



Wrocław University
of Science and Technology

Optimization Methods: Theory and Applications

Introduction

Michał Przewoźniczek

Department of Systems and Computer Networks
Wrocław University of Science and technology



Fundusze
Europejskie
Polska Cyfrowa



Rzeczpospolita
Polska

Unia Europejska
Europejski Fundusz
Rozwoju Regionalnego



*Projekt współfinansowany ze środków Unii Europejskiej w ramach Europejskiego Funduszu Społecznego,
Program Operacyjny Polska Cyfrowa na lata 2014-2020,
Oś Priorytetowa nr 3 "Cyfrowe kompetencje społeczeństwa" Działanie nr 3.2 "Innowacyjne rozwiązania na rzecz
aktywizacji cyfrowej"*

Tytuł projektu: „Akademia Innowacyjnych Zastosowań Technologii Cyfrowych (AI Tech)”



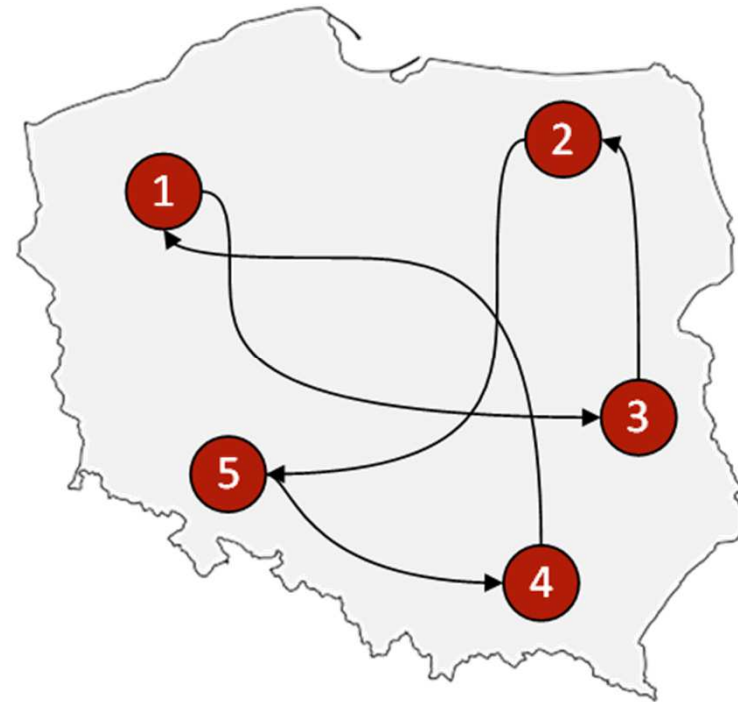
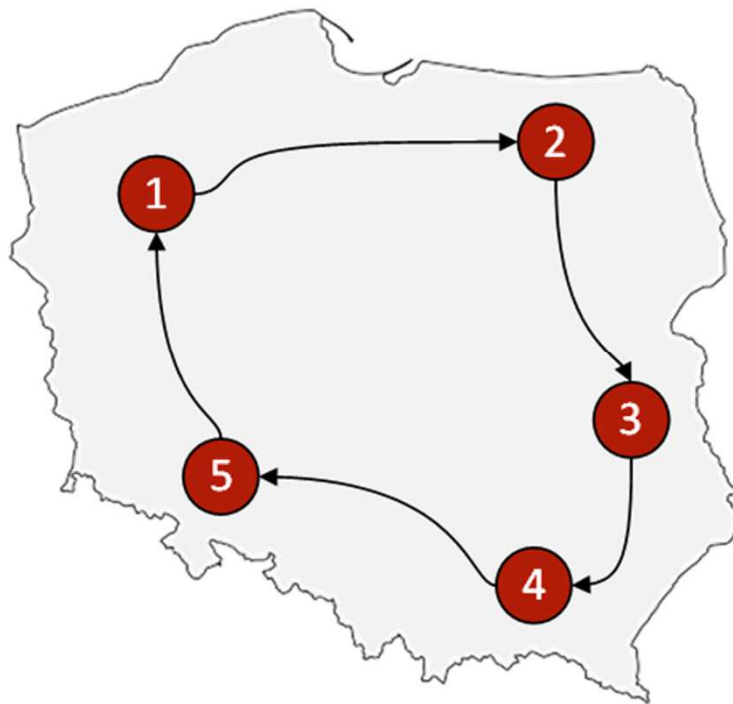
Travelling Salesman Problem

