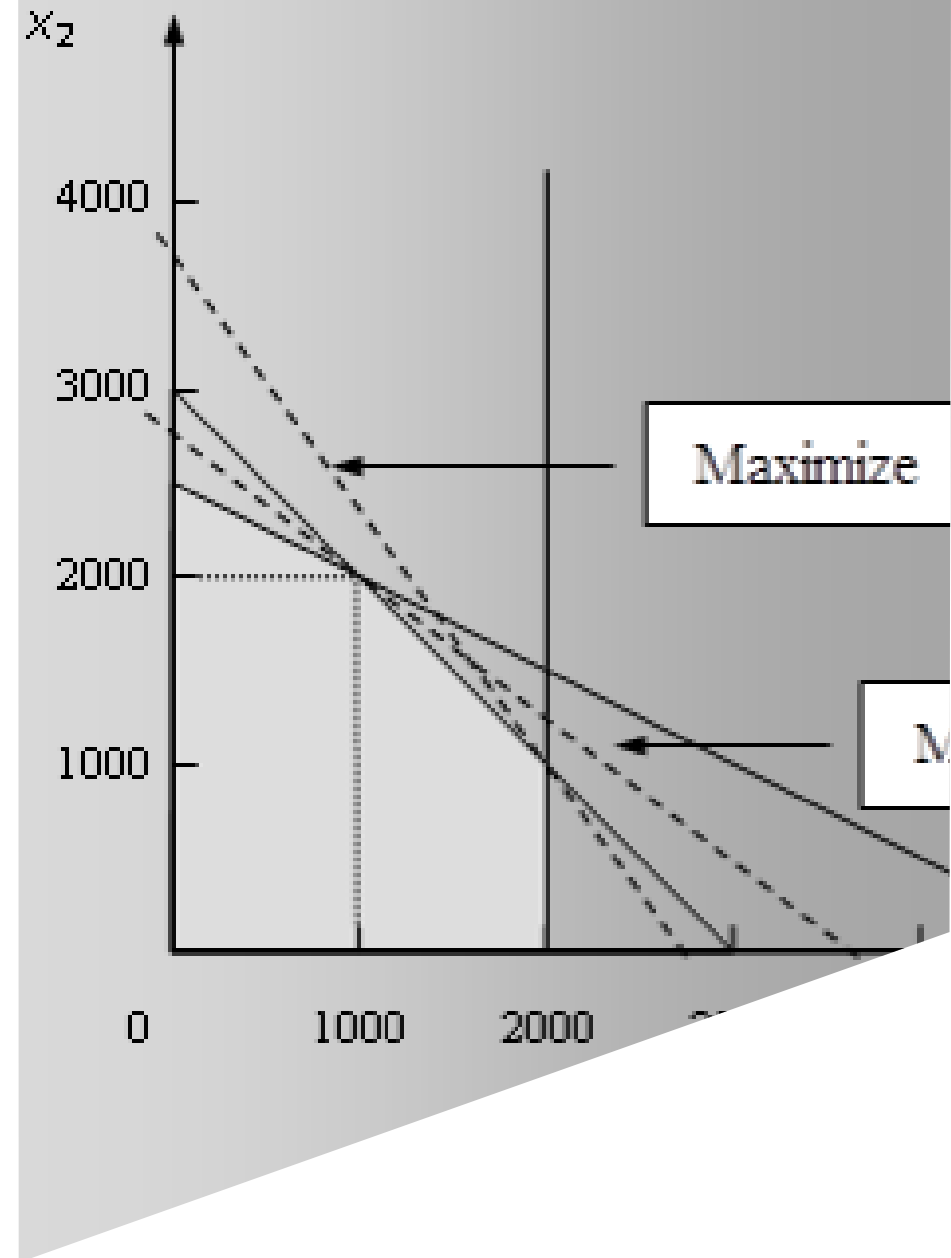


Fig. 4 – Static and Dynamic Model

2

# Linear Programming





# Linear Programming

## Introduction

- **Conceptual model**
  - Processes.
  - Restrictions.
  - Objective.
- **Mathematical model**
  - **Decision Variables** – continuous, integral, binary.
  - **Constraints** – equations, inequalities.
  - **Objective function** – max, min.
- **Solution**
  - **Feasible** – satisfies all constraints.
  - **Optimal** – best feasible solution in terms of the objective.
  - **Infeasible** – does not satisfy any constraint.



# Linear Programming

## Introduction

- **Solution**
  - Results **Interpretation** – explanation of values to the others (e.g. client).
  - Model **Verification** – comparison of the mathematical model with the conceptual model.
  - Model **Validation** – comparison of results with the real expectations.
  - **Sensitivity Analysis** – examination of the impact of changes in inputs on outputs.
- **Implementation**
  - **Use** of results in **real** system.
- **Special situations of LP problems**
  - **Unique** optimal solution.
  - **Multiple** optimal solution.
  - **No optimal** solution.
  - **No feasible** solution.



# Linear Programming

## Production Planning Problem

### ▪ Example

- The company manufactures 2 types of wooden toys: **trucks** and **trains**.
- The price of a piece of **truck** is 820 CZK, of a piece of **train** 1150 CZK. The **wood cost for the truck** is 100 CZK, whereas for the **train** 180 CZK.
- The truck requires 1 hour of **carpentry labor** and 1 hour of **finishing labor** (assembling and painting). The train requires 2 hours of **carpentry labor** and 1 hour of **finishing labor**.
- Worth of **carpentry labor** is 150 CZK per hour, worth of **finishing labor** is 120 CZK per hour.
- Each month, the company has 5000 **available hours of carpentry labor** and 3000 **hours of finishing labor**.
- **Demand for trains** is unlimited, but at most 2000 **trucks** are, at an average, bought each month.
- The Pinocchio's management wants to **maximize monthly profit** (total revenue - total cost).



# Linear Programming

## Production Planning Problem

- Decision variables

$x_1$  = number of trucks produced each month,  
 $x_2$  = number of trains produced each month.

- Mathematical model

Maximize  $z = 450x_1 + 550x_2$ ,  
subject to

$x_1 + 2x_2 \leq 5000$ , (carpentry labor)  
 $x_1 + x_2 \leq 3000$ , (finishing labor)  
 $x_1 \leq 2000$ , (demand)  
 $x_1, x_2 \geq 0$ , integers.

Slack variables



Equivalent set of equations

$x_1 + 2x_2 + x_3 = 5000$   
 $x_1 + x_2 + x_4 = 3000$   
 $x_1 + x_5 = 2000$

$\leq$   
 $\geq$

+ Slack variable  
- Surplus variable





# Linear Programming

## Production Planning Problem

- **Optimal solution**

- Decision variables

$$x_1 = 1000$$

$$x_2 = 2000$$

- Objective value

$$z_0 = 1550000$$

- Slack/surplus variables

$$x_3 = 0$$

$$x_4 = 0$$

$$x_5 = 1000$$



# Linear Programming

## Blending Problem

- **Input**
  - chemicals,
  - metal alloys,
  - crude oil,
  - livestock feeds,
  - foodstuffs.
- **Output requirements and/or objective**
  - quality,
  - quantity,
  - cost.
- **Decision variables**
  - amount of ingredients used in the final blend.



# Linear Programming

## Blending Problem

- **Example**

- Design the **optimal composition of nutritive mix** that will contain at least 100 units of **proteins**, at least 300 units of **starch** and will **weight** at least 200 kg with **minimum purchasing costs**.
- In following table, there are given contents of proteins and starch in 1kg of each nutritive feed and prices for 1 kg of feed.

Tab. 1 – Contents of proteins and starch in feeds, price of feeds

	Feed F <sub>1</sub>	Feed F <sub>2</sub>	Feed F <sub>3</sub>	Feed F <sub>4</sub>
Proteins (units)	0	3	1	2
Starch (units)	1	2	3	0
Price (CZK)	20	80	60	30



# Linear Programming

## Blending Problem

- Decision variables

$x_i =$  amount of feed  $F_i$  in the final blend ( $i = 1, 2, 3, 4$ )

- Mathematical model

Minimize  $z = 20x_1 + 80x_2 + 60x_3 + 30x_4,$

subject to

$$\begin{aligned} 3x_2 + x_3 + 2x_4 &\geq 100, && \text{(proteins)} \\ x_1 + 2x_2 + 3x_3 &\geq 300, && \text{(starch)} \\ x_1 + x_2 + x_3 + x_4 &\geq 200, && \text{(weight)} \\ x_i &\geq 0, i = 1, 2, 3, 4. \end{aligned}$$



# Linear Programming

## Blending Problem

- **Optimal solution**

- Decision variables

$$x_1 = 120$$

$$x_2 = 0$$

$$x_3 = 60$$

$$x_4 = 20$$

- Objective value

$$z_0 = 6600$$

- Slack/surplus variables

$$x_5 = 0$$

$$x_6 = 0$$

$$x_7 = 0$$



# Linear Programming

## Cutting Stock Problem

- **Input – raw product (dimension)**
  - pipes, tubes (1D).
  - roles of paper or textile (1D or 2D),
  - wooden sticks or laths (1D),
  - wooden boards (1D or 2D),
  - steel plates (2D),
  - boxes (3D) – 3D rectangular packing problem.
- **Output – final or semi-finished products**
- **Objective**
  - minimization of **total loss**,
  - minimization of a **number of raw** products being cut,
  - maximization of **number of final**/assembled products,
  - maximization of **profit** ensuing from sold final/assembled products.

# Linear Programming

## Cutting Stock Problem

- **Table of all cutting patterns**
  - It contains **all possibilities** of **cutting** raw products.
  - Each **cutting pattern** corresponds to the **variable** giving a number of the raw products being cut according to this pattern.

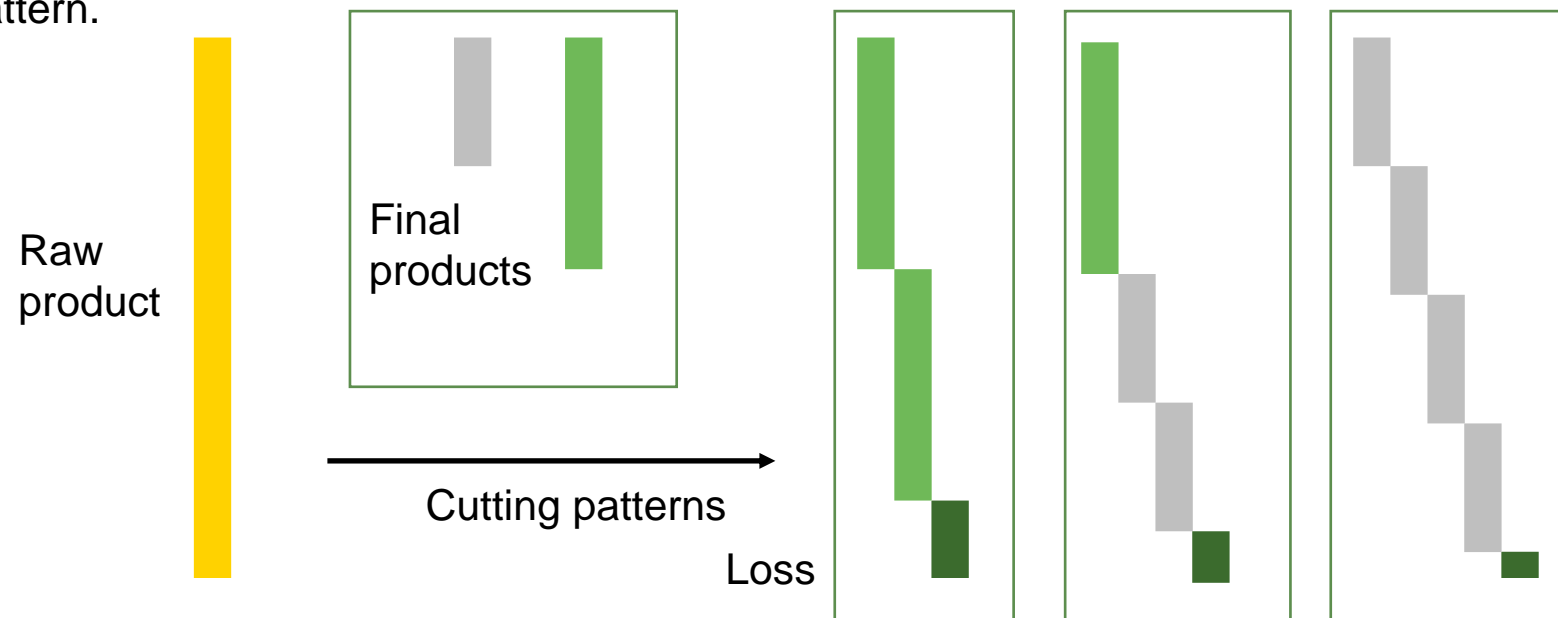


Fig. 5 – Cutting Patterns



# Linear Programming

## Cutting Stock Problem

- **Example**

- The company produces **bird feeders** and **bird houses**. The producer decided to prepare a special collection for an exhibition (with possible sales) that should be held in 20 days.
- The **price** of the bird feeder is set to 260 CZK, the **price** of the bird house is 570 CZK.
- **Material** and **time requirements** for assembling both the products can be found in Table 2.

Tab. 2 – Material and time requirements

	Feeder	House
Boards 30 cm long	1	2
Boards 25 cm long	1	4
Screws	8	16
Time (in min)	30	60





# Linear Programming

## Cutting Stock Problem

### Example

- There is **available stock of raw boards**: 500 boards of length 1.1 m and 150 boards of length 1.4 m. These boards must be cut into final boards of length 30 cm and 25 cm.
- Available **stock of screws** is 3000 pieces.
- The producer can work 8 **hours per day** and intends to **maximize** the **total revenue** ensuring from the sales (all production is supposed to be sold).

Tab. 3 – Table of cutting patterns

Pattern	1.1 m board				1.4 m board				
	1	2	3	4	5	6	7	8	9
30 cm board	3	2	1	0	4	3	2	1	0
25 cm board	0	2	3	4	0	2	3	4	5
Loss (cm)	20	0	5	10	20	0	5	10	15



# Linear Programming

## Cutting Stock Problem

- **Decision variables**

$x_i$  = number of 1.1 m boards being cut according to  $i$  – th pattern ( $i = 1, \dots, 4$ )

$x_i$  = number of 1.4 m boards being cut according to  $i$  – th pattern ( $i = 5, \dots, 9$ )

$x_{10}$  = number of assembled bird feeders

$x_{11}$  = number of assembled bird houses

- **Mathematical model**

Maximize  $z = 260x_{10} + 570x_{11}$

subject to

$$x_1 + x_2 + x_3 + x_4 \leq 500 \quad (1.1 \text{ m boards})$$

$$x_5 + x_6 + x_7 + x_8 + x_9 \leq 150 \quad (1.4 \text{ m boards})$$



# Linear Programming

## Cutting Stock Problem

- **Mathematical model**

$$8x_{10} + 16x_{11} \leq 3000 \quad (\text{screws})$$

$$0.5x_{10} + x_{11} \leq 160 \quad (\text{time})$$

$$3x_1 + 2x_2 + x_3 + 4x_5 + 3x_6 + 2x_7 + x_8 \geq x_{10} + 2x_{11} \quad (30 \text{ cm boards})$$

$$2x_2 + 3x_3 + 4x_4 + 2x_6 + 3x_7 + 4x_8 + 5x_9 \geq x_{10} + 4x_{11} \quad (25 \text{ cm boards})$$

$$x_1, x_2, \dots, x_{11} \geq 0$$

$x_1, x_2, \dots, x_{11}$  are integers



# Linear Programming

## Cutting Stock Problem

- **Optimal solution**

- Decision variables

$$x_1 = x_3 = x_4 = x_6 = x_7 = x_8 = x_{10} = 0$$

$$x_2 = 65$$

$$x_5 = 48$$

$$x_9 = 102$$

$$x_{11} = 160$$



- These values can differ because of **multiple optimal solution** exists

- Objective value

$$z_0 = 91200$$

- Slack/surplus variables

$$y_1 = 435 \quad y_4 = 0$$

$$y_2 = 0 \quad y_5 = 2$$

$$y_3 = 440 \quad y_6 = 0$$



# Linear Programming

## Portfolio Selection Problem

- **Definition of the problem**
  - Financial planning problem.
  - Allocation of available amount of money in several investment alternatives.
  - Financial risk.
  - The goal is to gain a certain amount of money (return).
  - The objective is to maximize the total return and minimize the total risk.
- **Alternative investments**
  - Shares, bonds etc.
- **Decision-makers**
  - Mutual fund, bank, pension fund, insurance company, individual investor.



# Linear Programming

## Portfolio Selection Problem

### Example

- The management of an investment company is considering **investing money in the shares of 4 beverage companies**.
- In order to avoid losses from the risk associated with investing in the private sector, the company's management has decided to invest part of its money in government bonds.
- The **total amount invested** is 2 million CZK. Long-term financial market monitoring provides the percentages of annual expected return and risk indices for the stocks considered, shown in Table 4.

Tab. 4 – Stock evaluation

Stock	Return rate	Risk index
Bohemian Beer share	12 %	0.07
Moravian Wine share	9 %	0.09
Moravian Brandy share	15 %	0.05
Bohemian Milk share	7 %	0.03
Government bond	6 %	0.01



# Linear Programming

## Portfolio Selection Problem

- **Example**

- The following rules were decided at the management meeting:

- 1) No more than 200000 CZK might be invested in Bohemian Milk shares.

- 2) Government bonds should cover at least 20 % of all investments.

- 3) Because of diversification of portfolio, neither alcohol-drink company should receive more than 800000 CZK.

- 4) Risk index of the final portfolio should be maximally 0.05.

- Satisfying all the restrictions, the management intends to maximize the expected annual return of the portfolio.



# Linear Programming

## Portfolio Selection Problem

- **Decision variables**

$x_i$  = the amount of money invested in  $i$  – th stock title ( $i = 1, 2, \dots, 5$ )

- **Mathematical model**

- Maximize  $z = 0.12x_1 + 0.09x_2 + 0.15x_3 + 0.07x_4 + 0.06x_5$

Subject to

$$x_1 + x_2 + x_3 + x_4 + x_5 = 2\,000, \quad (2 \text{ millions CZK})$$

$$x_4 \leq 200, \quad (\text{no more than 200000 CZK in Bohemia Milk shares})$$

$$x_5 \geq 400, \quad (\text{at least 20 \% of all investments in government bonds})$$

$$x_1 \leq 800; x_2 \leq 800; x_3 \leq 800, \quad (\text{no more than 800000 CZK in alcohol-drink companies})$$

$$\frac{0.07x_1 + 0.09x_2 + 0.05x_3 + 0.03x_4 + 0.01x_5}{2\,000} \leq 0.05, \quad (\text{overall portfolio risk index is below 0.05})$$

$$0.07x_1 + 0.09x_2 + 0.05x_3 + 0.03x_4 + 0.01x_5 \leq 100,$$

$$x_i \geq 0, \quad i = 1, 2, \dots, 5. \quad (\text{nonnegativity constraints})$$





# Linear Programming

## Portfolio Selection Problem

- **Optimal solution**
  - Decision variables

$$x_1 = 800,$$

$$x_2 = 0,$$

$$x_3 = 800,$$

$$x_4 = 0,$$

$$x_5 = 400.$$

- Objective value

$$z_0 = 240.$$



# Linear Programming

## Transportation Problem

- **Definition of the problem**
  - Transport of **homogeneous product**.
  - Set of **sources** with limited **supply**.
  - Set of **destinations** with **demand** (requirement).
  - **Unit shipping cost** for all pairs of sources and destinations.
  - The **goal** is to **satisfy all requirements without exceeding any supply**.
  - The **objective** is to find **shipments to minimize total shipping cost**.
- **Type of the problem**
  - **Balanced** – total supply is equal to total demand.
  - **Unbalanced** – total supply is different from total demand, it is possible to make the problem balanced:
    - adding **dummy destination**,
    - finding **additional source** or adding **dummy source** (with the possibility of unsatisfied requirement).

# Linear Programming



## Transportation Problem

### Example

- The international company operating in the Czech Republic is going to establish **three subsidiaries producing chips**. They should be located in following cities: Benešov, Jihlava and Tábor.
- The main ingredient **potatoes** would be supplied from **two warehouses** in Humpolec and Pelhřimov.



Fig. 6 – Shipping from warehouses to subsidiaries



# Linear Programming

## Transportation Problem

### Example

- The management of the corporation has estimated the **weekly requirements** of the companies. The **warehouses' capacities** are limited. Potatoes are transported **once a week** from suppliers to destinations **by train** and it is possible to evaluate a **unit shipping cost per ton**. All the values are given in Table 5.
- The **objective** is to determine such **shipments** from warehouses to destinations that **minimize** the **total shipping cost**. This shipping schedule, of course, must satisfy requirement of each destination, and must not exceed supply of any warehouse.

Tab. 5 – Supplies, demands and unit shipping costs

	Benešov	Jihlava	Tábor	Supply
Humpolec	330	250	350	70
Pelhřimov	300	240	250	80
Demand	45	60	35	



# Linear Programming

## Transportation Problem

### Feasible solution (North-West Corner Method)

1. Select the upper left-hand corner cell of the transportation table and allocate as many units as possible equal to the minimum between available supply and demand, i.e.,  $\min(s_1, d_1)$ .
2. Adjust the supply and demand numbers in the respective rows and columns.
3. If the demand for the first cell is satisfied, then move horizontally to the next cell in the second column.
4. If the supply for the first row is exhausted, then move down to the first cell in the second row.
5. If for any cell, supply equals demand, then the next allocation can be made in cell either in the next row or column.
6. Continue the process until all supply and demand values are exhausted.

Tab. 6 – Feasible solution, North-West Corner Method

Shipments	Benešov	Jihlava	Tábor	Supply
Humpolec	45	25	-	70
Pelhřimov	-	35	35	80
Demand	45	60	35	

Objective value

$$z = 38250$$



# Linear Programming

## Transportation Problem

- **Feasible solution (Minimal Cost Method)**

1. Find a minimal cost for all possible shipments.
2. Assign the shipment to the pair of source and destination with the minimal cost found in step 1. The value of the shipment is equal to the minimum of remaining supply and remaining demand for this pair.
3. Decrease remaining supply and remaining demand, for the pair of the source and destination, by the shipment calculated in step 2.
4. If there is some remaining demand go to step 1, otherwise, the feasible solution is found.