- Find the shortest route
- Visit each city exactly once





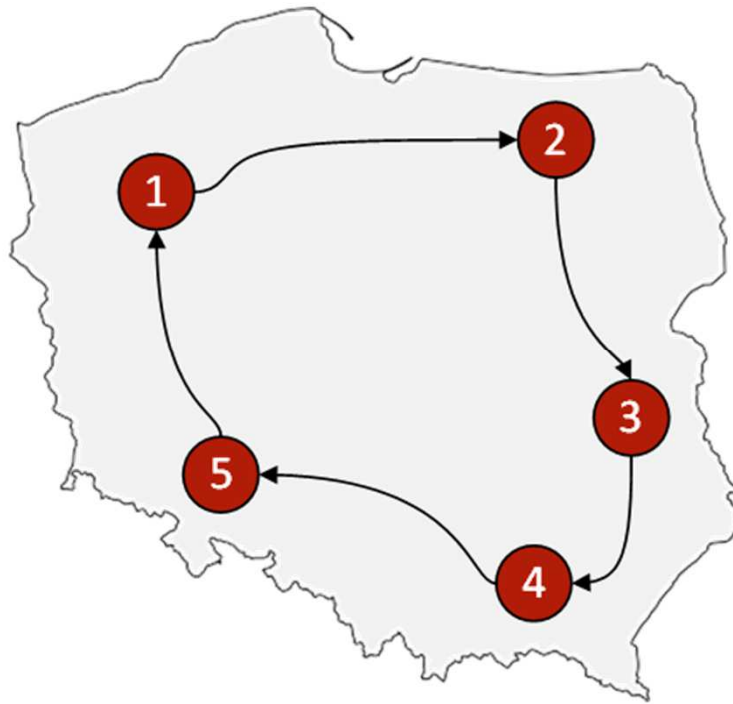
Travelling Salesman Problem



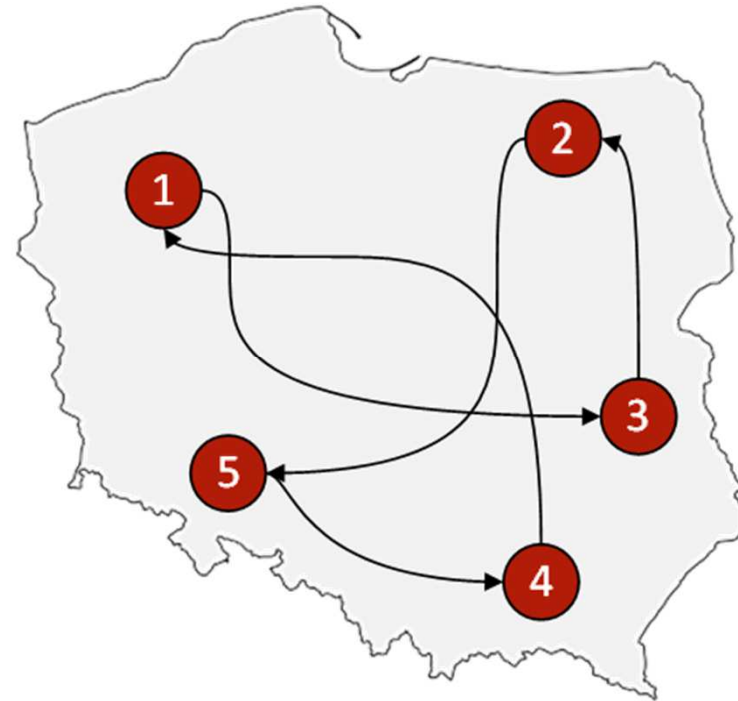
$\frac{n!}{2n}$ available routes (for $n = 5$ there is 12 of them)



Travelling Salesman Problem



[1, 2, 3, 4, 5]



[1, 3, 2, 5, 4]



Optimization – what do you want?

As good solution
as possible...



Optimization

- Different problems have different features
- There are optimizer is optimal for every problem
- What do we want: use the features of the optimized problem (to our favour)



Optimization – what is it?

Traveling Salesman Problem

- Single solution:

$$\vec{x} = [x_1, x_2, x_3, x_4, x_5]$$

$$\forall_{i \in \{1, \dots, 5\}} x_i \in D_{x_i} = \{1, \dots, 5\}$$

- The set of **all** solutions:

$$D_f = D_{x_1} \times D_{x_2} \times D_{x_3} \times D_{x_4} \times D_{x_5}$$

- The set of feasible solutions:

$$D_{\vec{x}} = \left\{ \vec{x}: \forall_{i \in \{1, \dots, 5\}} \forall_{j \in \{1, \dots, 5\} - \{i\}} x_i \in D_{x_i} \wedge x_j \in D_{x_j} \wedge x_i \neq x_j \right\}$$



Optimization – what is it?

Traveling Salesman Problem

- Optimized function:

$$f: D_f \rightarrow R$$

$$f(\vec{x}) = \left(\sum_{i=1}^4 \delta(x_i, x_{i+1}) \right) + \delta(x_5, x_1)$$

where: $\delta(x, y)$ – the distance between cities x and y

- Objective: find solution \vec{x}^* :

$$\vec{x}^* = \arg \min_{\vec{x} \in D_{\vec{x}} \subseteq D_f} f(\vec{x})$$



Optimization – what is it?

Various solution spaces

- **Discrete problems**

$$D_f = Z_1 \times \cdots \times Z_n$$

Example:

$$D_f = \{1, 2, 3\} \times \{4, 5\} \times \{9, 10, 12, 14\}$$

$$\vec{x} = [2, 5, 12]$$

- **Binary problems (the subset of discrete problems)**

$$D_f = \{0, 1\}^n$$

Example:

$$D_f = \{0, 1\} \times \{0, 1\} \times \{0, 1\} = \{0, 1\}^3$$

$$\vec{x} = [0, 1, 1]$$

- **Continuous problems**

$$D_f \subseteq R^n$$

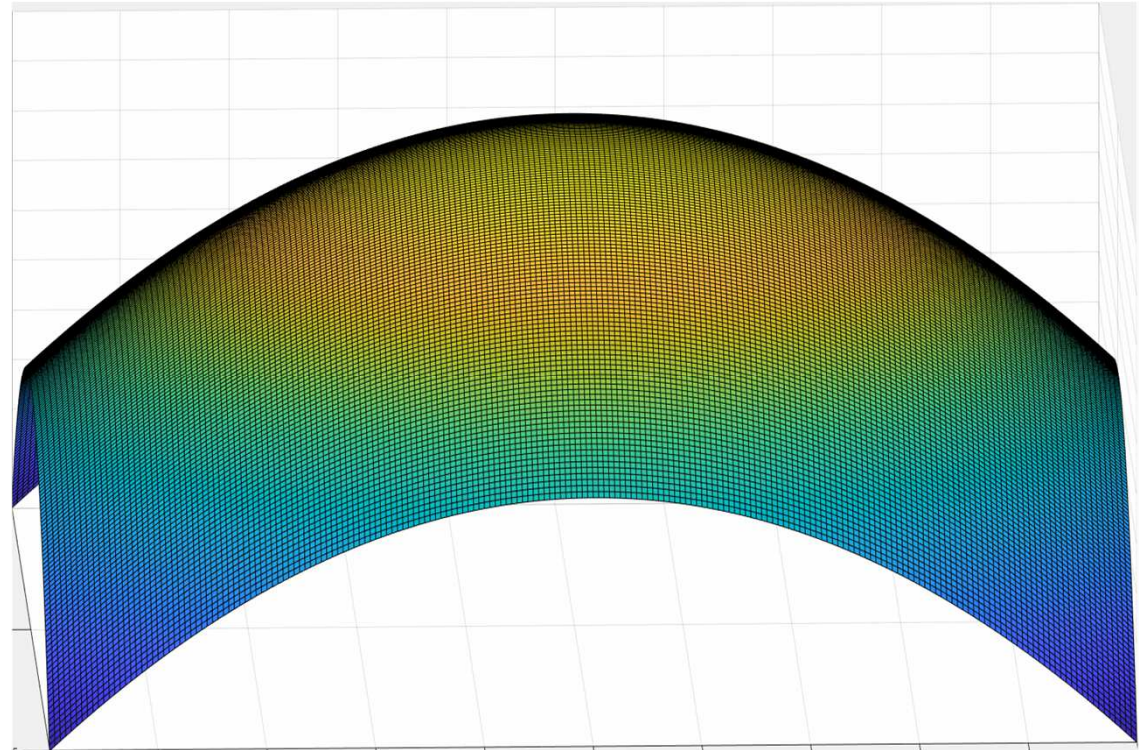
Example:

$$D_f = [-5, 5] \times [-5, 5] \times [-5, 5] = [-5, 5]^3$$

$$\vec{x} = [3.14, 2.56, 1.98]$$

Problem nature

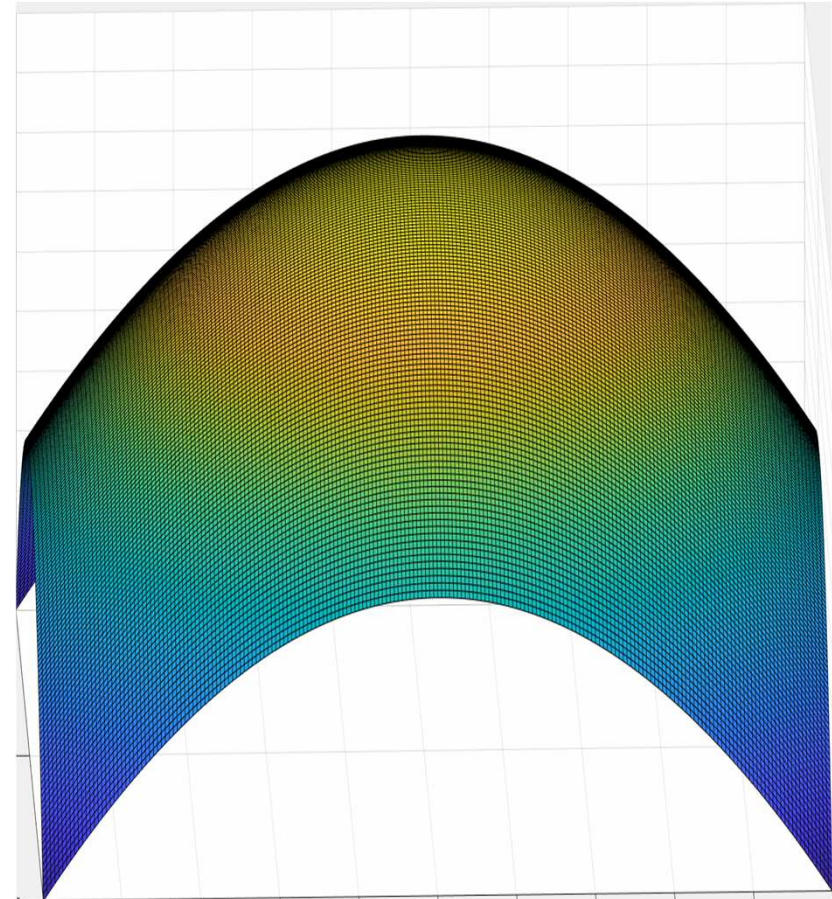
- *Hill* problem
- $\vec{x} = [x_1, x_2]$
- $f: D_f = \mathbb{R}^2 \rightarrow \mathbb{R}$
- $f(\vec{x}) = -x_1^2 - x_2^2$