Tab. 7 – Feasible solution, Minimal Cost Method

Shipments	Benešov	Jihlava	Tábor	Supply
Humpolec	45	-	15	70
Pelhřimov	-	60	20	80
Demand	45	60	35	

- Objective value

$$z = 39500$$



# Linear Programming

## Transportation Problem

- Decision variables

$x_{ij}$  = amount of potatoes (in tons) transported from source  $i$  to destination  $j$  ( $i = 1,2; j=1,2,3$ )

- Mathematical model

Minimize  $z = 330x_{11} + 250x_{12} + 350x_{13} + 300x_{21} + 240x_{22} + 250x_{23}$

subject to

$$x_{11} + x_{12} + x_{13} \leq 70 \quad (\text{Humpolec})$$

$$x_{21} + x_{22} + x_{23} \leq 80 \quad (\text{Pelhřimov})$$

$$x_{11} + x_{21} = 45 \quad (\text{Benešov})$$

$$x_{12} + x_{22} = 60 \quad (\text{Jihlava})$$

$$x_{13} + x_{23} = 35 \quad (\text{Tábor})$$

$$x_{ij} \geq 0, \quad i = 1,2; j = 1,2,3$$



# Linear Programming

## Transportation Problem

- **Mathematical model**

$$z = \sum_{i=1}^m \sum_{j=1}^n c_{ij} x_{ij} \rightarrow \min$$

$$\sum_{j=1}^n x_{ij} \leq a_i, \quad i = 1, 2, \dots, m$$

$$\sum_{i=1}^m x_{ij} = b_j, \quad j = 1, 2, \dots, n$$

$$x_{ij} \geq 0, \quad i = 1, 2, \dots, m; j = 1, 2, \dots, n$$





# Linear Programming

## Transportation Problem

- Optimal solution

- Decision variables

Tab. 8 – Optimal solution

Shipments	Benešov	Jihlava	Tábor	Supply
Humpolec	-	60	-	70
Pelhřimov	45	-	35	80
Demand	45	60	35	

- Objective value

$$z_0 = 37250$$

- Slack/surplus variables

$$y_1 = 10$$

$$y_2 = 0$$



# Linear Programming

## Container Transportation Problem

- Based on the transportation problem.
- Goods is transported in **containers of the same capacity**.
- The **shipping costs are not associated with the transported units**, but with the **use of one container between the source and the destination**.
- The **objective** is to determine the **shipments between sources and destinations** and the **number of containers used for the transport**.



# Linear Programming

## Container Transportation Problem

- **Example**

- Based on the previous example, the company charges the shipping costs for renting one wagon between sources and destinations.
- Wagons with capacity of 18 tons will be used for transport.
- The objective is to determine how many tons of potatoes will be shipped between the individual locations, but in addition, to determine how many wagons will be used for this transport so that the total transportation costs are minimal.

Tab. 9 – Statement of container transportation problem

	Benešov	Jihlava	Tábor	Supply
Humpolec	4200	4800	5300	70
Pelhřimov	5100	3400	3700	80
Demand	45	60	35	



# Linear Programming

## Container Transportation Problem

- Mathematical model is based on the mathematical model of transportation problem.

- Decision variables**

$x_{ij}$  = the shipment (in tones) from  $i$  – th source  $j$  – th destination.

$y_{ij}$  = number of containers used for transport.

- Objective**

$$z = \sum_{i=1}^m \sum_{j=1}^n c_{ij} y_{ij} \rightarrow \min$$

- Constraints**

- It is necessary to add following constraints to the constraints of the transportation problem:

$$x_{ij} \leq K y_{ij}, \quad i = 1, 2, \dots, m; j = 1, 2, \dots, n$$

$$y_{ij} \geq 0, \text{ integers}, \quad i = 1, 2, \dots, m; j = 1, 2, \dots, n$$



# Linear Programming

## Container Transportation Problem

- **Optimal solution**

Tab. 10 – Shipments

	Benešov	Jihlava	Tábor
Humpolec	45	18	-
Pelhřimov	-	42	35

Tab. 11 – Number of wagons

	Benešov	Jihlava	Tábor
Humpolec	3	1	-
Pelhřimov	-	3	2



# Linear Programming

## Assignment Problem

- **Definition of the problem**
  - **Two sets** of items.
  - **Each item** from the **first set** is to be **assigned** to **exactly one** item from the **second set**.
  - **Each item** from the **second set** is to be **assigned** to **exactly one** item from the **first set**.
  - The **assignment** of each pair of items is **evaluated**.
  - The **objective** is to **maximize/minimize** total value of **assignment**.
  - The **assumption**: sizes of both sets are equal (**balanced problem**).



# Linear Programming

## Assignment Problem

### ▪ Example

- The company gets four commissions for building family houses in various parts of Prague (Michle, Prosek, Radlice, Troja).
- In the first step the company must solve the problem of excavating the shafts for basements. Each excavation takes 5 days. Management of the company decided to use four own excavators stored in four separated garages (they are moved to destinations each day).
- The objective is to allocate each excavator to exactly one excavation with minimal cost. Since the costs are derived from distances (in km, see Table 8) between garages and destinations, we can concentrate only on these distances to define the objective.

Tab. 12 – Distances between garages and destinations

	Michle	Prosek	Radlice	Troja
Garage 1	5	22	12	18
Garage 2	15	17	6	10
Garage 3	8	25	5	20
Garage 4	10	12	19	12

# Linear Programming

## Assignment Problem

- Decision variables

$$x_{ij} = \begin{cases} 1 & \text{if the excavator from garage } i \text{ goes to destination } j \\ 0 & \text{otherwise} \end{cases}$$





# Linear Programming

## Assignment Problem

- **Mathematical model**

Minimize  $z = 5x_{11} + 22x_{12} + \dots + 12x_{44}$

subject to

$$x_{11} + x_{12} + x_{13} + x_{14} = 1 \quad (\text{Garage 1})$$

$$x_{21} + x_{22} + x_{23} + x_{24} = 1 \quad (\text{Garage 2})$$

$$x_{31} + x_{32} + x_{33} + x_{34} = 1 \quad (\text{Garage 3})$$

$$x_{41} + x_{42} + x_{43} + x_{44} = 1 \quad (\text{Garage 4})$$

$$x_{11} + x_{21} + x_{31} + x_{41} = 1 \quad (\text{Michle})$$

$$x_{12} + x_{22} + x_{32} + x_{42} = 1 \quad (\text{Prosek})$$

$$x_{13} + x_{23} + x_{33} + x_{43} = 1 \quad (\text{Radlice})$$

$$x_{14} + x_{24} + x_{34} + x_{44} = 1 \quad (\text{Troja})$$



# Linear Programming

## Assignment Problem

- **Optimal solution**
  - Decision variables

Tab. 13 – Optimal assignment of excavators to destinations

	Michle	Prosek	Radlice	Troja
Garage 1	1	0	0	0
Garage 2	0	0	0	1
Garage 3	0	0	1	0
Garage 4	0	1	0	0

- Objective value  
 $z_0 = 32$



# Linear Programming

## Assignment Problem

- Balanced problem

$$z = \sum_{i=1}^n \sum_{j=1}^n c_{ij} x_{ij} \rightarrow \min$$

$$\sum_{j=1}^n x_{ij} = 1, \quad i = 1, 2, \dots, n$$

$$\sum_{i=1}^n x_{ij} = 1, \quad j = 1, 2, \dots, n$$

$$x_{ij} \in \{0, 1\}, \quad i = 1, 2, \dots, n; j = 1, 2, \dots, n$$

- Unbalanced problem ( $m > n$ )

$$z = \sum_{i=1}^m \sum_{j=1}^n c_{ij} x_{ij} \rightarrow \min$$

$$\sum_{j=1}^n x_{ij} \leq 1, \quad i = 1, 2, \dots, m$$

$$\sum_{i=1}^m x_{ij} = 1, \quad j = 1, 2, \dots, n$$

$$x_{ij} \in \{0, 1\}, \quad i = 1, 2, \dots, m; j = 1, 2, \dots, n$$

or using  $(m - n)$  dummy items



# Linear Programming

## Covering Problem

- In covering problem, we have a **defined set of items** (projects, jobs, processes, activities etc.) that have to be **satisfied** (covered) by some of several possible alternatives (firms, employees, managers etc.).
- Mostly, **alternatives** are **selected based on the costs**.



# Linear Programming

## Covering Problem

### Example

- In **two** of the six city districts it is **necessary** to establish emergency ambulance stations **to cover all districts**.
- Table 14 shows the average arrival times (in min) from the station, established in a given district (at a predetermined location), to emergency incidents in each district..
- The last row of the table shows the **average daily frequency** of emergency operations in each district.
- The **objective** is **to suggest where to establish stations and to assign the districts to be served by these stations** so that the **average daily operation time is minimal**.

Tab. 14 – Statement of covering problem

	D <sub>1</sub>	D <sub>2</sub>	D <sub>3</sub>	D <sub>4</sub>	D <sub>5</sub>	D <sub>6</sub>
D <sub>1</sub>	4	12	14	17	11	9
D <sub>2</sub>	20	7	10	19	24	16
D <sub>3</sub>	21	13	5	8	11	15
D <sub>4</sub>	9	12	14	3	8	18
D <sub>5</sub>	17	25	13	10	6	16
D <sub>6</sub>	13	8	9	15	10	5
frequency	30	50	42	36	24	28



# Linear Programming

## Covering Problem

- Decision variables

$$y_i = \begin{cases} 1 & \text{if in } i\text{-th district there is established} \\ & \text{the emergency station,} \\ 0 & \text{otherwise,} \end{cases} \quad i = 1, 2, \dots, n,$$

$$x_{ij} = \begin{cases} 1 & \text{if the station in } i\text{-th district} \\ & \text{serves } j\text{-th district,} \\ 0 & \text{otherwise,} \end{cases} \quad \begin{array}{l} i = 1, 2, \dots, n, \\ j = 1, 2, \dots, n. \end{array}$$



# Linear Programming

## Covering Problem

- Objective

$$z = \sum_{i=1}^n \sum_{j=1}^n f_j c_{ij} x_{ij} \rightarrow \min$$

- Constraints

$$\sum_{j=1}^n x_{ij} \leq (n - K + 1) y_i, \quad i = 1, 2, \dots, n$$

The station establishment and the districts served by this station.

$$\sum_{i=1}^n x_{ij} = 1, \quad j = 1, 2, \dots, n$$

Each district will be served by exactly one station.

$$\sum_{i=1}^n y_i = K$$

Exactly  $K$  stations will be established.



# Linear Programming

## Covering Problem

- Solution

Tab. 15 – Optimal solution to covering problem

	D <sub>1</sub>	D <sub>2</sub>	D <sub>3</sub>	D <sub>4</sub>	D <sub>5</sub>	D <sub>6</sub>
D <sub>1</sub>	0	0	0	0	0	0
D <sub>2</sub>	0	0	0	0	0	0
D <sub>3</sub>	0	0	0	0	0	0
D <sub>4</sub>	1	0	0	1	1	0
D <sub>5</sub>	0	0	0	0	0	0
D <sub>6</sub>	0	1	1	0	0	1

The first station will be established in district D<sub>4</sub> and will serve (in addition to itself) districts D<sub>1</sub> and D<sub>5</sub>.  
The second one will be established in D<sub>6</sub> and will serve (in addition to itself) districts D<sub>2</sub> and D<sub>3</sub>.





# Linear Programming

## Traveling Salesman Problem

- **Definition of the problem**
  - Set of customers.
  - Each customer must be visited exactly once.
  - Cyclical route starts and ends in the home city (index 1).
  - Evaluation of direct travel from location  $i$  to location  $j$  is denoted by  $c_{ij}$  (distance, time or cost).
  - Objective is to minimize total length of the route, total travel time or total travel cost.



# Linear Programming

## Traveling Salesman Problem

### Example

- A sales representative of the brewery located in Velvary must visit 7 pubs in 7 cities.
- In Table 16, distances (in km) correspond to direct links (roads) between cities. A dash indicates there is no direct road between cities.
- The objective is to visit all pubs minimizing total length of the route.

Tab. 16 – Distances between cities on roads

Obec	Velv	Kra	Lib	Sla	Zlo	Vra	Bri	Velt
Velvary	0	8	-	13	10	-	12	9
Kralupy	8	0	6	16	-	-	-	4
Libcice	-	6	0	-	-	-	-	-
Slany	13	16	-	0	7	-	-	-
Zlonice	10	-	-	7	0	7	13	-
Vrany	-	-	-	-	7	0	15	-
Briza	12	-	-	-	13	15	0	13
Veltrusy	9	4	-	-	-	-	13	0

# Linear Programming



## Traveling Salesman Problem

- **Example**
  - Table 17 contains **distances between all pairs** of cities.

Tab. 17 – Distances between cities

Obec	Velv	Kra	Lib	Sla	Zlo	Vra	Bri	Velt
Velvary	0	8	14	13	10	17	12	9
Kralupy	8	0	6	16	18	25	17	4
Libcice	14	6	0	22	24	31	23	10
Slany	13	16	22	0	7	14	20	20
Zlonice	10	18	24	7	0	7	13	19
Vrany	17	25	31	14	7	0	15	26
Briza	12	17	23	20	13	15	0	13
Veltrusy	9	4	10	20	19	26	13	0



# Linear Programming

## Traveling Salesman Problem

### Feasible solution (Nearest Neighbor Algorithm)

1. Select any location as the initial one of the route (home city).
2. Find the nearest location (not selected before) to the last location on the route and add it to the route. If it is impossible (all locations have been selected) then add the initial location to the route and go to Step 4.
3. Go to step 2.
4. End.

Tab. 18 – Feasible solution, Nearest Neighbor Algorithm

Obec	Velv	Kra	Lib	Sla	Zlo	Vra	Bri	Velt
Velvary	0	8	14	13	10	17	12	9
Kralupy	8	0	6	16	18	25	17	4
Libcice	14	6	0	22	24	31	23	10
Slany	13	16	22	0	7	14	20	20
Zlonice	10	18	24	7	0	7	13	19
Vrany	17	25	31	14	7	0	15	26
Briza	12	17	23	20	13	15	0	13
Veltrusy	9	4	10	20	19	26	13	0

Objective value

$$z = 85$$



# Linear Programming

## Traveling Salesman Problem

- **Decision variables**

$$x_{ij} = \begin{cases} 1 & \text{if a vehicle travels directly} \\ & \text{between nodes } i \text{ and } j \\ 0 & \text{otherwise} \end{cases} \quad \begin{matrix} i = 1, 2, \dots, n \\ j = 1, 2, \dots, n \end{matrix}$$

- **Dummy variables**

$u_i$  = dummy variable in sub-tours eliminating constraints



# Linear Programming

## Traveling Salesman Problem

- Mathematical model

$$\min \sum_{i=1}^n \sum_{j=1}^n c_{ij} x_{ij}$$

$$\sum_{j=1}^n x_{ij} = 1 \quad \text{for } i = 1, 2, \dots, n$$

$$\sum_{i=1}^n x_{ij} = 1 \quad \text{for } j = 1, 2, \dots, n$$

$$u_i + 1 - (n - 1)(1 - x_{ij}) \leq u_j \quad \text{for } \begin{matrix} i = 1, 2, \dots, n \\ j = 2, 3, \dots, n \end{matrix}$$

$$x_{ij} \in \{0, 1\} \quad \text{for } \begin{matrix} i = 1, 2, \dots, n \\ j = 1, 2, \dots, n \end{matrix}$$

$$u_i \in \mathbb{R}_+ \quad \text{for } i = 1, 2, \dots, n$$



# Linear Programming

## Traveling Salesman Problem

- Optimal solution

Tab. 19 – Optimal route

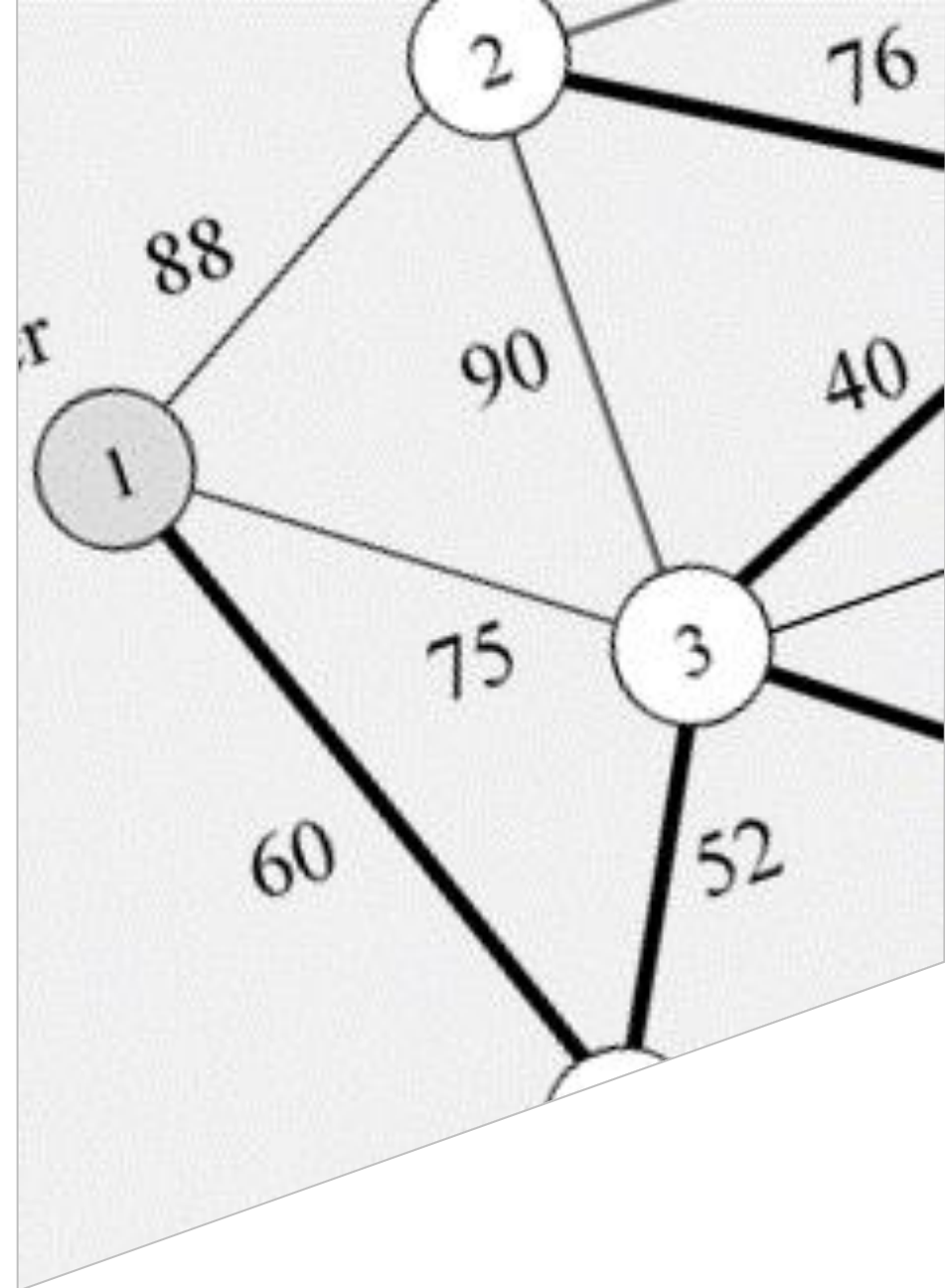
Obec	Velv	Kra	Lib	Sla	Zlo	Vra	Bri	Velt
Velvary	0	8	14	13	10	17	12	9
Kralupy	8	0	6	16	18	25	17	4
Libcice	14	6	0	22	24	31	23	10
Slany	13	16	22	0	7	14	20	20
Zlonice	10	18	24	7	0	7	13	19
Vrany	17	25	31	14	7	0	15	26
Briza	12	17	23	20	13	15	0	13
Veltrusy	9	4	10	20	19	26	13	0

- Objective value

$$z_0 = 79$$

3

# Graph Modeling





# Graph Modeling

## Introduction

- Seven bridges of Königsberg

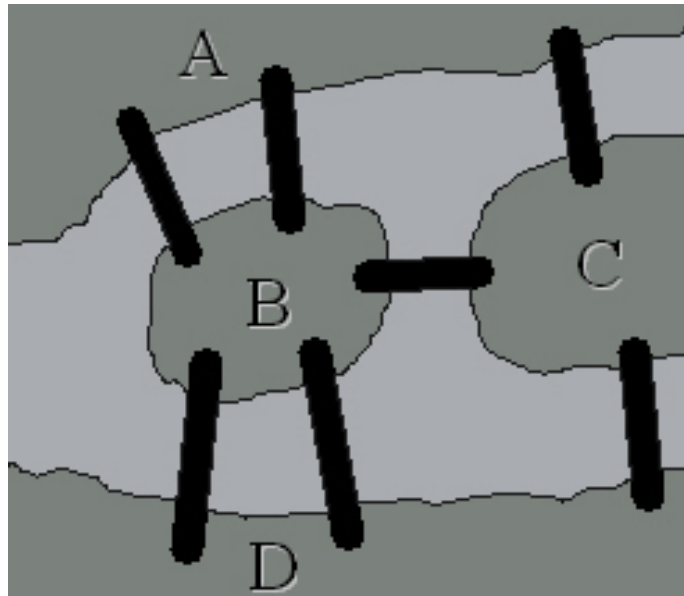


Fig. 7 – Real situation

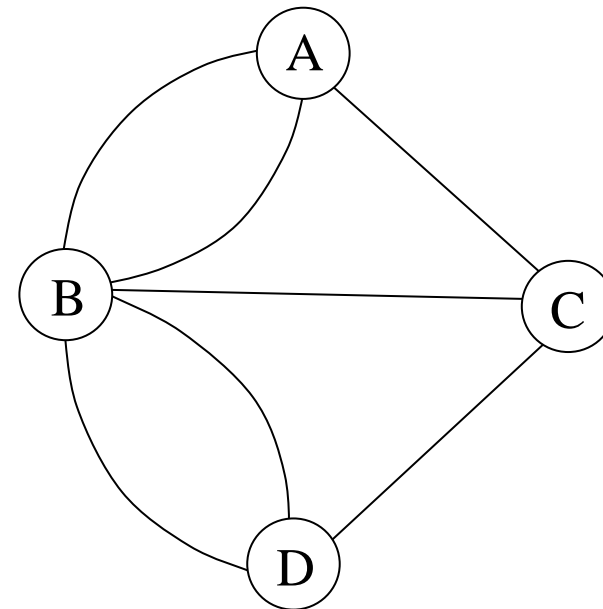


Fig. 8 – Graph as the model



# Graph Modeling

## Introduction

- **Basic terminology**

Graph is a set  $G = \{V, E\}$ , where  $V$  is a set of vertices (nodes) and  $E$  is a set of edges (arcs).

Undirected arc is a set of two vertices  $\{i, j\}$ .

Directed arc is an ordered pair of two vertices  $(i, j)$ .

In undirected graph all arcs are undirected.

In directed graph (digraph) all arcs are directed.

Mixed graph contains both undirected and directed arcs.

Two nodes that are contained in an arc are adjacent.

Two arcs that share a node are adjacent.

An arc and a node contained in that arc are incident.

Degree of a node (in undirected graph) is a number of incident arcs.

In-degree of a node (in directed graph) is a number of incident arcs in which the node is the terminal one.

Out-degree of a node (in directed graph) is a number of incident arcs in which the node is the initial one.



# Graph Modeling

## Introduction

- **Basic terminology**

Walk from node  $i$  to node  $j$  is a sequence of nodes and arcs, where  $i$  is the initial node and  $j$  is the terminal node (nodes and arcs may be repeated).