- $\vec{x}^* = \arg \max_{x \in D_{\vec{x}} = [-5, 5]^2 \subseteq D_f} f(\vec{x})$

Problem nature

- The **Hill** problem features
 - Different than in the TSP case?
 - What makes the difference?
 - Why?
- **How would you solve it by hand**
 - TSP?
 - The **Hill** problem?
- What is the difference between the TSP and the Hill problem solutions?





Problem nature

- Travelling Salesman Problem (TSP) – ***combinatorial in nature***
 - We want to exchange solution fragments
 - For instance – the „good” city sequences
- Problem Hill – ***topological in nature***
 - We want to search for the better solution in the neighbourhood of the best solutions found that far
 - We shift „slightly left”, or „slightly right”
- **Different problem nature -> Different tools**

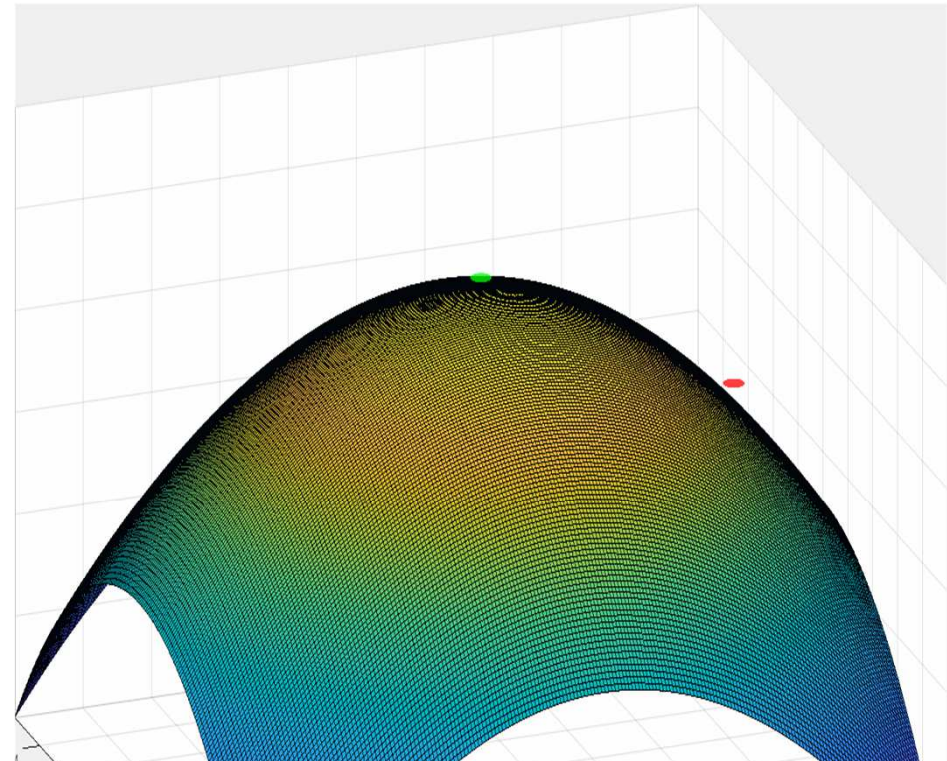


Random Search

- Optimization – how to make it in the simplest way?
- Randomly generate and rememembr the best-found solution
- That's it!

Random Search

- RS – is it effective?
- What is the main drawback of RS?
- **No memory**
- **How to handle that?**
- **Next lecture**



The green point – the optimum

The black point – the best solution

The red point – the current solution