Trail is a walk with no repeated arc.

Path is a trail with no repeated node.

Cycle is closed walk (the initial node is the terminal one).

In directed path (in directed graph) a direction of all arcs is respected.

In undirected path (in directed graph) a direction of all arcs may not be respected.

Undirected graph is connected if between each pair of nodes there is a path.

Directed graph is connected if there is a directed or undirected path between each pair of nodes.



# Graph Modeling

## Introduction

- **Basic terminology**

Directed graph is **strongly connected** if there is a directed path between each pair of nodes.

Undirected graph is **complete** if there is an arc between each pair of nodes.

Tree is a connected undirected graph with no cycles.

Subgraph of graph  $G = \{V, E\}$  is a graph  $G' = \{V', E'\}$ , where  $V' \subseteq V$  and  $E' \subseteq E$ .

Spanning tree of the graph  $G$  is a subgraph  $G'$ , where  $V' = V$  and which is a tree.

Valued graph has numbers associated with nodes or/and arcs.

Hamiltonian cycle is a cycle that includes each node of the graph exactly once.

Eulerian cycle includes each arc of the graph exactly once.

Eulerian trail is a trail that includes each arc of the graph.

Eulerian graph is a graph in which the Eulerian cycle can be found.

# Graph Modeling



## Introduction

- **Basic terminology**
  - Connected and unconnected graph

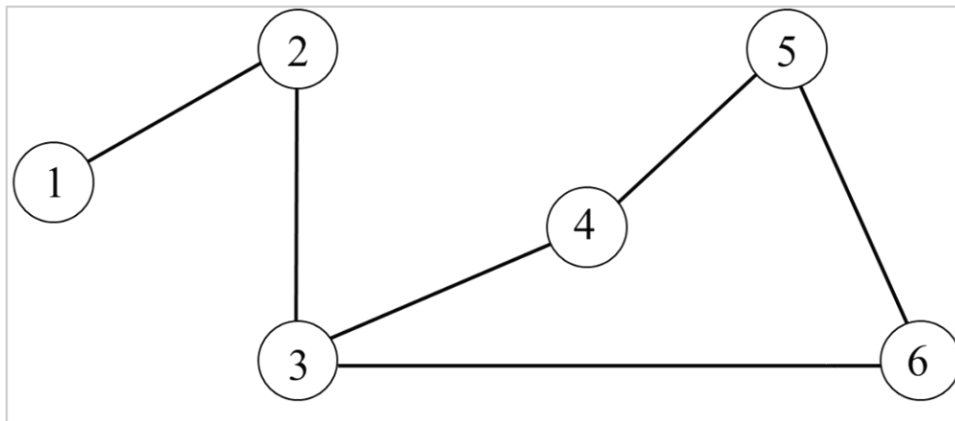


Fig. 9 – Connected graph

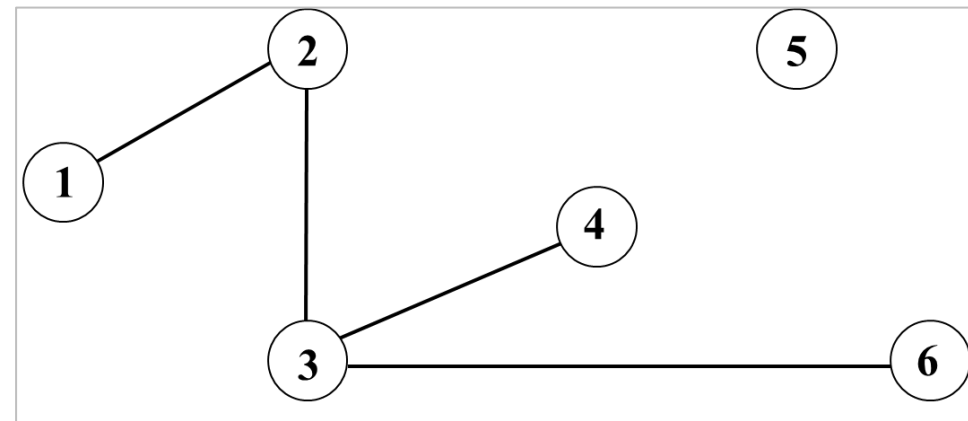


Fig. 10 – Unconnected graph

# Graph Modeling



## Introduction

- **Basic terminology**
  - Cycle (circuit)

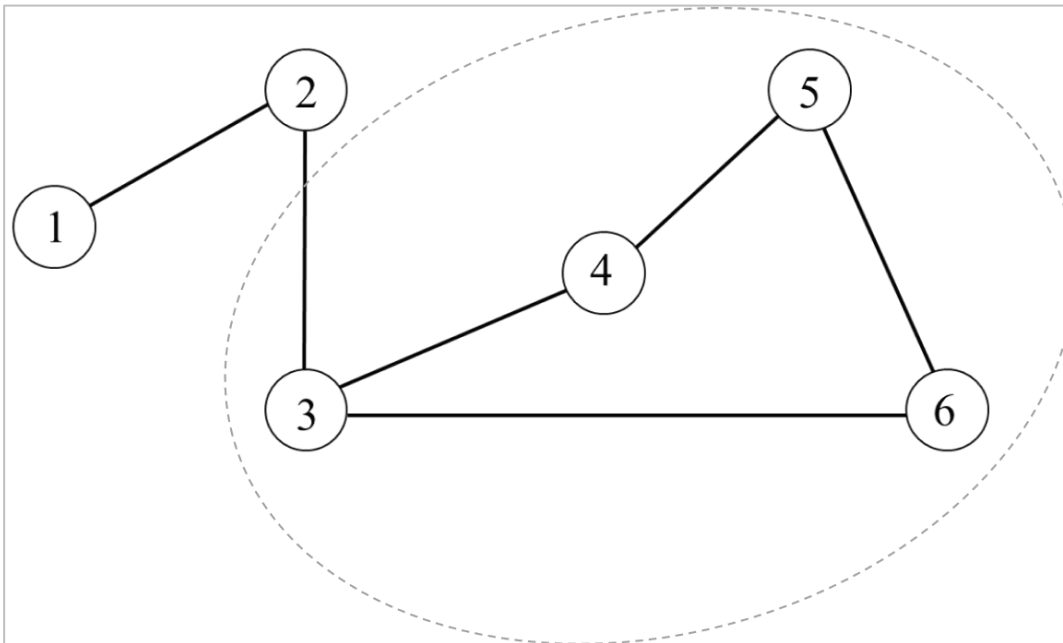


Fig. 11 – Cycle

# Graph Modeling



## Introduction

- **Basic terminology**
  - Tree and spanning tree

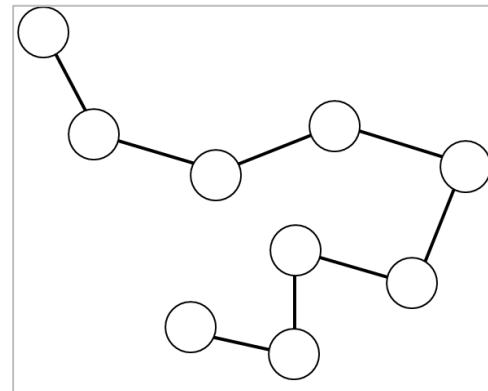
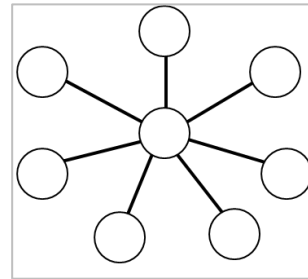
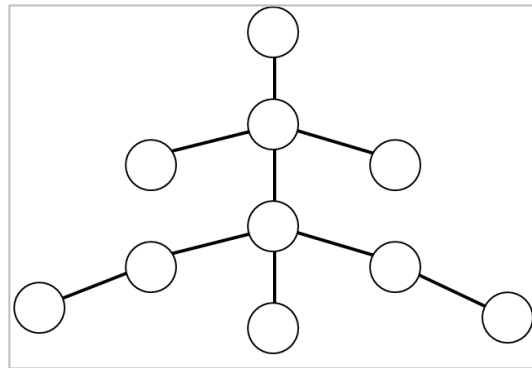


Fig. 12 – Trees

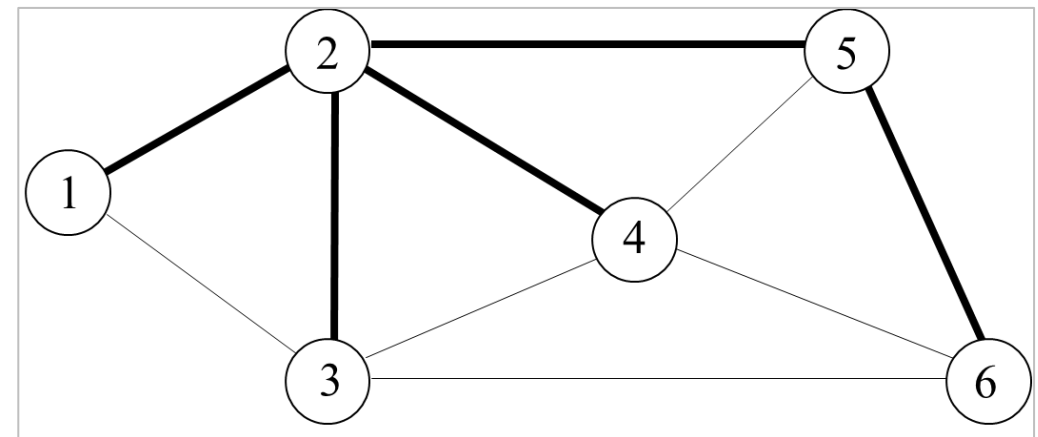


Fig. 13 – Spanning tree



# Graph Modeling

## Shortest Path Problem

- The **objective** is to find the shortest path between a pair of nodes.
- The problem while using of GPS navigation in the car or with search of connection on a map portal.
- Many algorithms are designed specially to find distances between all pairs of nodes in given graph.
- Dijkstra's algorithm is designed to find the shortest path from one particular node to all other nodes in the graph.



# Graph Modeling



## Shortest Path Problem

- Example

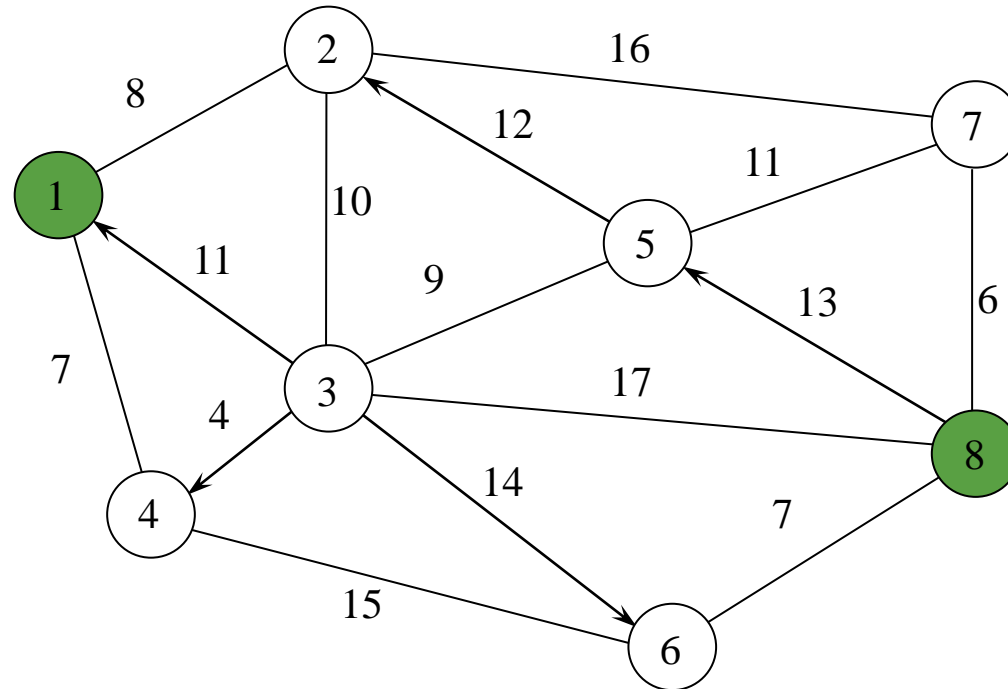


Fig. 14 – Distribution network for the transport of overweight load



# Graph Modeling

## Shortest Path Problem

- In the first step, it is necessary to transcript the graph into the Table 20, where are node numbers (first row), calculated distances – reserved for later (second row) and the table list (for each node  $i$ , all nodes  $j$  to which an arc leads from it).

Tab. 20 – Input data for calculation

$i$	1	2	3	4	5	6	7	8
$t_i$	0							
$j(y_{ij})$	2(8)	3(10)	2(10)	6(15)	2(12)	4(15)	2(16)	3(17)
	4(7)	7(16)	4(4)		3(9)	8(7)	5(11)	5(13)
			5(9)		7(11)		8(6)	6(7)
			6(14)					7(6)
		8(17)						

- In the following steps, we will consider only the columns in which value  $t_i$  is already calculated. We always look for the shortest paths from just these nodes to all nodes  $j$  whose value  $t_i$  is not yet determined, through the arcs listed.

# Graph Modeling

## Shortest Path Problem

- In the second step, we will consider only the first column and nodes 2 and 4.
- There are two direct paths from node 1: to node 2, which length is  $(0+8)$ , and to node 4, which length is  $(0+7)$ . We take the minimum of these two values i.e., 7, and write this value to the corresponding node i.e., 4. Thus,  $t_4 = 7$ . The **selected value (arc) is framed** and **scratched** are those arcs ending in currently selected node.

Tab. 21 – Calculation of the shortest path to node 4

$i$	1	2	3	4	5	6	7	8
$t_i$	0			7				
$j(y_{ij})$	2(8)	3(10)	2(10)	6(15)	2(12)	4(15)	2(16)	3(17)
	4(7)	7(16)	4(4)		3(9)	8(7)	5(11)	5(13)
			5(9)		7(11)		8(6)	6(7)
			6(14)					7(6)
			8(17)					



# Graph Modeling

## Shortest Path Problem

- In the third step, based on Table 21, we look for the minimum of two values:  $(0+8)$  and  $(7+15)$ . In the next step, we calculate  $\min(8+10, 8+16, 7+15) = 8+10 = 18$ .

Tab. 22 – Calculation of the shortest path to node 2

$i$	1	2	3	4	5	6	7	8
$t_i$	0	8		7				
$j(y_{ij})$	2(8)	3(10)	2(10)	6(15)	2(12)	4(15)	2(16)	3(17)
	4(7)	7(16)	4(4)		3(9)	8(7)	5(11)	5(13)
			5(9)		7(11)		8(6)	6(7)
			6(14)					7(6)
			8(17)					

- We continue in this process till all values  $t_i$  are determined.

# Graph Modeling



## Shortest Path Problem

Tab. 23 – Final solution for the shortest path

$i$	1	2	3	4	5	6	7	8
$t_i$	0	8	18	7	27	22	24	29
$j(y_{ij})$	2(8)	3(10)	<del>2(10)</del>	6(15)	<del>2(12)</del>	<del>4(15)</del>	<del>2(16)</del>	<del>3(17)</del>
	4(7)	7(16)	4(4)		<del>3(9)</del>	8(7)	<del>5(11)</del>	5(13)
			5(9)		<del>7(11)</del>		<del>8(6)</del>	<del>6(7)</del>
			<del>6(14)</del>					<del>7(6)</del>
		<del>8(17)</del>						

# Graph Modeling

## Shortest Path Problem

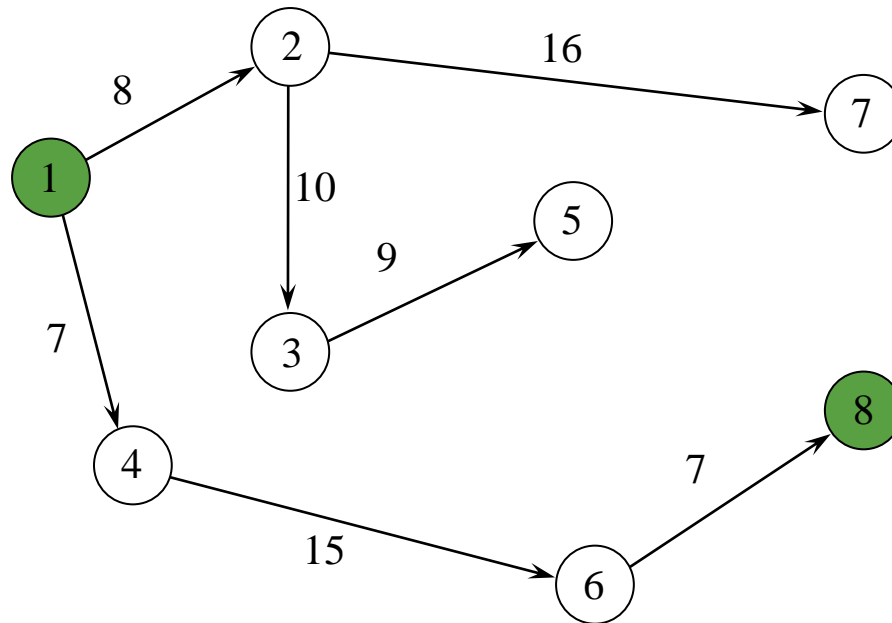


Fig. 15 – Shortest paths from node 1 to all other nodes



# Graph Modeling

## Minimal Spanning Tree

- **Definition of the problem**
  - Graph with  $n$  nodes and valued arcs.
  - Objective is to find the spanning tree with the minimal sum of values assigned to selected arcs.
- **Optimization method**
  1. Sort arcs in ascending (non-descending) order according to values.
  2. Select two arcs with minimal values.
  3. Select the arc (in the ordered list) with the minimal value.
  4. If the arc creates a cycle with any of selected arcs, skip the arc, otherwise add the arc to the set of selected arcs.
  5. If the number of selected arcs is equal to  $n - 1$  then go to step 6, otherwise go to step 3.
  6. End.

# Graph Modeling

## Minimal Spanning Tree

### Example

- The managerial problem is to **connect 9 locations** of an exhibition area with the **source of electricity power**.
- The **objective** is to **minimize the cost** of all the extensions.  
The **direct distances** (in meters) between locations can be found in figure 16.
- The **node 1** is the source of power.
- The **price** per meter of a cable is 10 CZK.

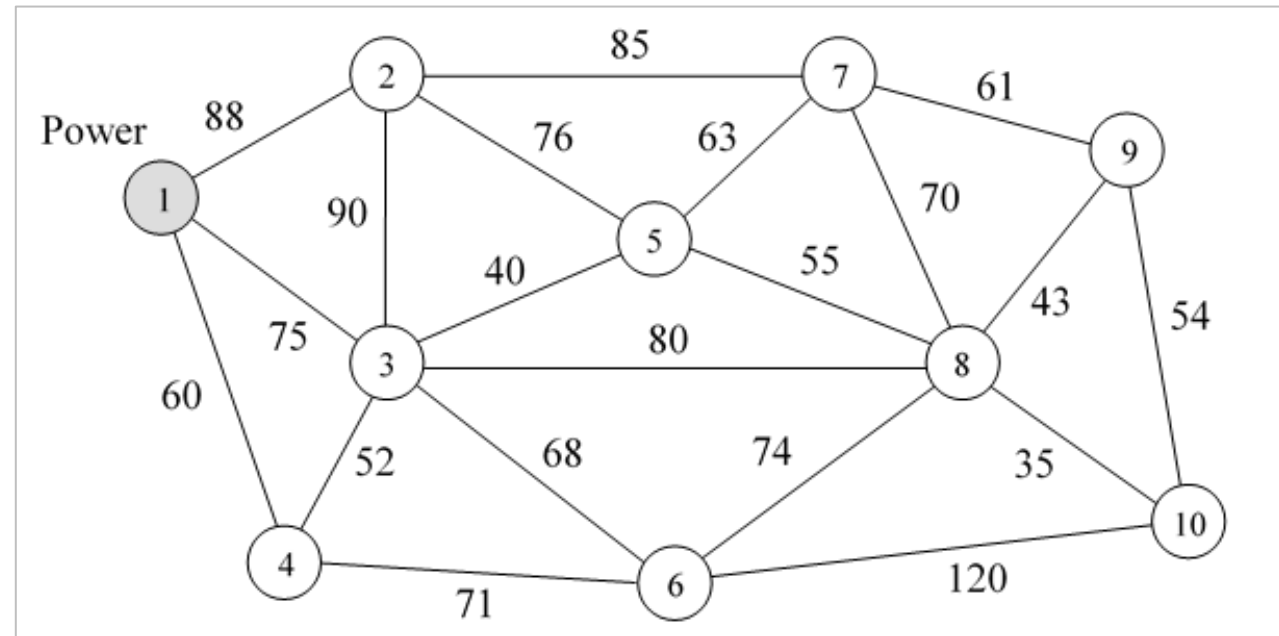


Fig. 16 – Map of the exhibition area



# Graph Modeling

## Minimal Spanning Tree

- Optimal solution

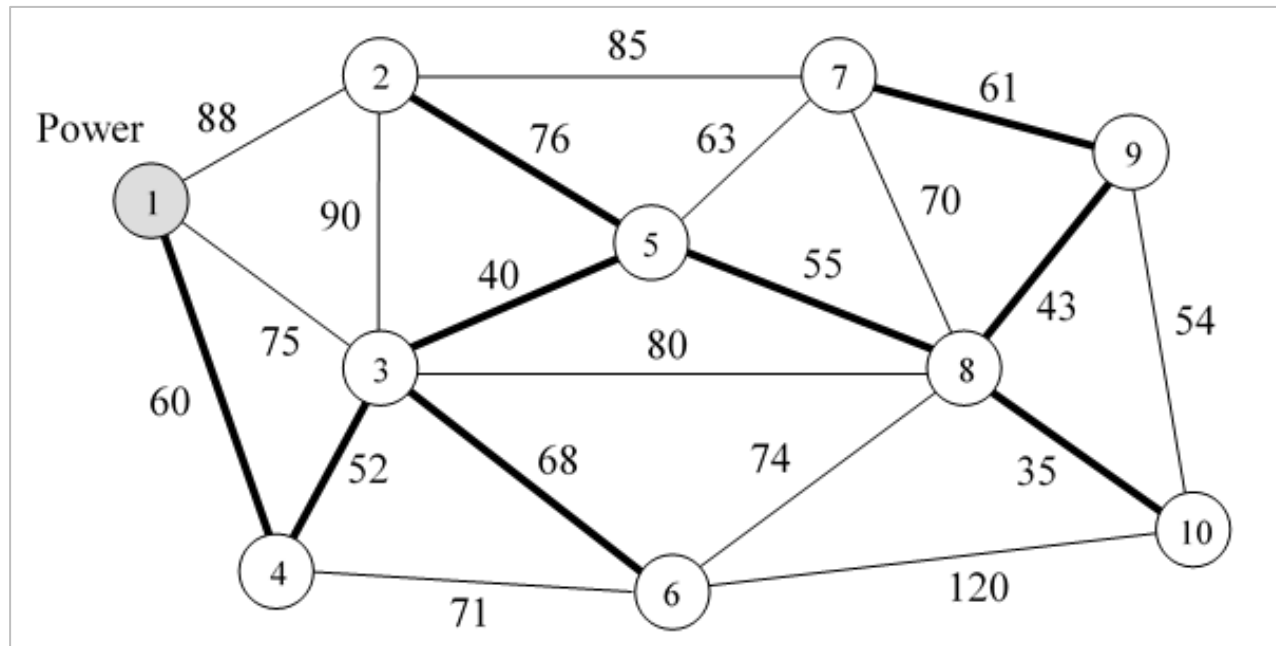


Fig. 17 – Cable placement

- Minimal value of spanning tree

$$z_0 = 490$$



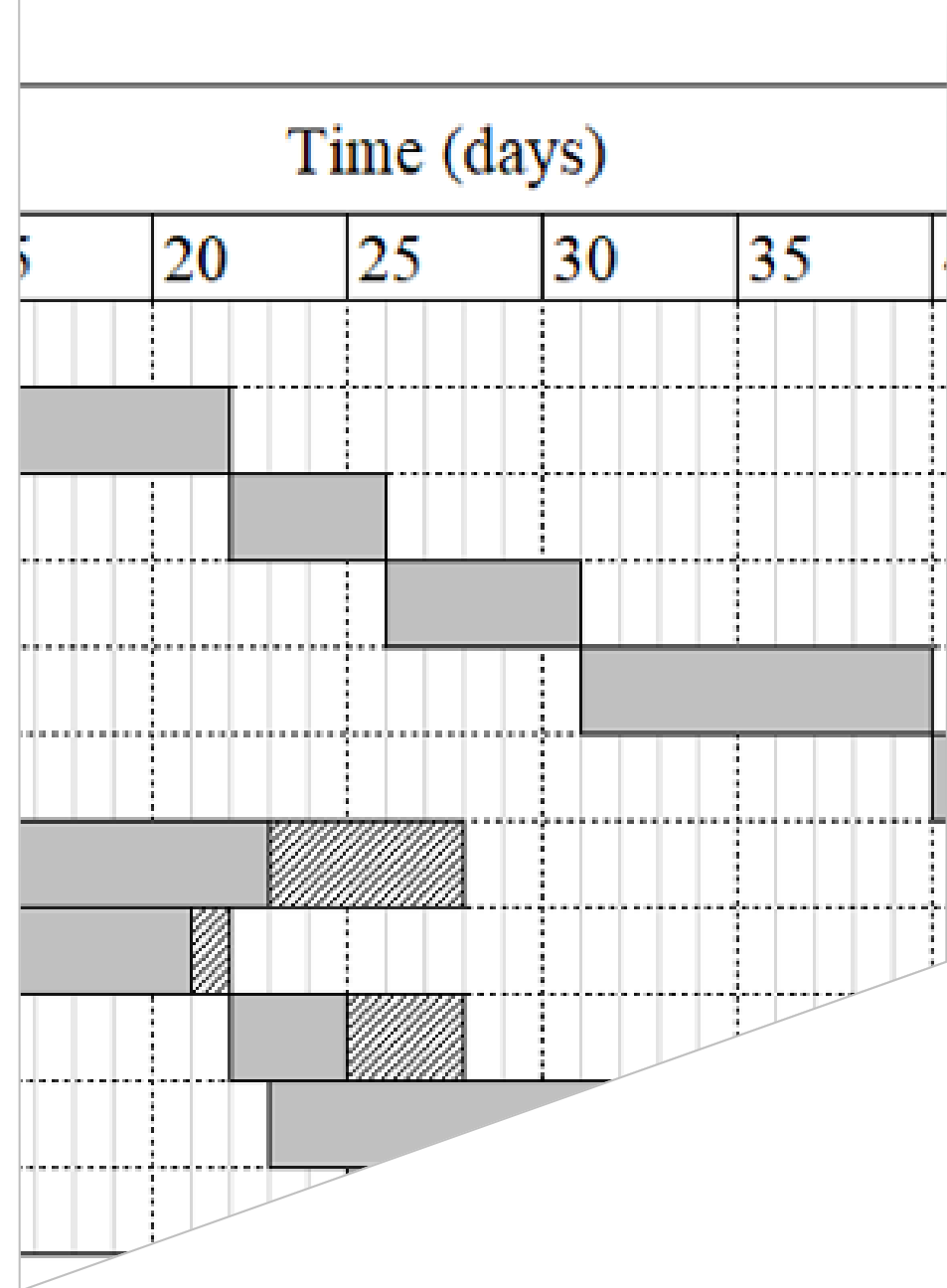
# Graph Modeling

## Other optimization problems

- **Connection**
  - Minimal Spanning Tree.
  - Minimal Steiner Tree.
- **Paths and routes**
  - Minimal Path Problem.
  - Traveling Salesman Problem.
  - Vehicle Routing Problem.
  - Pick-up and Delivery Problem.
  - Chinese Postman Problem.
- **Flows**
  - Maximal Flow Problem.
  - Minimal Cost Flow Problem.
  - Transshipment Problem.

# 4

# Project Management





# Project Management

## Introduction

- **Project**
  - **Set** of interrelated **activities** (jobs, operations).
  - **Activity**:
    - duration **time**,
    - **cost**,
    - **resources**,
    - **immediate predecessors**.
- **Duration time**
  - **deterministic** (constant) – Critical Path Method (CPM), Metra Potential Method (MPM)
  - **probabilistic** (random variable) – Program Evaluation and Review Technique (PERT)

# Project Management

## Introduction

- **Network**
  - Graphical representation of a project.
  - Activities are represented by
    - arcs (CPM),
    - nodes (MPM).

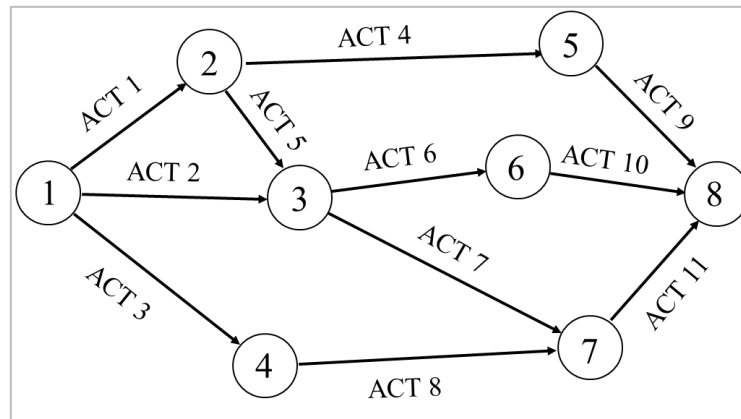


Fig. 18 – Project network represented by arcs

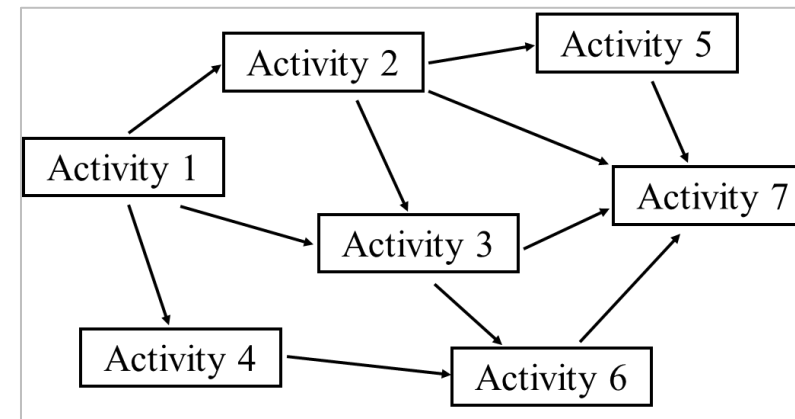


Fig. 19 – Project network represented by nodes



# Project Management

## Critical Path Method

- **Phases of project**
  - **Planning**
    - determination of all activities, their time durations and immediate predecessors,
    - construction of a network representing the project.
  - **Scheduling**
    - finish time of the project,
    - start and finish times of each activity,
    - a critical path consisting of critical activities,
    - non-critical activities and their possible delay,
    - Gantt chart.
  - **Controlling**
    - comparison of the real performance of the project with the proposed schedule,
    - dynamic changes in the schedule.



# Project Management

## Critical Path Method

### ▪ Example

- Project manager of direct marketing company has received the direction to prepare the Christmas compilation of **Czech carols**.
- The **offer** should be sent to the **addresses** of company's **customers**, who are interested in carols. For this purpose, a thorough analysis should be carried out to select the best customers for the **promotion**.
- The project manager must consider **11 activities** to realize the project (see Table 13).
- All the envelopes have to be delivered until December 12 (Thursday). Described activities together with their **duration** (in working days) and their **immediate predecessors** can be found in Table 13.
- The project manager must now **set** the **starting date** of the project such that it will be finished exactly on the specified date.

# Project Management



## Critical Path Method

- **Example**

Tab. 24 – Activities of direct marketing project

Activity	Activity Description	Duration	Immediate Predecessors
A	Songs Selection	15	None
B	Mastering	8	A
C	Promotion Material Elaborating	6	A
D	Customers Analysis	7	A
E	Promotion Material Production	4	C, D
F	Promotion Material to Printing House	5	E
G	Customers Selection	3	D
H	Make CD Copies	12	B, D
I	Data to Printing House	3	G
J	Laser Print	9	F, I
K	Mailing	8	H, J





# Project Management

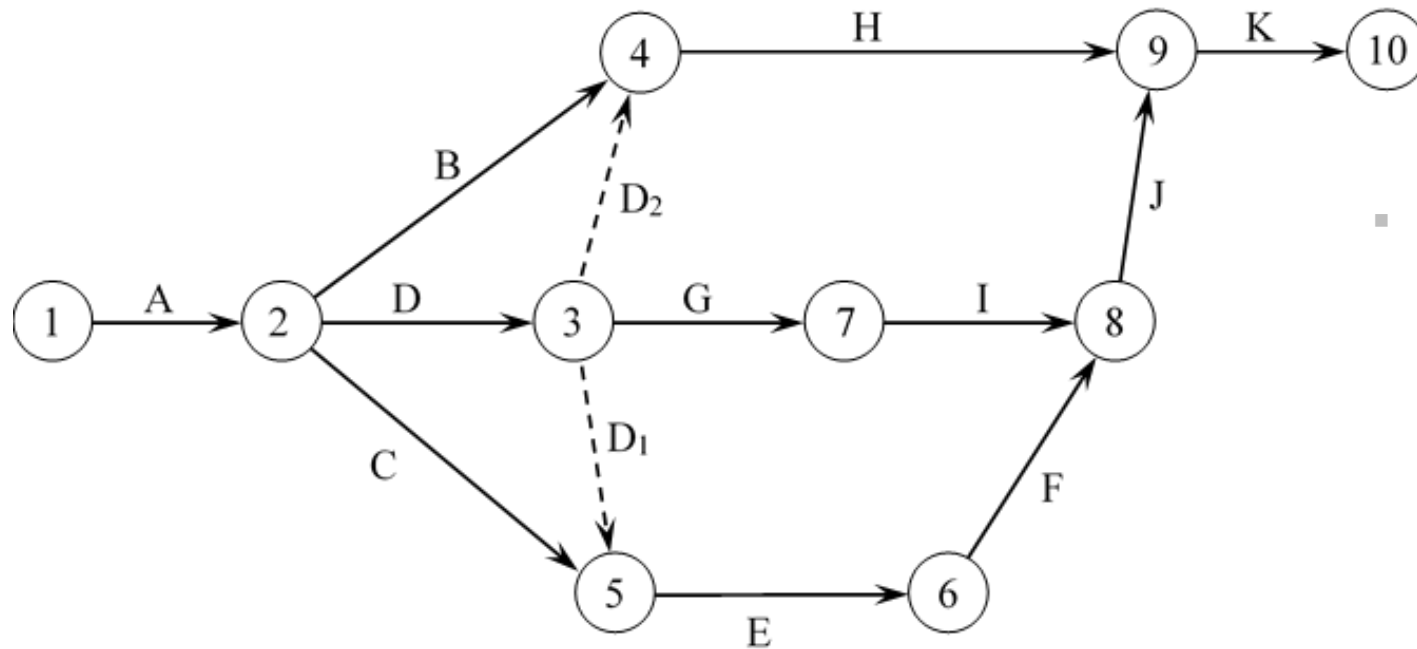
## Critical Path Method

- **Construction of the network**
  - One start node and one finish node.
  - Each activity must be represented just by one arc.
  - Two nodes are connected maximally by one arc.
  - The node, representing the completion of an activity, has higher number than the node representing the start of this activity – the rule prevents circuits in the network.
  - Dummy activity (arc) assures the correct interrelations between real activities. Its duration is zero

# Project Management

## Critical Path Method

- Construction of the network



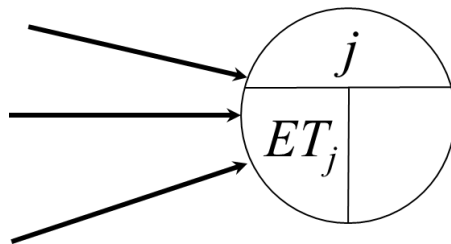
- D<sub>1</sub>, D<sub>2</sub> – dummy activities

Fig. 20 – Network of direct marketing project

# Project Management

## Critical Path Method

- **Event analysis – forward pass**
  - The **earliest event time** for a **node** is the earliest time at which all the preceding activities have been completed.
  - The computation runs through the nodes according to their numbers (in ascending order), from the start of the project to its finish.



$$ET_j = \max_i (ET_i + t_{ij}) \quad j = 2, 3, \dots, n$$

- The **earliest event time** for **completing a project** is the earliest time of the last event:

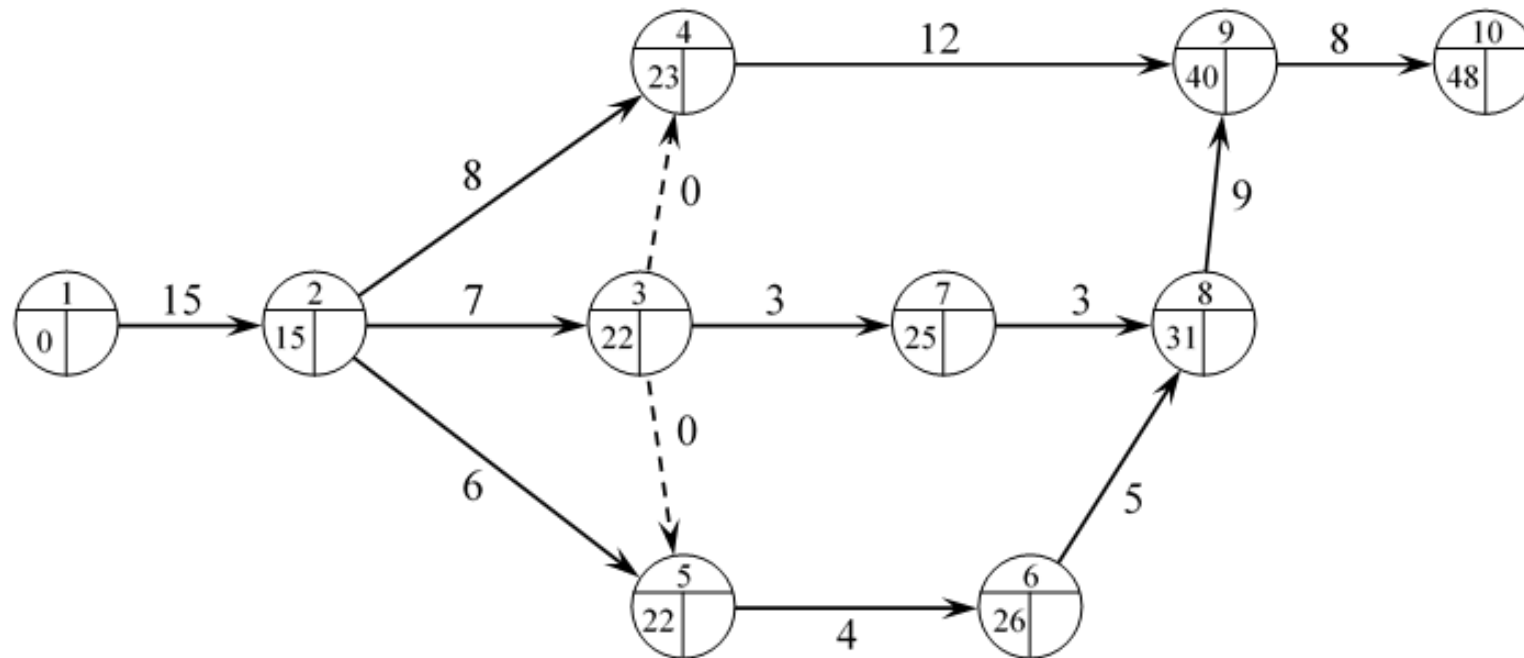
$$T = ET_n$$

Fig. 21 – Earliest event time for a node

# Project Management

## Critical Path Method

- Event analysis – forward pass



$$T = 48$$

Fig. 22 – Forward pass

# Project Management

## Critical Path Method

### Event analysis – backward pass

- The **latest event time** for a **node** is the latest time at which the event can occur without delaying the determined completion time of the project.
- Whereas the forward pass crosses the nodes in ascending order according to their numbers, backward pass goes from the finish of the project to its start in the opposite (descending) order.

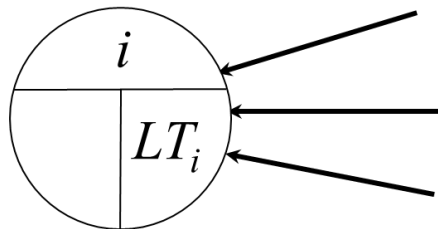


Fig. 23 – Latest event time for a node

- The **latest event time** for **completing a project** can be set in the planning process or can be considered as the earliest event time for completing a project:

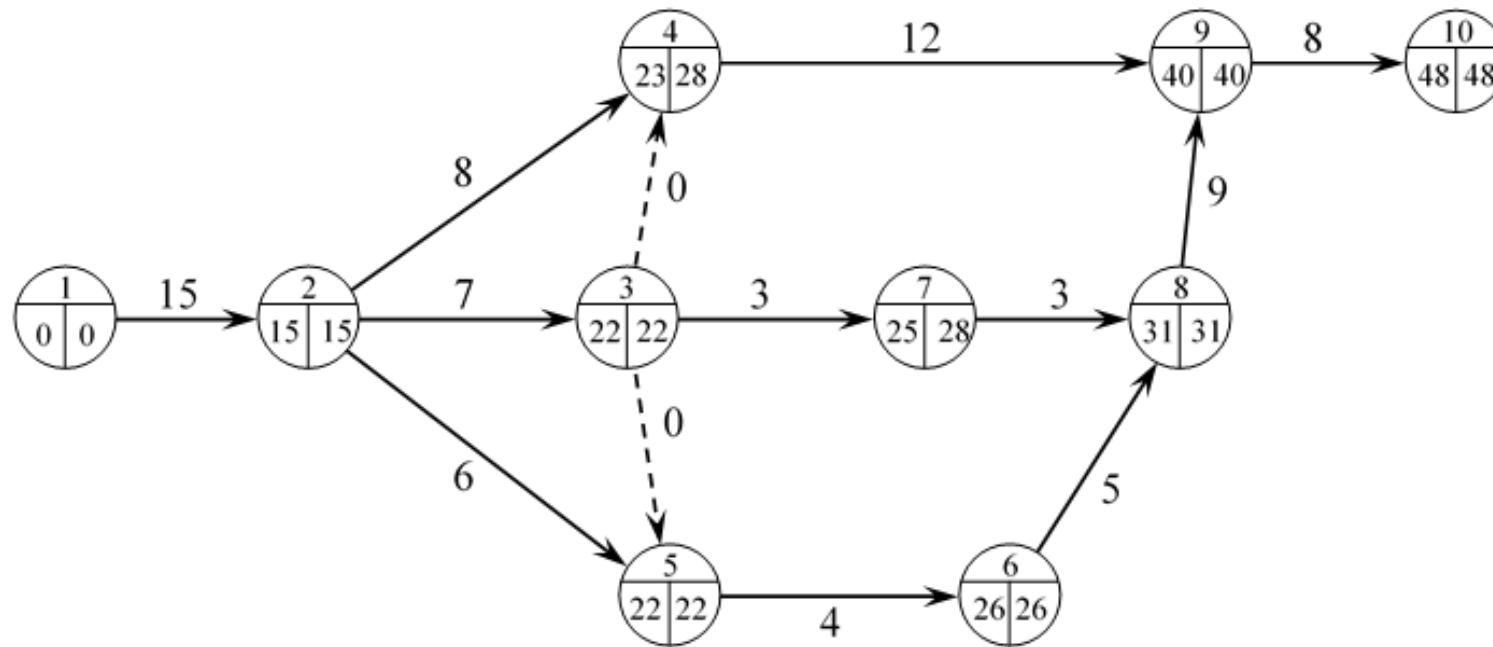
$$LT_n = T_{PL} \geq T$$

$$LT_i = \min_j (LT_j - t_{ij}) \quad i = n - 1, n - 2, \dots, 1$$

# Project Management

## Critical Path Method

- Event analysis – backward pass



- Deadline  $T_{PL} = 48$

Fig. 24 – Backward pass



# Project Management

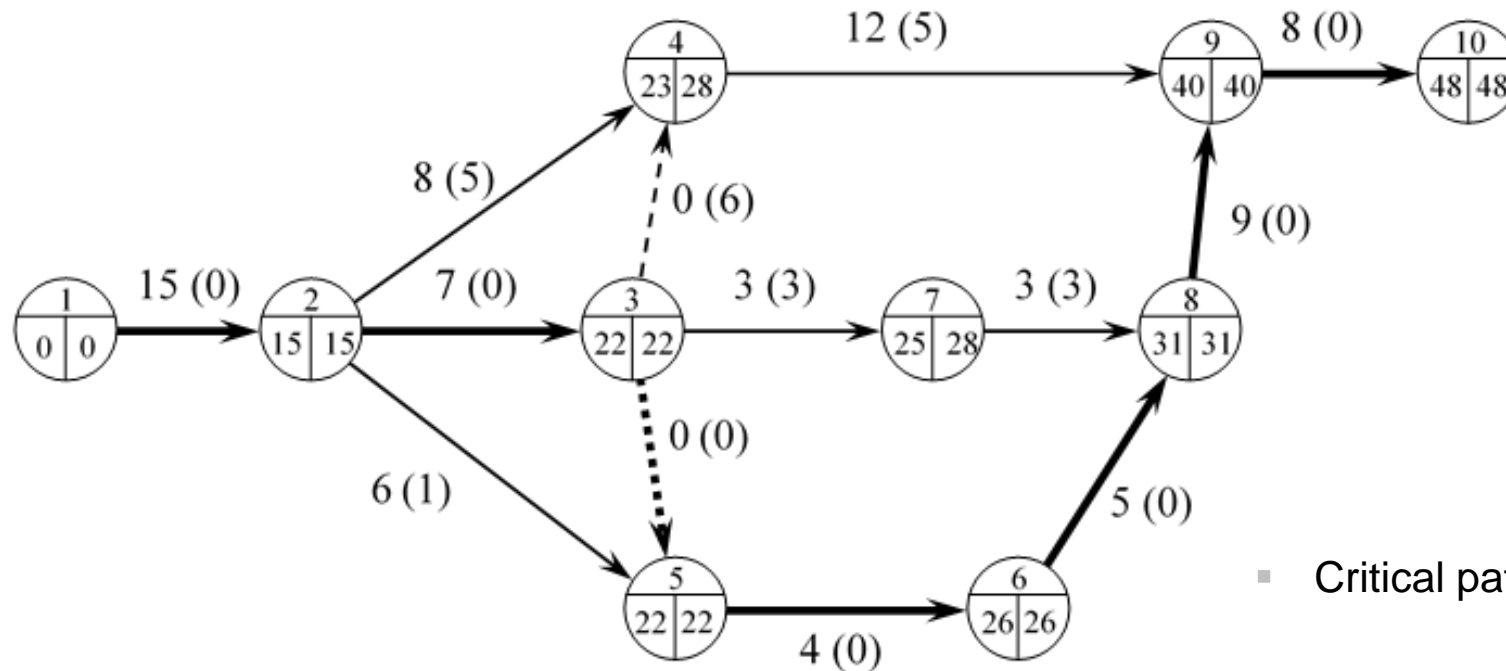
## Critical Path Method

- **Activity analysis**
  - Calculation of **total floats** (slacks) for all activities:  $TF_{ij} = (LT_j - ET_i - t_{ij})$
  - **Critical** activities:  $TF_{ij} = T_{PL} - T$
  - **Non-critical** activities:  $TF_{ij} > T_{PL} - T$
  - **Total floats** give three possibilities of delay of each activity (to meet deadline  $T_{PL}$ ):
    1. A **start** of the **activity** can be **postponed**.
    2. **Duration** of the **activity** can be **extended** (the activity can be even interrupted).
    3. The **combination** of possibilities 1 and 2.

# Project Management

## Critical Path Method

- Activity analysis



- Critical path = A – D – (D<sub>1</sub>) – E – F – J – K

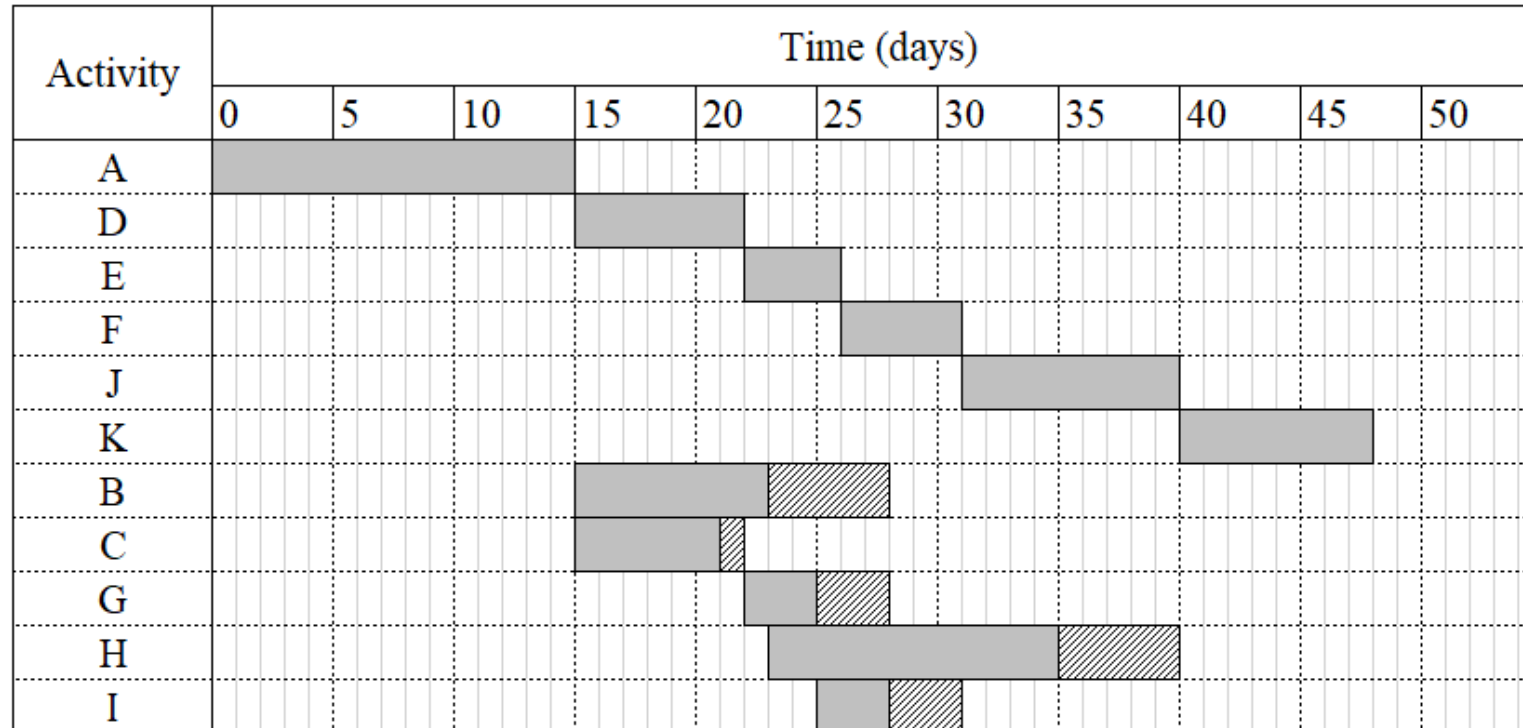
Fig. 25 – Critical path



# Project Management

## Critical Path Method

- Gantt chart



- Deadline: December 12
- Start of the project: October 3

Fig. 26 – Gantt chart

# Project Management

## PERT (Program Evaluation and Review Technique)

- Assumptions

- Probabilistic duration time of each activity.
- $\beta$ -distribution values:
  - $a_{ij}$  - optimistic estimate as the shortest possible duration of the activity,
  - $b_{ij}$  - pessimistic estimate as the longest duration,
  - $m_{ij}$  - most likely estimate as the duration, which assumes most frequent conditions.

- Mean of completion time

$$\mu_{ij} = \frac{a_{ij} + 4m_{ij} + b_{ij}}{6}$$

- Standard deviation of completion time

$$\sigma_{ij} = \frac{b_{ij} - a_{ij}}{6}$$

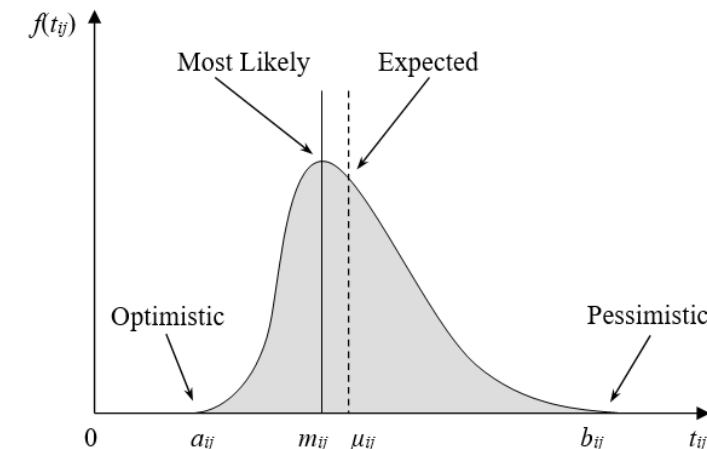


Fig. 27 – Density function of  $\beta$ -distribution



# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example**

- In project there are introduced the following estimations of activities duration times.

Tab. 25 – Direct marketing project – input data for the PERT

Activity	Activity Description	$a_{ij}$	$m_{ij}$	$b_{ij}$	Immediate Predecessors
A	Songs Selection	11	15	19	None
B	Mastering	7	8	9	A
C	Promotion Material Elaborating	5	6	7	A
D	Customers Analysis	5	7	9	A
E	Promotion Material Production	2	3	10	C, D
F	Promotion Material to Printing House	3	4	11	E
G	Customers Selection	2	3	4	D
H	Make CD Copies	8	11	20	B, D
I	Data to Printing House	2	3	4	G
J	Laser Print	6	8	16	F, I
K	Mailing	6	8	10	H, J



# Project Management

## PERT (Program Evaluation and Review Technique)

- **Method description**

- Construction of the network.
- Calculation of expected completion times (and standard deviations of completion times).
- Application of the CPM, determination of critical path (CP).

- **Expected project duration time**

$$M = \sum_{(i,j) \in CP} \mu_{ij}$$

- **Variance of the project duration time**

$$\sigma^2 = \sum_{(i,j) \in CP} \sigma_{ij}^2$$

- **Standard deviation of the project duration time**

$$\sigma = \sqrt{\sigma^2}$$



# Project Management

## PERT (Program Evaluation and Review Technique)

- **Method description**

- Probability analysis:

- **What is the probability of project completion within a desired time  $T_D$ ?**

- Transformation to standard normal distribution  $N(0,1)$ :

$$z = \frac{T_D - M}{\sigma}$$

- **What is the completion time  $T_D$  in which the project will be finished with a desired probability  $p$ ?**

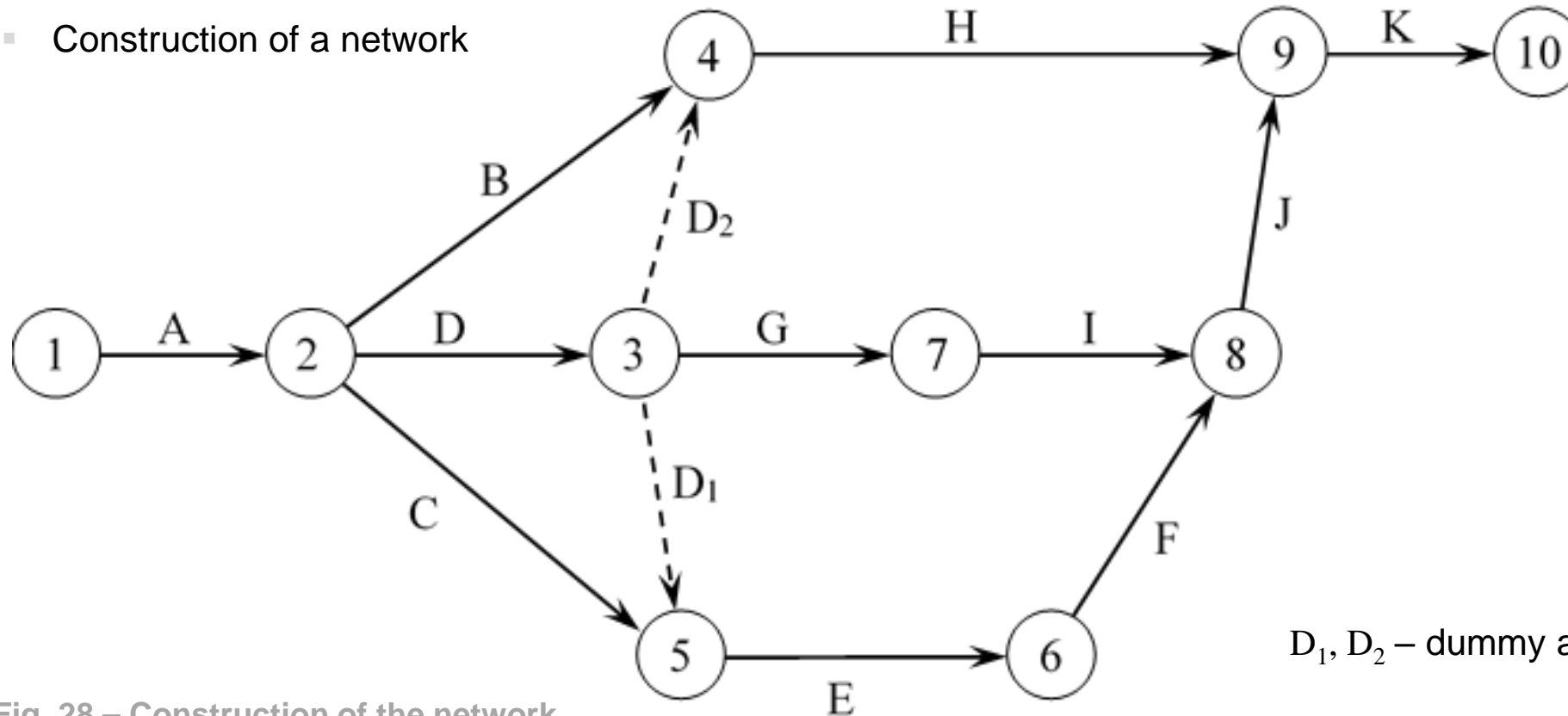
$$T_D = M + z_p \sigma$$

# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example**

- Construction of a network



$D_1, D_2$  – dummy activities

Fig. 28 – Construction of the network



# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example**
  - Calculation of the mean values of duration time

Tab. 26 – Direct marketing project – mean values of duration times

Activity	Activity Description	$a_{ij}$	$m_{ij}$	$b_{ij}$	$\mu_{ij}$
A	Songs Selection	11	15	19	15
B	Mastering	7	8	9	8
C	Promotion Material Elaborating	5	6	7	6
D	Customers Analysis	5	7	9	7
E	Promotion Material Production	2	3	10	4
F	Promotion Material to Printing House	3	4	11	5
G	Customers Selection	2	3	4	3
H	Make CD Copies	8	11	20	12
I	Data to Printing House	2	3	4	3
J	Laser Print	6	8	16	9
K	Mailing	6	8	10	8

# Project Management



## PERT (Program Evaluation and Review Technique)

- Example

- Application of the CPM

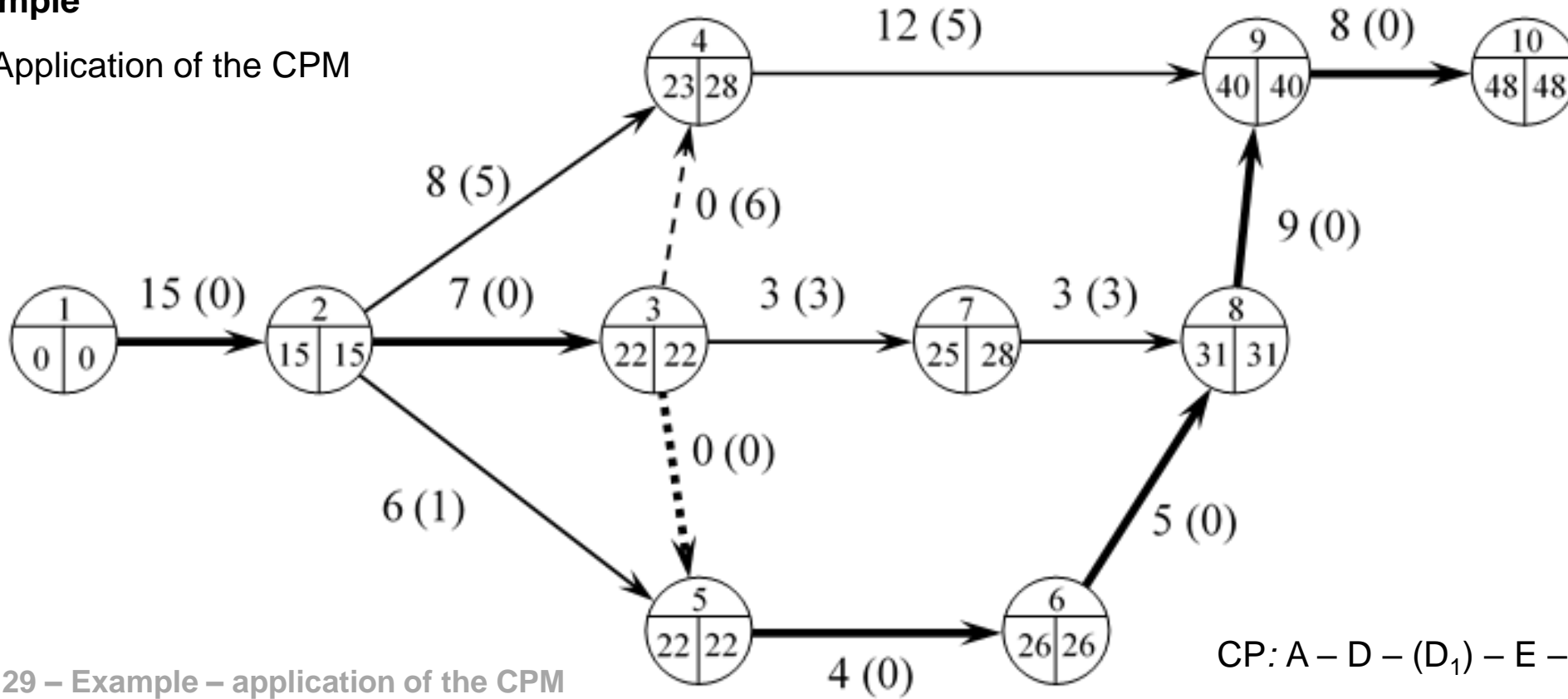


Fig. 29 – Example – application of the CPM





# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example**
  - Calculation of the standard deviations of duration time

Tab. 27 – Example

Activity	Activity Description	$a_{ij}$	$m_{ij}$	$b_{ij}$	$\mu_{ij}$	$\sigma_{ij}$
A	Songs Selection	11	15	19	15	8/6
D	Customers Analysis	5	7	9	7	4/6
E	Promotion Material Production	2	3	10	4	8/6
F	Promotion Material to Printing House	3	4	11	5	8/6
J	Laser Print	6	8	16	9	10/6
K	Mailing	6	8	10	8	4/6



# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example**

- Expected project duration time

$$M = 15 + 7 + 4 + 5 + 9 + 8 = 48$$

- Variance of the project duration time

$$\sigma^2 = (8/6)^2 + (4/6)^2 + (8/6)^2 + (8/6)^2 + (10/6)^2 + (4/6)^2 = 9$$

- Standard deviation of the project duration time

$$\sigma = 3$$

# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example – probability analysis**
  - What is the probability of project completion within a desired time  $T_D = 45$  days?

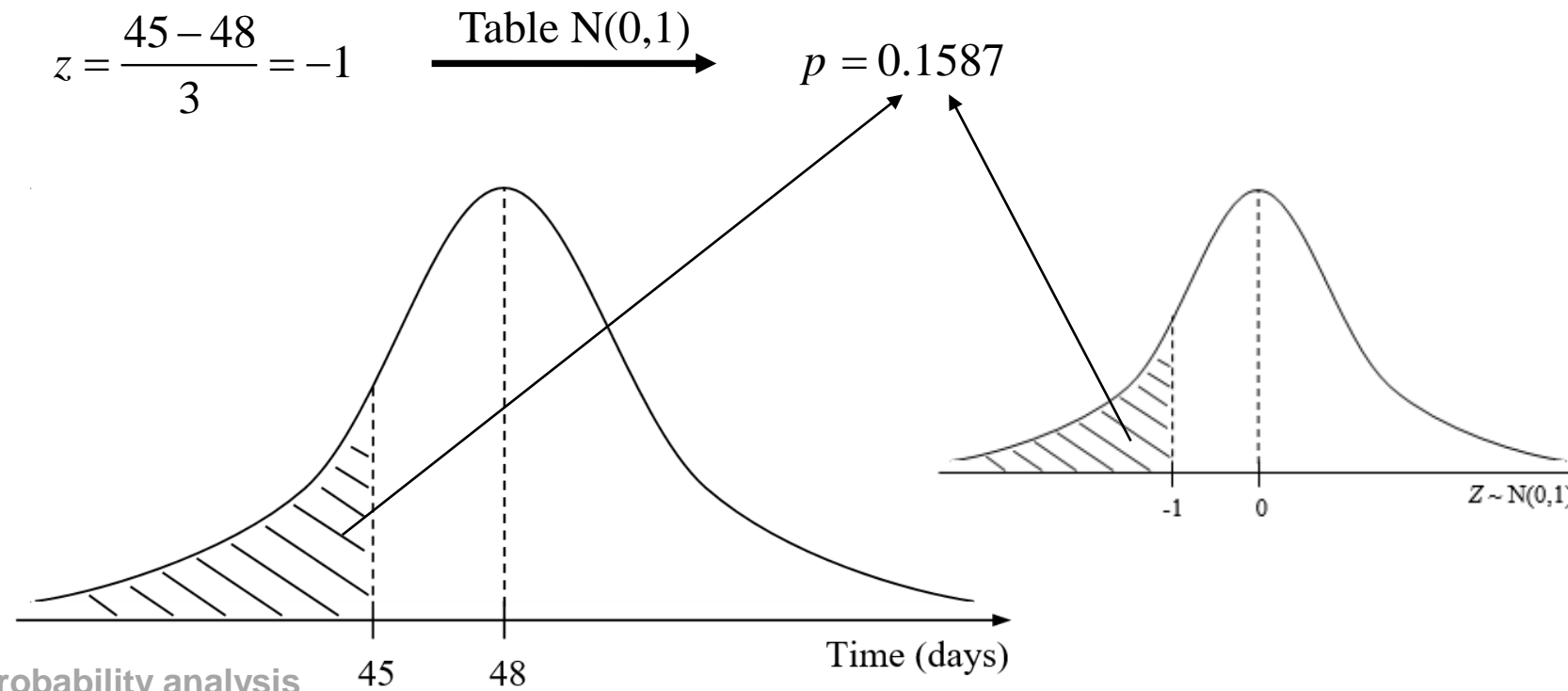


Fig. 30 – Probability analysis

# Project Management

## PERT (Program Evaluation and Review Technique)

- **Example – probability analysis**

- Set a deadline by which the project will have been completed with 95% confidence.

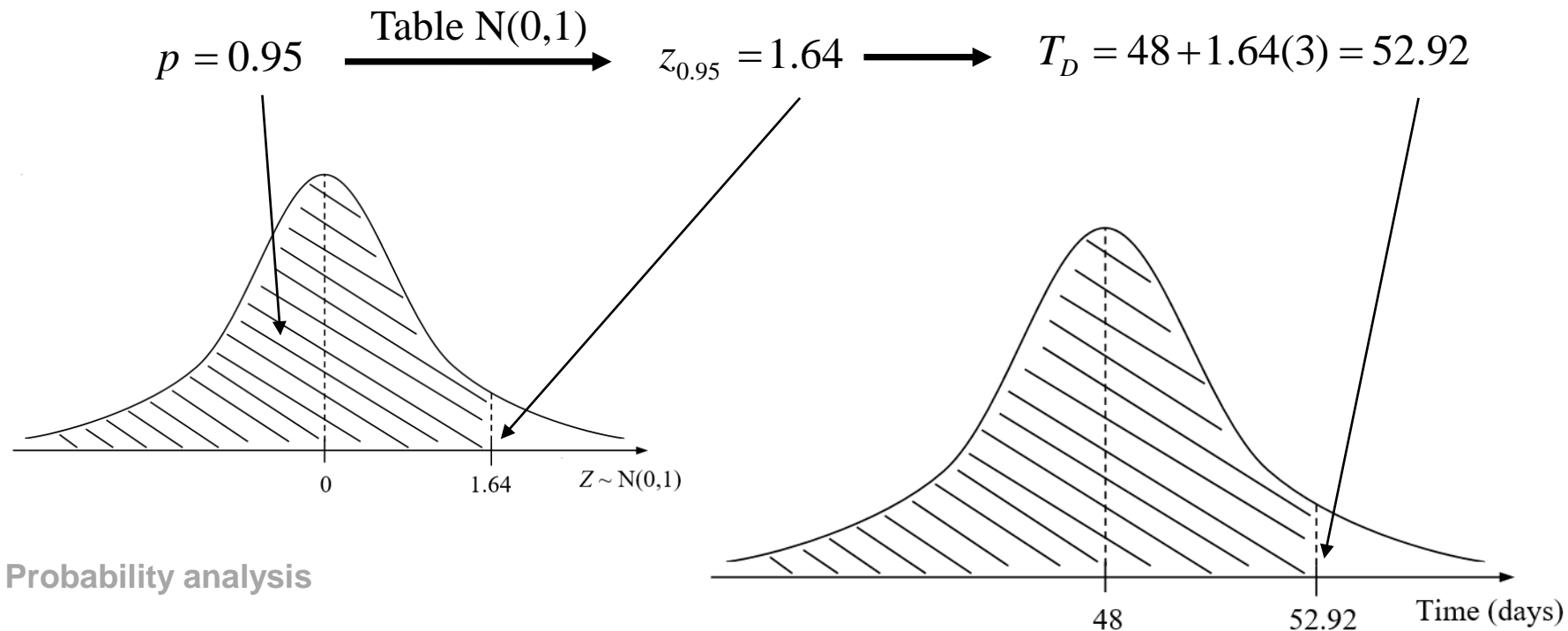
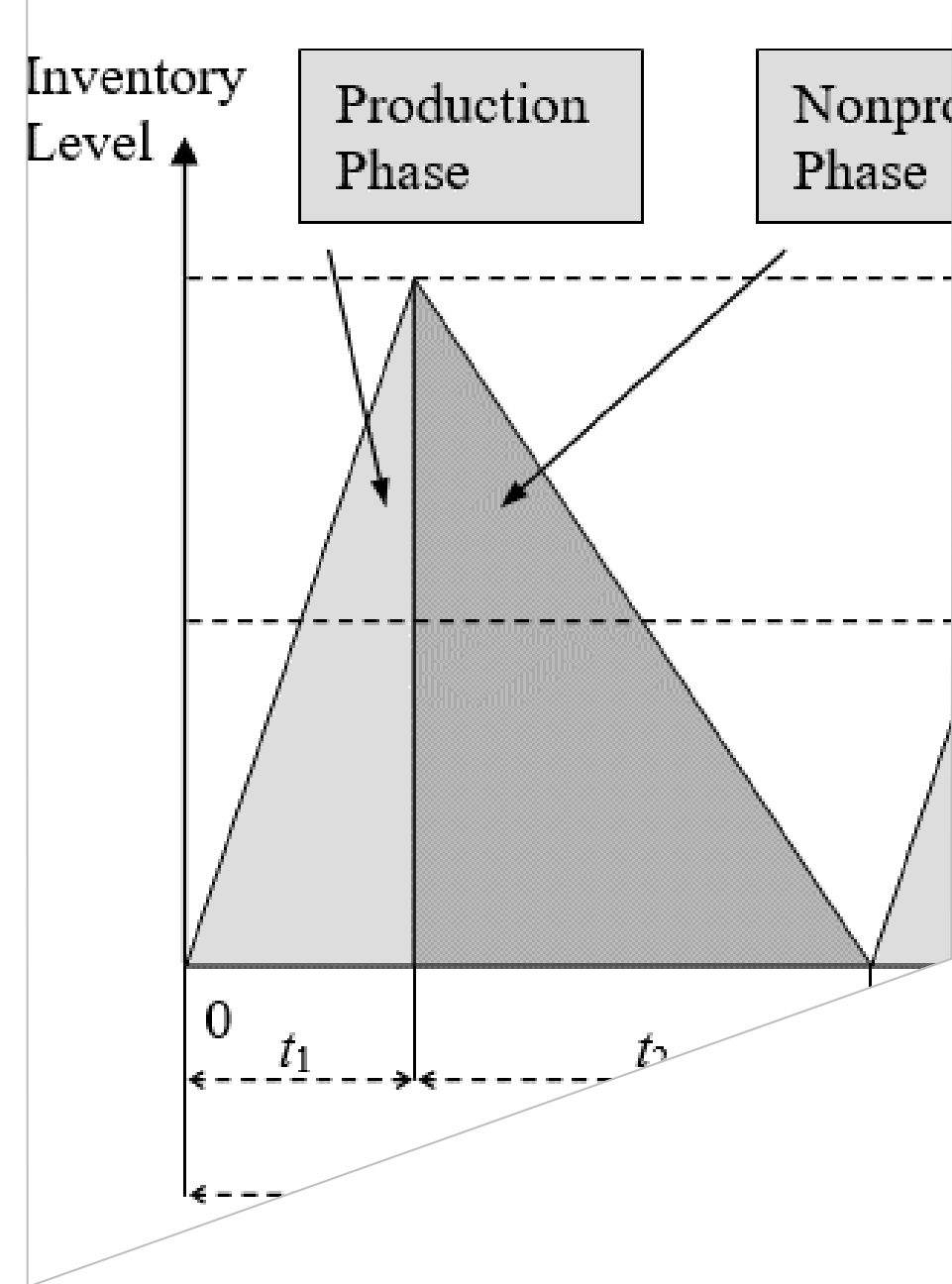


Fig. 31 – Probability analysis

5

# Inventory Models





# Inventory Models

## Introduction

- **Inventory**
  - Stored for **use** in **future** (fast and flexible availability, cost minimization).
  - **Examples** of inventories:
    - raw material,
    - finished goods,
    - semi-finished products,
    - spare parts.
- **Inventory management**
  - **How much** to order?
  - **When** to order?
  - **Objective** – minimization of total cost.



# Inventory Models

## Introduction

- **Partial inventory cost**
  - **Holding & carrying cost**
    - storage cost (place),
    - store keeping operations (movement),
    - insurance & taxes,
    - interest (investment),
    - spoilage & obsolescence.
  - **Ordering cost**
    - transport,
    - commission,
    - customs charge,
    - insurance.



# Inventory Models

## Introduction

- **Inventory level**
  - **Available size** of the inventory (a number of stocked items, amount of stocked material, etc.).
- **Demand**
  - **Rate of demand** – amount of items or material required within a period.
- **Depletion**
  - **Depletion rate** – amount of stocked items or material moved from the warehouse, it is derived from the rate of demand.
  - **Decreasing** inventory level.
- **Replenishment**
  - **Movement** of delivered items or material **into** the **warehouse**.
  - **Increasing** inventory level.



# Inventory Models

## Introduction

- **Reordering**
  - **Lead time** – time interval between placing the order and delivery (receiving shipment).
  - **Reorder point** – inventory level at reordering.

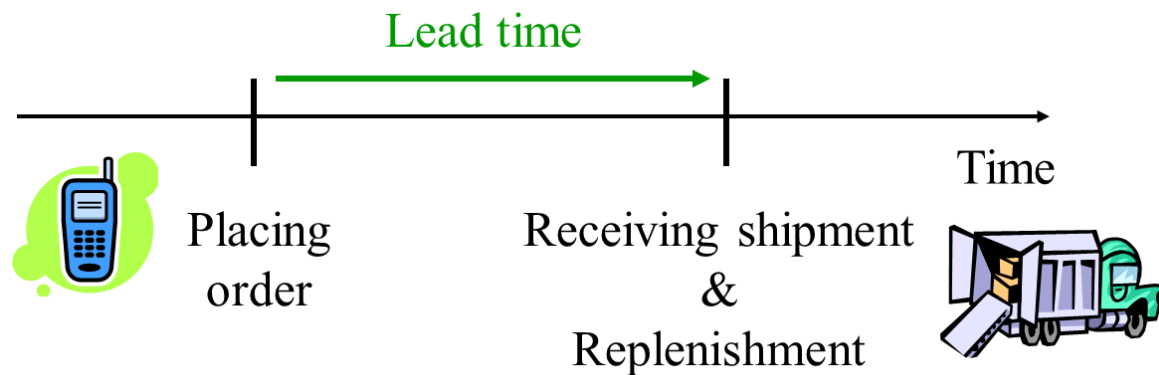


Fig. 32 – Reordering process

# Inventory Models



## Introduction

- **Shortage (stockout)**
  - Empty warehouse leads to **unsatisfied demand** (if there is no requirement during stockout period this is not registered as the shortage).

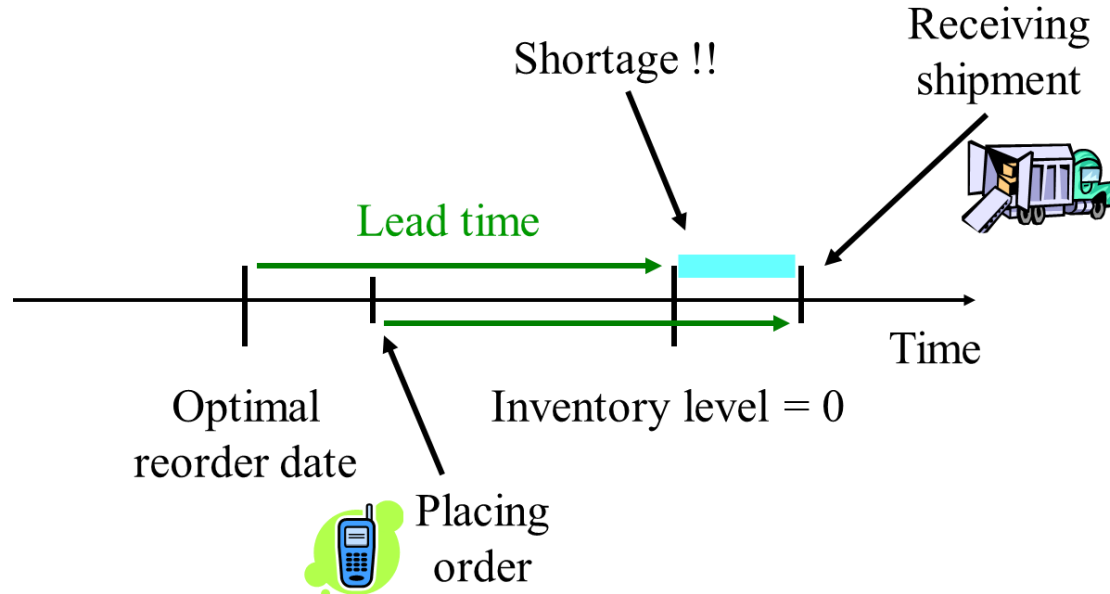


Fig. 33 – Shortage



# Inventory Models

## Introduction

- **Safety stock**
  - In case of **probabilistic demand**.
  - **Buffer** is being built to **prevent shortage**. Generally, it is not possible to completely eliminate shortage (it depends on the type of probability distribution of demand).
- **Deterministic models**
  - **All parameters** are known **with certainty** (especially rate of demand and lead time).
- **Probabilistic models**
  - **Some parameters** are the values of **random variables**.

# Inventory Models

## Introduction

- Demand classification

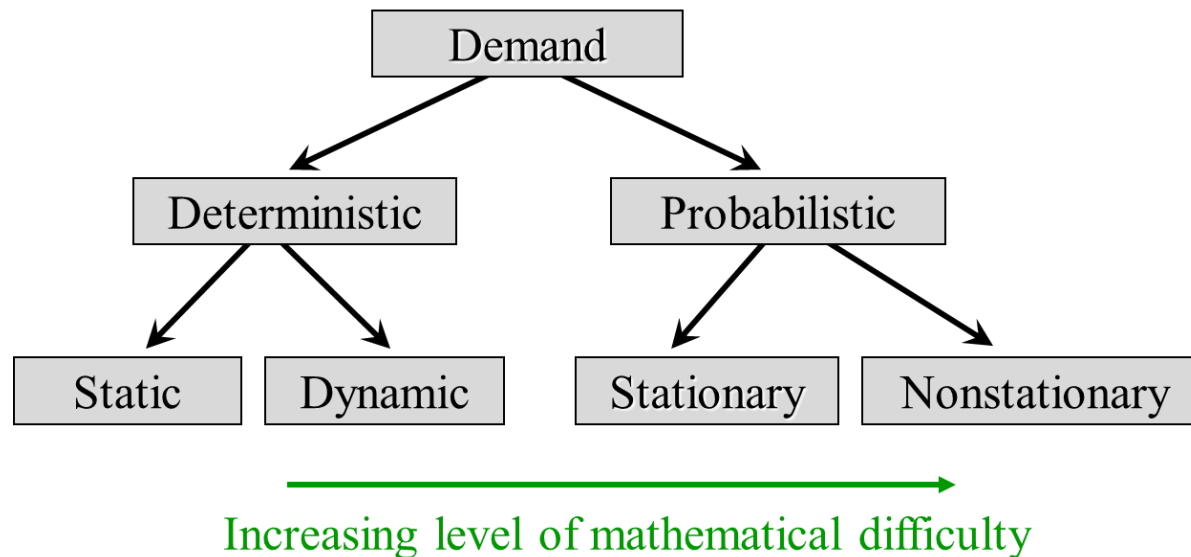


Fig. 34 – Demand classification

- **Static demand**
  - Rate of demand is known with certainty and it is constant in time.
- **Dynamic demand**
  - Rate of demand is known with certainty and it is not constant in time.
- **Stationary demand**
  - Probability distribution is unchanged over time.
- **Nonstationary demand**
  - Probability distribution varies in time.



# Inventory Models

## Economic Order Quantity Model

- **Inventory management**
  - How much to order?
  - When to order?
  - What is the total cost?
  - What is the maximum inventory level?
  - What is the optimum length of the inventory cycle?



# Inventory Models

## Economic Order Quantity Model

### Assumptions

- single **item**,
- deterministic **demand** (static),
- deterministic **lead time** (constant),
- uniform **depletion** of the inventory,
- constant **order quantity**,
- **purchasing cost** is independent of the order quantity (no quantity discounts),
- **replenishment** at one time,
- no **shortages**, no **surpluses** (delivery exactly at the time of complete depletion).

# Inventory Models

## Economic Order Quantity Model

- Inventory cycles

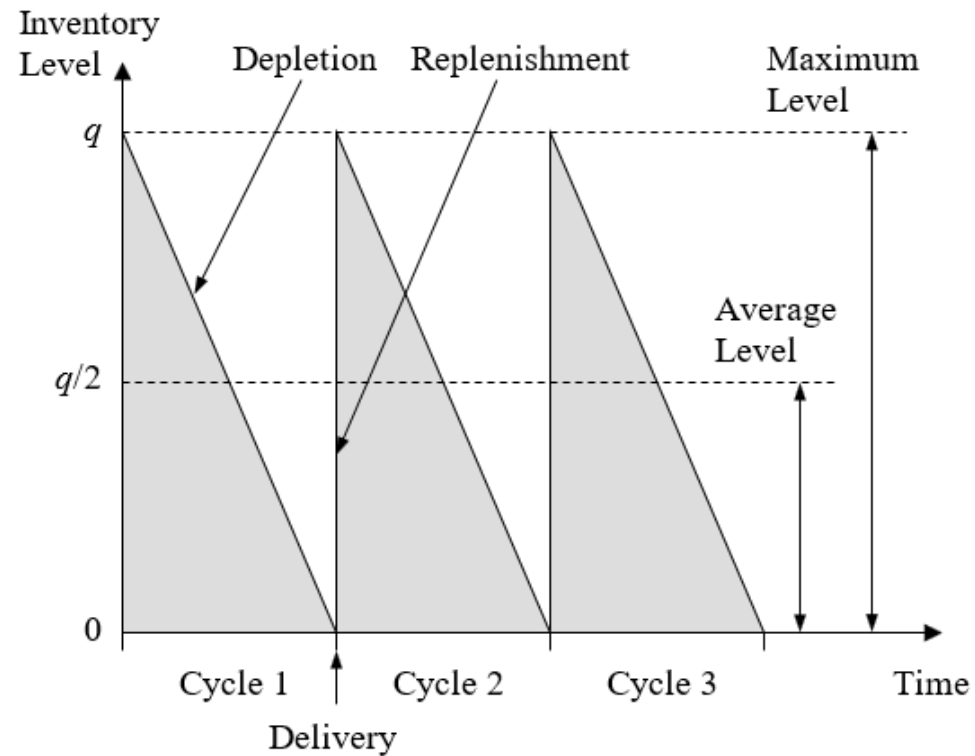


Fig. 35 – Inventory cycles in EOQ Model



# Inventory Models

## Economic Order Quantity Model

### ▪ Example

- The private brewery produces **monthly 4 000 hl** of beer.
- **25% of the production** is planned to be filled into **glass bottles**. The empty bottles are stored in **plastic cases** (each case contains **20 bottles**) and the **average annual holding cost** per **case** is **20 CZK**.
- The carrier, transporting the cases into the brewery's store, charges a fixed cost associated with each **order** for **11 000 CZK**. In addition, the brewery's own **fixed cost** of **1 000 CZK** per each order is necessary to be involved into the final calculation.
- The **lead time** between the placing each order and its delivery is **1/2 of month**. Since filling of the bottles is the uniform process the inventory depletion rate is uniform as well.
- Management of the brewery decided to analyze the inventory system in order to **minimize the total cost** associated with inventory replenishment and holding of the bottles in the store.





# Inventory Models

## Economic Order Quantity Model

### Input parameters and variables

- Annual demand  $Q = 120\,000$  cases
- Unit annual holding cost  $c_1 = 20$  CZK/case
- Ordering cost  $c_2 = 12\,000$  CZK/order
- Lead time  $d = 1/2$  of month =  $1/24$  of year
- Order quantity  $q$
- Number of orders within a year  $n$
- Length of inventory cycle  $t$
- Reorder point  $r$



# Inventory Models

## Economic Order Quantity Model

- **Total annual cost**

$$TC = HC + OC$$

$$q_{\max} = q$$

$$q_{\text{avg}} = \frac{q}{2}$$

$$HC = c_1 q_{\text{avg}} = c_1 \frac{q}{2}$$

$$n = \frac{Q}{q}$$

$$OC = c_2 n = c_2 \frac{Q}{q}$$

$$TC(q) = c_1 \frac{q}{2} + c_2 \frac{Q}{q}$$

$TC$  – total annual cost

$HC$  – total annual holding cost

$OC$  – total annual ordering cost

$q_{\max}$  – maximum inventory level

$q_{\text{avg}}$  – average inventory level

# Inventory Models

## Economic Order Quantity Model

- Total annual cost

Tab. 28 – Cost calculation for 3 inventory policies

	Policy I	Policy II	Policy III
Annual demand $Q$	120 000	120 000	120 000
Order quantity $q$	10 000	60 000	120 000
Annual holding cost per case $c_1$	20	20	20
Average inventory level $a_{avg} = q/2$	5 000	30 000	60 000
<b>Total annual holding cost <math>HC</math></b>	<b>100 000</b>	<b>600 000</b>	<b>1 200 000</b>
Ordering cost per order $c_2$	12 000	12 000	12 000
Number of orders $n = Q/q$	12	2	1
<b>Total annual ordering cost <math>OC</math></b>	<b>144 000</b>	<b>24 000</b>	<b>12 000</b>
<b>Total annual cost <math>TC</math></b>	<b>244 000</b>	<b>624 000</b>	<b>1 212 000</b>

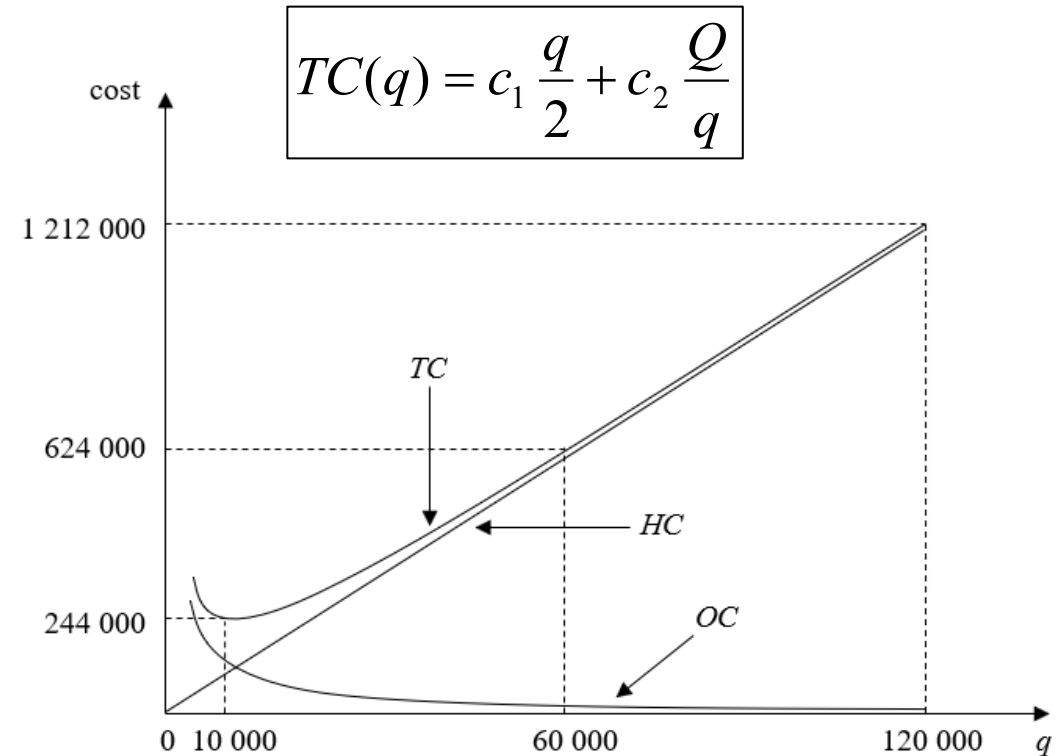


Fig. 36 – Cost charts for 3 inventory policies

# Inventory Models

## Economic Order Quantity Model

- Inventory cycles

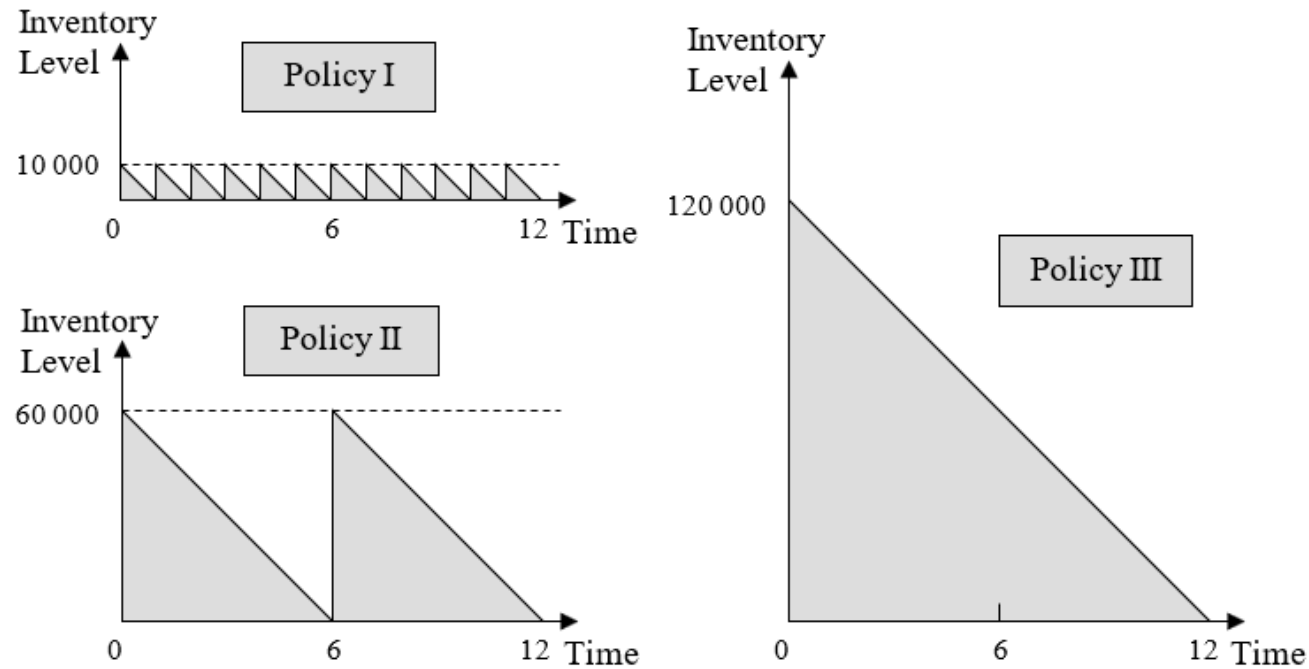


Fig. 37 – Inventory cycles for 3 inventory policies



# Inventory Models

## Economic Order Quantity Model

- **Optimum order quantity**

$$TC(q) = c_1 \frac{q}{2} + c_2 \frac{Q}{q} \rightarrow \min$$

$$\frac{dTC(q)}{dq} = \frac{c_1}{2} - \frac{c_2 Q}{q^2} = 0$$

$$q^* = \sqrt{\frac{2Qc_2}{c_1}}$$

$$q^* = \sqrt{\frac{2(120\,000)(12\,000)}{20}} = 12\,000 \text{ cases}$$

- **Optimum total annual cost**

$$TC^* = \sqrt{2Qc_1c_2}$$

$$TC^* = \sqrt{2(120\,000)(20)(12\,000)} = 240\,000 \text{ CZK}$$

# Inventory Models

## Economic Order Quantity Model

- Optimum order quantity, optimum total annual cost

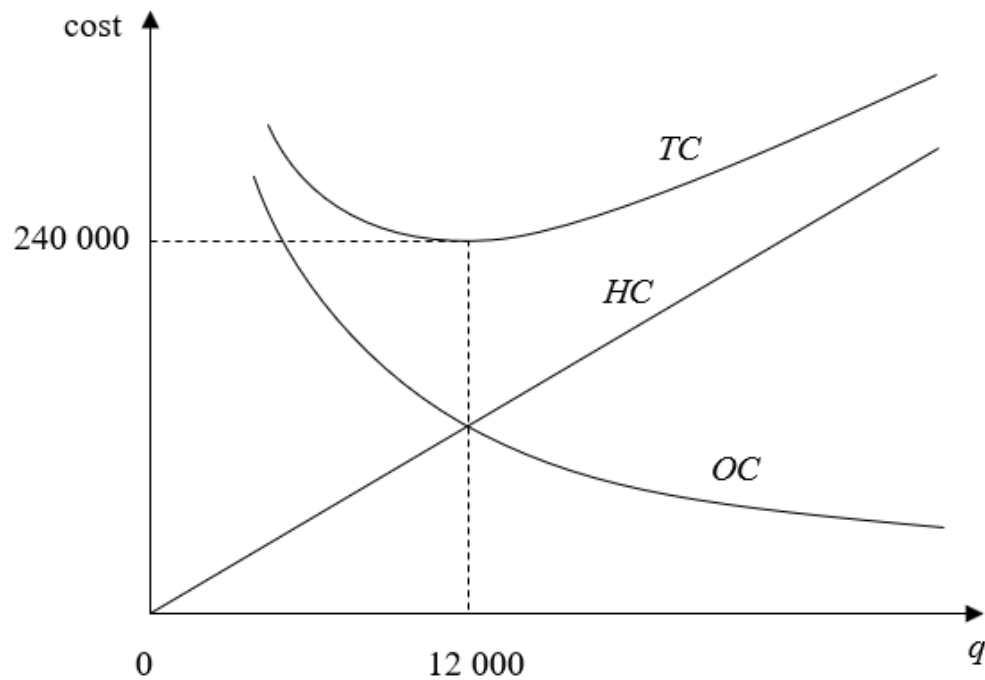


Fig. 38 – Optimum policy

# Inventory Models

## Economic Order Quantity Model

- Optimum length of the inventory cycle

$$t^* = \frac{1}{n^*} = \frac{q^*}{Q} = \sqrt{\frac{2c_2}{Qc_1}}$$

$t^* = 1/10$  of year

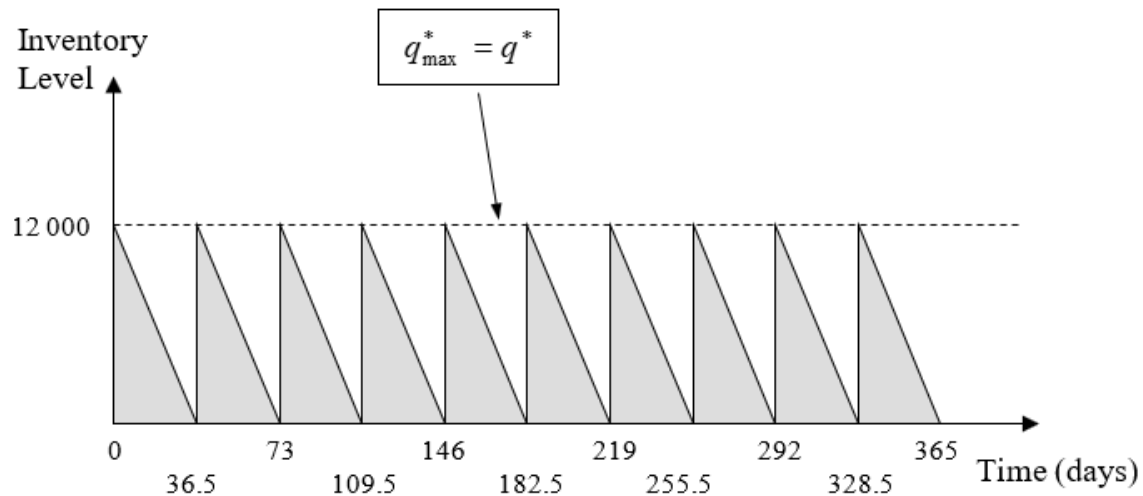


Fig. 39 – Optimum inventory cycles, maximum inventory level

# Inventory Models

## Economic Order Quantity Model

- Optimum reorder point

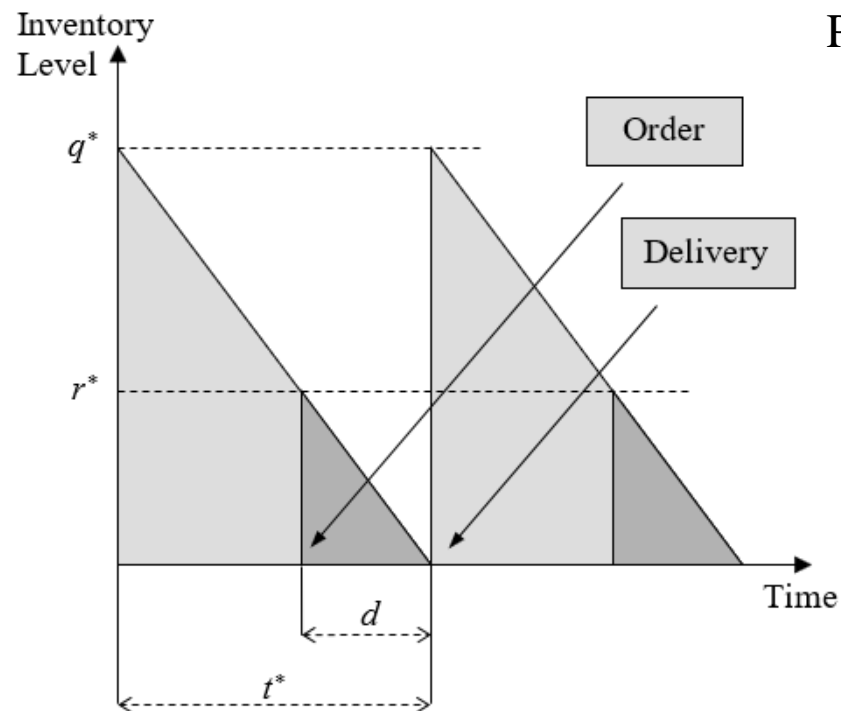


Fig. 40 – Optimum reorder point

Parallel triangles theorem:

$$\frac{r^*}{d} = \frac{q^*}{t^*}$$

$$r^* = \frac{dq^*}{t^*} = dQ$$

$$r^* = \frac{1}{24} 120\,000 = 5\,000 \text{ cases}$$

$$r^* = \frac{dq^*}{t^*} \text{ mod } q^* = dQ \text{ mod } q^*$$





# Inventory Models

## Economic Order Quantity Model

### ▪ Example

- Firm dealing with the distribution of coal realizes the strategy of regular **weekly orders** (suppose **50 weeks in year**).
- **Annual holding cost** is **20 CZK** per ton of coal, **ordering cost** is **800 CZK** per order.
- A **switch** to regular **two-weeks ordering strategy** did not cause any change in total annual cost.
- **Calculate** the **order quantity** and **total annual cost** for previous and **current strategy**.
- **Find** the **optimum strategy**.



# Inventory Models

## Economic Order Quantity Model

- **Input parameters and variables**

- Unit annual holding cost
- Ordering cost
- Number of orders for strategy 1
- Number of orders for strategy 2
- Order quantity in strategy 1
- Order quantity in strategy 2
- Total annual cost in strategy 1
- Total annual cost in strategy 2

$$c_1 = 20 \text{ CZK/ton}$$

$$c_2 = 800 \text{ CZK/order}$$

$$n_1 = 50/\text{year}$$

$$n_2 = 25/\text{year}$$

$$q$$

$$2q$$

$$TC_1$$

$$TC_2$$



# Inventory Models

## Economic Order Quantity Model

- Order quantity and total annual cost for both strategies

$$TC_1 = TC_2$$

$$c_1 \frac{q}{2} + n_1 c_2 = c_1 \frac{2q}{2} + n_2 c_2$$

$$20 \frac{q}{2} + 50.800 = 20 \frac{2q}{2} + 25.800$$

$$q = 2000 \text{ tons}$$

$$2q = 4000 \text{ tons}$$

$$TC_1 = TC_2 = 60000 \text{ CZK}$$

$$Q = 50.2000 = 100000 \text{ tons}$$

- Optimum order quantity and optimum total annual cost

$$q^* = \sqrt{\frac{2.100000.800}{20}} \doteq 2828 \text{ tons}$$

$$TC^* = \sqrt{2.100000.20.800} \doteq 56570 \text{ CZK}$$



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- **Inventory management**
  - What is the optimum lot size?
  - What is the maximum level of the inventory?
  - What is the total cost?
  - How long does the production process take?
  - When to start the preparation process (setup) for the production?



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

### Assumptions

- single **item**,
- deterministic **demand** (static),
- deterministic **lead time** (constant),
- uniform **depletion** of the inventory,
- constant **lot size**,
- **replenishment** within production phase,
- no **shortages**, no **surpluses** (production phase starts exactly at the time of complete depletion).

# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Inventory cycles

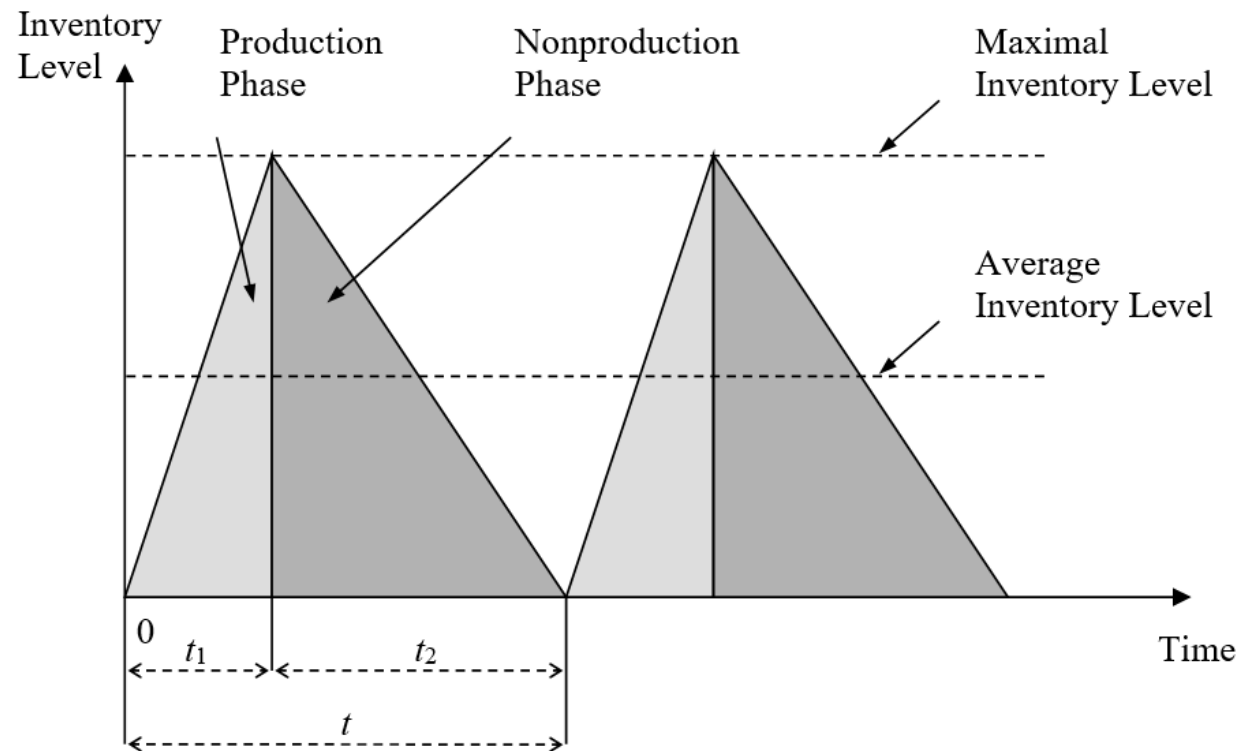


Fig. 41 – Inventory cycles in POQ Model



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- **Inventory cycles**
  - Production phase
    - **production** (production rate),
    - **demand** (demand rate),
    - **replenishment**.
  - Nonproduction (depletion) phase
    - **demand** (demand rate),
    - **depletion**.

production rate > demand rate



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

### ▪ Example

- The private brewery produces **monthly 4 000 hl** of beer.
- **25% of the production** is planned to be filled into **glass bottles**. The empty bottles are stored in **plastic cases** (each case contains **20 bottles**) and the **average annual holding cost per case** is **20 CZK**.
- **Empty bottles** are processed on the **cleaning line**, **daily output** is **8 000 bottles**.
- **Setup cost** was calculated to **12 000 CZK** per **one successive cleaning process**.
- Preparation of the **cleaning line** takes **1/2 of month** (lead time).
- The brewery's management wants to determine the size of cleaning batch to **minimize the total annual cost**.



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

### Example

- The private brewery produces **monthly 4 000 hl** of beer.
- **25% of the production** is planned to be filled into **glass bottles**. The empty bottles are stored in **plastic cases** (each case contains **20 bottles**) and the **average annual holding cost per case** is **20 CZK**.
- **Empty bottles** are processed on the **cleaning line**, **daily output is 8 000 bottles**.
- **Setup cost** was calculated to **12 000 CZK** per **one successive cleaning process**.
- Preparation of the **cleaning line** takes **1/2 of month** (lead time).
- The brewery's management wants to determine the size of cleaning batch to **minimize the total annual cost**.

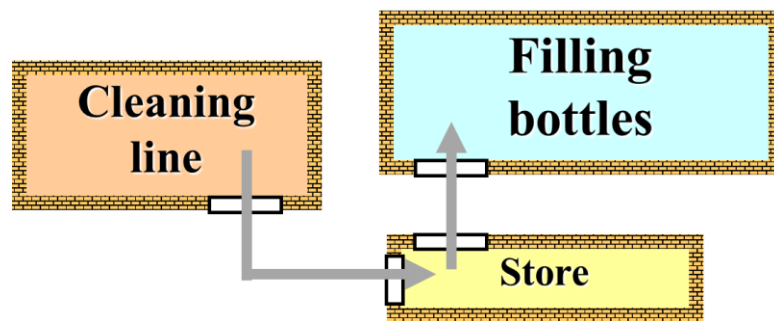


Fig. 42 – Production phase

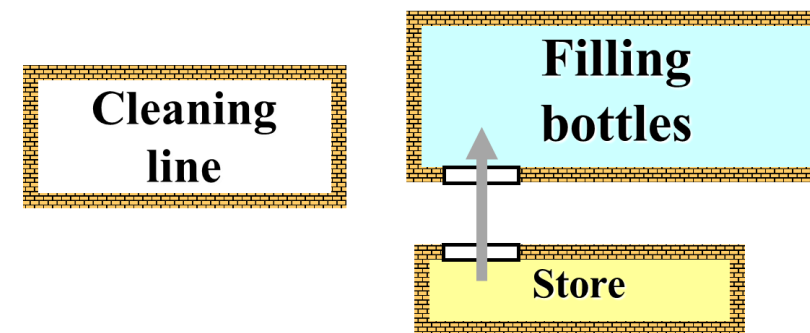


Fig. 43 – Nonproduction phase



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

### Input parameters and variables

- Annual demand  $Q = 120\ 000$  cases
- Unit annual holding cost  $c_1 = 20$  CZK/case
- Fixed setup cost per cleaning lot  $c_2 = 12\ 000$  CZK/lot
- Lead time  $d = 1/2$  of month =  $1/24$  of year
- Production rate  $p = 146\ 000$  cases per year
- Demand rate  $h = 120\ 000$  cases per year
- Production lot size  $q$
- Number of lots within a year  $n$
- Length of inventory cycle  $t$
- Length of production period  $t_1$
- Length of depletion period  $t_2$
- Starting setup point  $r$



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Total annual cost

$$TC = HC + SC$$

$$q = pt_1$$

$$q_{\max} = pt_1 - ht_1 = (p - h)t_1 = \frac{p - h}{p} q$$

$$q_{\text{avg}} = \frac{q_{\max}}{2} = \frac{p - h}{p} \frac{q}{2}$$

$$HC = c_1 q_{\text{avg}} = c_1 \frac{p - h}{p} \frac{q}{2}$$

$$n = \frac{Q}{q}$$

$$SC = c_2 n = c_2 \frac{Q}{q}$$

$$TC(q) = c_1 \frac{p - h}{p} \frac{q}{2} + c_2 \frac{Q}{q}$$

$TC$  – total annual cost

$HC$  – total annual holding cost

$SC$  – total annual setup cost

$q_{\max}$  – maximum inventory level

$q_{\text{avg}}$  – average inventory level

# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Optimum lot size

$$TC(q) = c_1 \frac{p-h}{p} \frac{q}{2} + c_2 \frac{Q}{q} \rightarrow \min$$

$$\frac{dTC(q)}{dq} = \frac{c_1}{2} \frac{p-h}{p} - \frac{c_2 Q}{q^2} = 0$$

$$q^* = \sqrt{\frac{2Qc_2}{c_1}} \sqrt{\frac{p}{p-h}}$$

$$q^* = \sqrt{\frac{2(120\,000)(12\,000)}{20}} \sqrt{\frac{146\,000}{146\,000 - 120\,000}} \doteq 28\,436.16 \text{ cases.}$$



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Optimum total annual cost

$$TC^* = \sqrt{2Qc_1c_2} \sqrt{\frac{p-h}{p}}$$

$$TC^* = \sqrt{2(120\,000)(20)(12\,000)} \sqrt{\frac{146\,000 - 120\,000}{146\,000}} \doteq 101\,279.49 \text{ CZK.}$$



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Optimum length of the production period

$$\boxed{t_1^* = \frac{q^*}{p}} \quad t_1^* = 0.1948 \text{ years} = 71.1 \text{ days}$$

- Optimum length of the depletion period

$$\boxed{t_2^* = \frac{q_{\max}^*}{h} = \frac{p-h}{ph} q^*} \quad t_2^* \doteq 0.0422 \text{ years} = 15.4 \text{ days}$$

- Optimum length of the inventory cycle

$$\boxed{t^* = t_1^* + t_2^*} \quad t^* \doteq 0.1948 + 0.0422 = 0.237 \text{ years} = 86.5 \text{ days}$$

# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- Optimum starting setup point

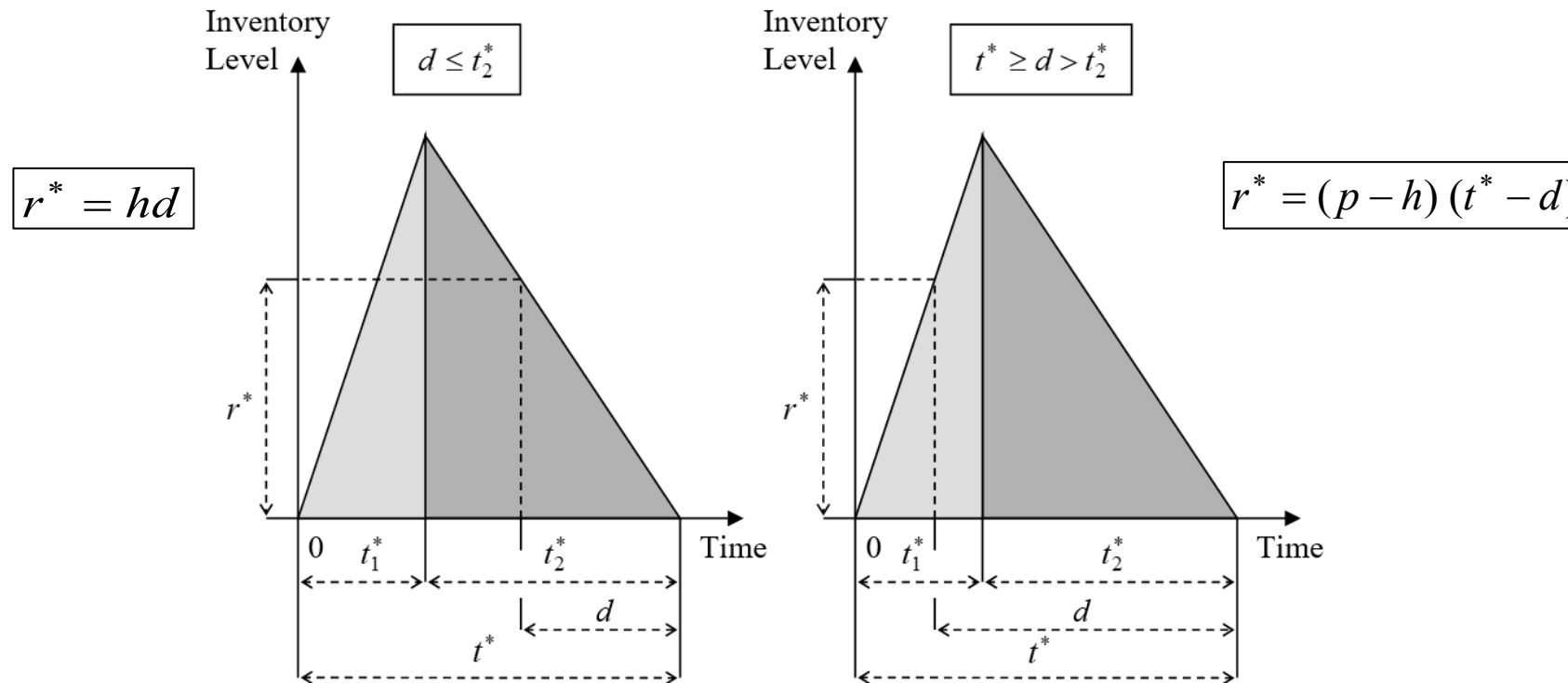


Fig. 44 – Optimum starting setup point



# Inventory Models

## Economic Production Lot Size Model (Production Order Quantity Model)

- **Optimum starting setup point**

$$d = 1/24 \doteq 0.0417 < t_2^* \doteq 0.0422$$

$$r^* = hd = 5\,000 \text{ cases}$$

- **Optimum maximal inventory level**

$$\boxed{q_{\max}^* = ht_2^*} \quad q_{\max}^* \doteq 5064 \text{ cases}$$





# Inventory Models

## Single-Period Decision Model

- **Assumptions**
  - single item,
  - probabilistic demand,
  - only one order in time period (no reorder is possible),
  - two situations at the end of period:
    - surplus,
    - stockout.
- **Examples of seasonal and perishable items**
  - newspapers (newsboy problem), bread, flowers, fruits, seasonal clothing, Christmas trees.



# Inventory Models

## Single-Period Decision Model

### ▪ Example

- A bakery department's manager of a new supermarket should optimize **everyday order** of rolls.
- The **supermarket buys** a **roll for 1 CZK** and **sells it to the final consumers** for **2 CZK**. If, in the evening some rolls remain in the store, the bakery department changes them into crumbs that will be sold later for 12 CZK per sack. For filling one sack of crumbs 20 rolls are needed.
- From the experience of opening comparable supermarkets in comparable areas, the supermarket's analyst recommends to consider the normal probability distribution of the **daily demand** with a mean of **10 000 rolls** and a standard **deviation** of **500 rolls**.



# Inventory Models

## Single-Period Decision Model

- **Input parameters and variables**

- mean value of daily demand
- standard deviation of daily demand
- purchase cost
- selling price
- salvage value
- real daily demand for rolls
- daily quantity of ordered rolls
- probability with which no stockout occurs (service level)

$$\mu = 10\,000 \text{ rolls}$$

$$\sigma = 500 \text{ rolls}$$

$$1 \text{ CZK/roll}$$

$$2 \text{ CZK/roll}$$

$$12/20 = 0.6 \text{ CZK/roll}$$

$$Q$$

$$q$$

$$p$$



# Inventory Models

## Single-Period Decision Model

- **Marginal loss**

- The real demand is **less** than the order quantity ( $Q < q$ )

$$ML = \text{purchase cost} - \text{salvage value}$$

$$ML = 1 - 0.6 = 0.4 \text{ CZK/roll}$$

- **Expected marginal loss**

$$p(ML)$$

- **Marginal profit loss**

- The real demand is **greater** than the order quantity ( $Q > q$ )

$$MPL = \text{selling price} - \text{purchase cost}$$

$$MPL = 2 - 1 = 1 \text{ CZK/roll}$$

- **Expected marginal profit loss**

$$(1 - p)(MPL)$$



# Inventory Models

## Single-Period Decision Model

- Optimum service level

$$p(ML) = (1 - p)(MPL)$$

$$p = \frac{MPL}{ML + MPL}$$

$$p = \frac{1}{0.4 + 1} \doteq 0.7143$$

- Optimum order quantity

$$P \{Q \leq q\} \geq p$$

$$z_p = \frac{Q - \mu}{\sigma} \rightarrow Q = z_p \sigma + \mu$$

$$q \geq \mu + z_p \sigma$$

$$q^* = \mu + z_p \sigma$$

$$q^* = 10\,000 + 0.566(500) = 10\,283 \text{ rolls}$$



# Inventory Models

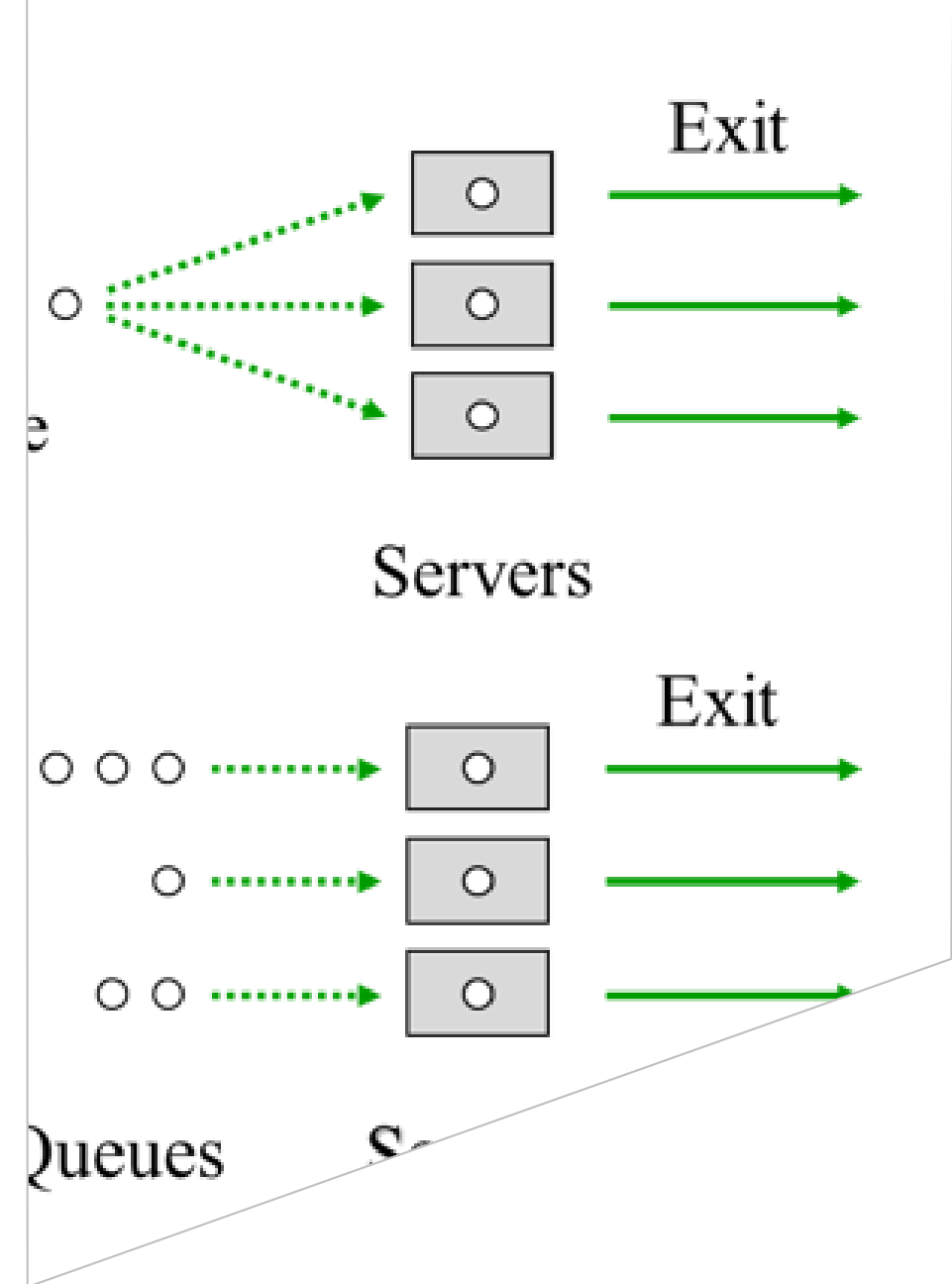
## Single-Period Decision Model

- **Example**
  - In previous example we consider the uniform probability distribution of the daily demand in the interval  $\langle 9\ 000, 11\ 000 \rangle$ .
- **Optimum order quantity**

$$q^* = 9\ 000 + 0,7143(11\ 000 - 9\ 000) \doteq 10\ 429 \text{ rolls}$$

# 6

## Waiting Line Models



# Waiting Line Models

## Introduction

- **Waiting line system**
  - Two objects in the system
    - **customer**,
    - **server** (service facility).

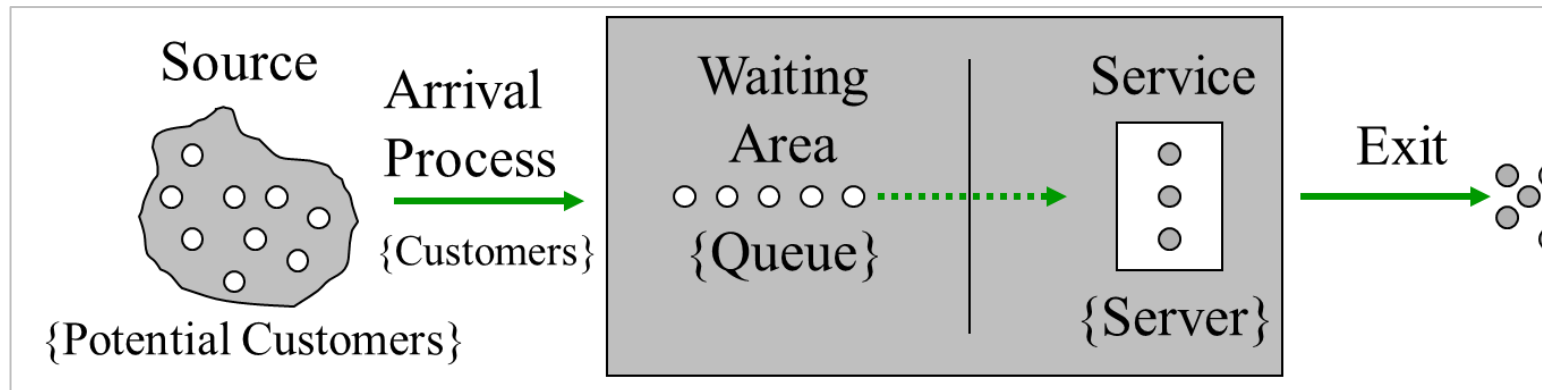


Fig. 45 – Scheme of waiting line system





# Waiting Line Models

## Introduction

- **Waiting line system**
  - Examples of real system

Tab. 29 – Real waiting line systems

Service System	Customer	Server
Doctor's consultancy room	Patient	Doctor
Bank	Client	Clerk
Crossing	Car	Traffic lights
Telephone exchange	Call	Switchboard
Airport	Airplane	Runway
Fire station	Fire	Emergency unit
Service station	Car	Petrol pump



# Waiting Line Models

## Introduction

- **Source of customers**
  - **Size of the source**
    - infinite (tourists),
    - finite (machines in a factory).
- **Arrival process**
  - **Way of arrivals**
    - individual arrivals (patients),
    - arrivals in batches (group of tourists).
  - **Time of arrivals**
    - scheduled arrivals (trains),
    - unscheduled arrivals (patients).

# Waiting Line Models

## Introduction

- **Arrival process**
  - **Number of customers**
    - **arrival rate** – number of arrivals per time unit (Poisson probability distribution),
    - $\lambda =$  **average arrival rate** – average number of arrivals per time unit.
  - **Time of customers' arrivals**
    - **interarrival time** – time period between two subsequent arrivals (exponential probability distribution),
    - $1/\lambda =$  **average interarrival time** – average time period between two subsequent arrivals.

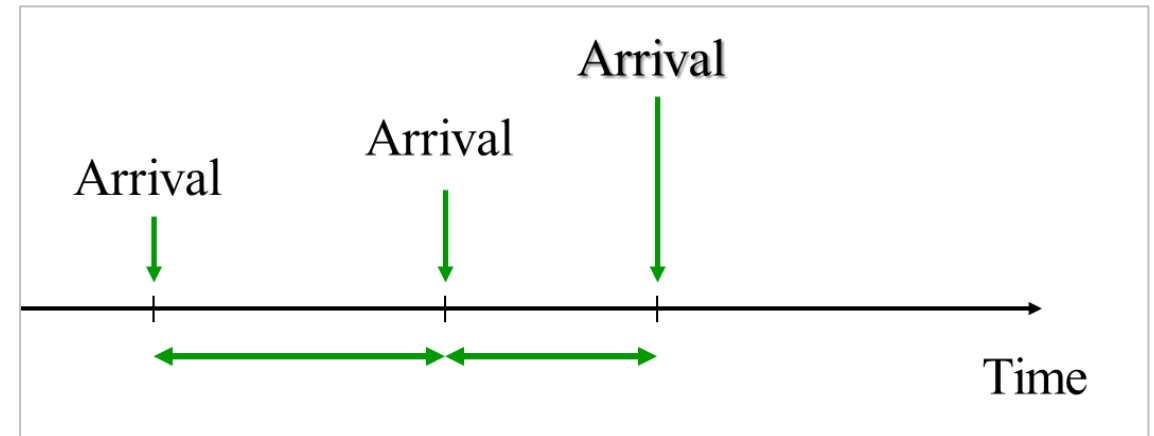


Fig. 46 – Arrivals of customers



# Waiting Line Models

## Introduction

- **Service process**
  - **Number of customers**
    - **service rate** – number of customers served per time unit (Poisson probability distribution),
    - $\mu =$  **average service rate** – average number of customers served per time unit.
  - **Time of service**
    - **service time** – time the customer spends at service facility (exponential probability distribution),
    - $1/\mu =$  **average service time** – average time customers spend at service facility.

# Waiting Line Models

## Introduction

- **Service configuration definition**
  - **Type** of facility – type of the offered service.
  - **Number** of facilities – one or multiple facilities.
  - **Arrangement** of service facilities – network of related or unrelated facilities.
- **Service configurations**
  1. **Single facility**



Fig. 47 – Single facility

# Waiting Line Models

## Introduction

- Service configurations

- Multiple, parallel facility

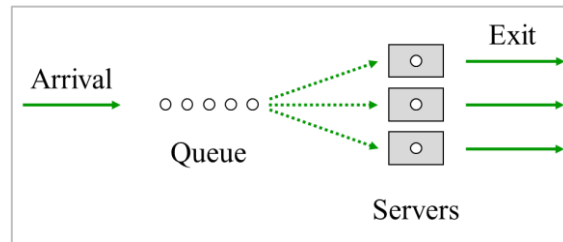


Fig. 48 – Identical facilities, single queue

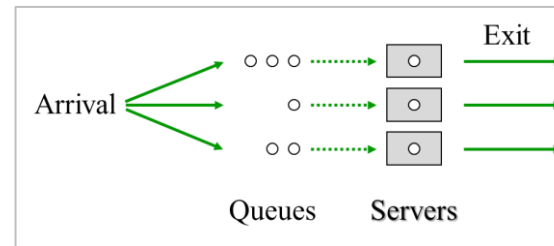


Fig. 49 – Identical facilities, multiple queues

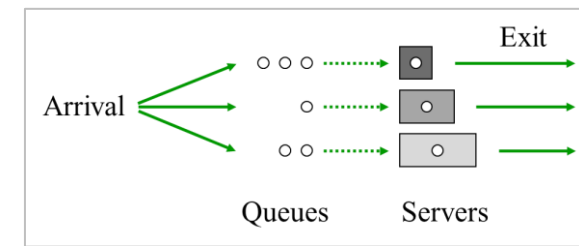


Fig. 50 – Nonidentical facilities

- Multiple, serial facilities

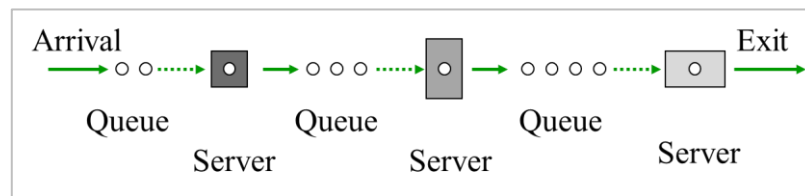


Fig. 51 – Serial facilities

- Combination of parallel and serial arrangement of facilities

# Waiting Line Models

## Introduction

- **Discipline of the queue**
  - **FCFS** (First-Come, First-Served) – **FIFO** (First-In, First-Out)
  - **LCFS** (Last-Come, First-Served) – **LIFO** (Last-In, First-Out)
  - **PRI** (priority system)
  - **SIRO** (Selection In Random Order)
- **Classification of waiting line models (Kendall's notation)**

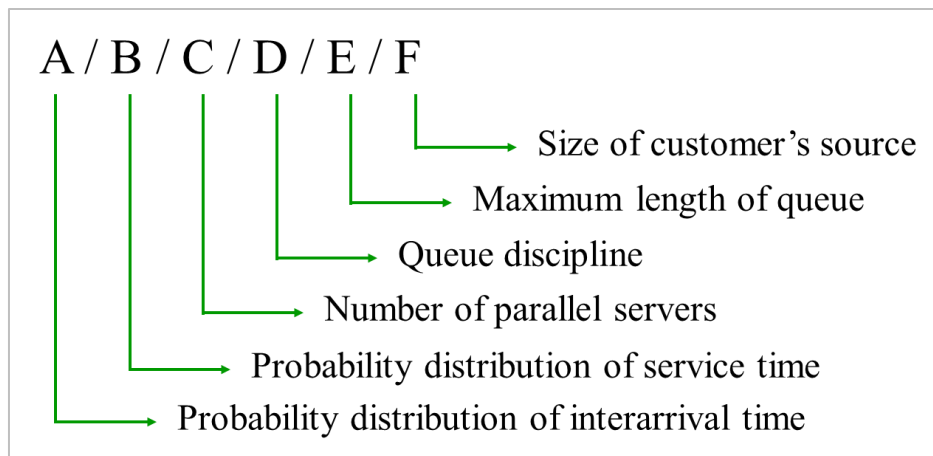


Fig. 52 – Kendall's notation of parallel facilities models



# Waiting Line Models

## Standard Single-Server Exponential Model

### Assumptions

- Kendall's notation:  $M/M/1/FCFS/\infty/\infty$ ,
- **single** facility,
- **exponential** probability distribution of **interarrival time** ( $\lambda$  = average arrival rate),
- **exponential** probability distribution of **service time** ( $\mu$  = average service rate)
- queue discipline is **FCFS**,
- **unlimited** length of the **queue**,
- **infinite** size of the **source** of customers,
- $\mu > \lambda$  **stability** of the **system**.





# Waiting Line Models

## Standard Single-Server Exponential Model

- **Example**
  - In the **small grocery store**, there is only **one shop board** with only one shop assistant.
  - In the period from 8 a.m. to 6 p.m. **18 customers per hour** (on the average) **come** to the grocery.
  - The **assistant** is able to serve (on the average) **25 customers per hour**.
  - Analyze the behavior of the waiting line system.
- **Input parameters**
  - **Average arrival rate**       $\lambda = 18$  customers per hour
  - **Average service rate**       $\mu = 25$  customers per hour



# Waiting Line Models

## Standard Single-Server Exponential Model

- Measures of performance

- Utilization of the system

- probability that the server is busy,
- probability that there is at least one customer in the system,
- probability that the arriving customer must wait in the queue.

$$\boxed{\rho = \frac{\lambda}{\mu}} \quad \rho = 0.72$$

- Probability of an empty facility

- probability that the server is idle,
- probability that the arriving customer will not wait in the queue.

$$\boxed{P(0) = 1 - \rho} \quad P(0) = 0.28$$

# Waiting Line Models

## Standard Single-Server Exponential Model

- Measures of performance
  - Probability of finding exactly  $N$  customers in the system

$$P(N) = P(0)\rho^N = (1 - \rho)\rho^N$$

Tab. 30 – Probabilities of finding  $N$  customers in grocery

$P(0)$	0.280
$P(1)$	0.202
$P(2)$	0.145
$P(3)$	0.105
$P(4)$	0.075
$P(5)$	0.054

$$P(0) + P(1) + P(2) + P(3) + P(4) + \dots = 1$$



# Waiting Line Models

## Standard Single-Server Exponential Model

- Measures of performance

- Average waiting time in the system

$$W = \frac{1}{\mu - \lambda} \quad W \doteq 0.143 \text{ hours} \doteq 8.6 \text{ min}$$

- Average waiting time in the queue

$$W_q = W - \frac{1}{\mu} = \frac{\lambda}{\mu(\mu - \lambda)} \quad W_q \doteq 0.103 \text{ hours} \doteq 6.2 \text{ min}$$



# Waiting Line Models

## Standard Single-Server Exponential Model

- Measures of performance

- Average number of customers in the system

$$L = \lambda W = \frac{\lambda}{\mu - \lambda} \quad L \doteq 2.57 \text{ customers}$$

- Average number of customers in the queue

$$L_q = \lambda W_q = \frac{\lambda^2}{\mu(\mu - \lambda)} \quad L_q \doteq 1.85 \text{ customers}$$



# Waiting Line Models

## Standard Multi-Server Exponential Model

### Assumptions

- Kendall's notation:  $M/M/K/FCFS/\infty/\infty$ ,
- $K$  multiple, parallel facilities, single queue
- exponential probability distribution of interarrival time ( $\lambda$  = average arrival rate),
- exponential probability distribution of service time ( $\mu$  = average service rate)
- queue discipline is FCFS,
- unlimited length of the queue,
- infinite size of the source of customers,
- $K\mu > \lambda$  stability of the system.



# Thank you for attention

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