

Visualization in optimization with MATHEMATICA

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Outline of the talk

- 1 Program package MATHEMATICA
 - Introduction
 - Main capabilities of MATHEMATICA
- 2 Visualization of 2D and 3D linear programming problems
 - Linear programming problem
 - 2D case
 - 3D case
 - Properties of the feasible set
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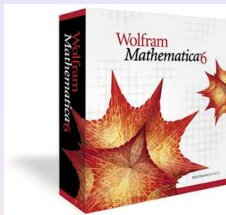
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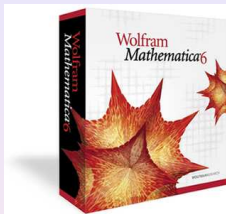
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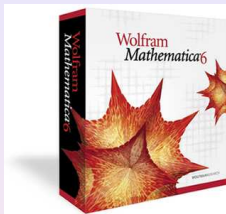
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- It is mainly known as a **computer algebra system (CAS)**, but it has various other features for technical computing.
- Made by **Stephen Wolfram**. First realized in **1988** (version 1.0). Last version (**6.0**) realized in 2007.
- MATHEMATICA is used today throughout the sciences—physical, biological, social, and other—and counts many of the world's foremost scientists among its enthusiastic supporters.
- MATHEMATICA is also heavily used in education, and there are now many hundreds of courses—from high school to graduate school—based

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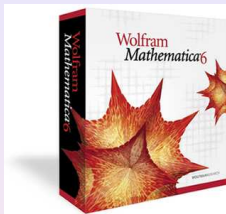
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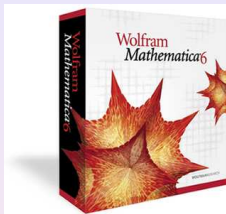
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Main capabilities of MATHEMATICA

- **All the computation you need** (huge collection of algorithms in a single system).
- Symbolic computation (work with the exact numbers, expressions, terms, symbolic integration, simplification, etc.).
- Any precision numerical computation (MATHEMATICA's numerics support any precision or number size across all functions).
- Work with any data (Provides the support for the various data formats including the image, sound, etc.)
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- Visualize anything (Functions or data, discrete objects, diagrams, images, annotations, etc).

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Linear programming problem

Linear programming (LP) problem in general form is given by:

$$\max(\min) f(x) = c_1x_1 + \dots + c_nx_n$$

$$N_i^{(1)} : \sum_{j=1}^n a_{ij}x_j \leq b_i, \quad i = 1, \dots, p$$

$$N_i^{(2)} : \sum_{j=1}^n a_{ij}x_j \geq b_i, \quad i = p+1, \dots, q$$

$$J_i : \sum_{j=1}^n a_{ij}x_j = b_i, \quad i = q+1, \dots, m$$

$$x_j \geq 0, \quad j \in \mathcal{J} = \{1, \dots, s\}, \quad s \leq n$$

- Solutions $x = (x_1, \dots, x_n)$ of the constraints system are called feasible solutions. Set of all feasible solution Ω_P is called feasible set.
- In the geometrical interpretation, feasible set Ω_P is one polytope (simplicial complex) in \mathbb{R}^n .

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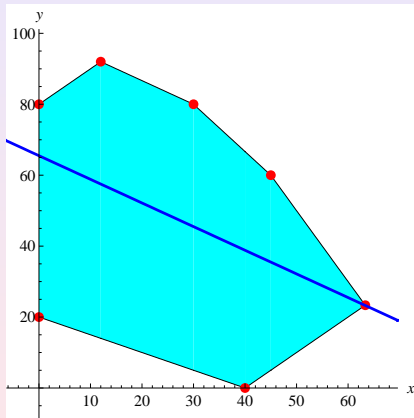
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2D case

Consider the following 2D linear programming problem:

$$\begin{aligned} \max \quad & f(x, y) = 8x + 12y \\ \text{s.t.} \quad & 8x + 4y \leq 600 \\ & 2x + 3y \leq 300 \\ & 4x + 3y \leq 360 \\ & 5x + 10y \geq 600 \\ & x - y \geq -80 \\ & x - y \leq 40 \\ & x, y \geq 0. \end{aligned}$$



3D case

Consider the following 3D linear programming problem:

$$\max f(x, y, z) = x + y + z$$

$$\text{s.t. } x + y + z \leq 1$$

$$2x + y \leq 1$$

$$x + y \leq 1$$

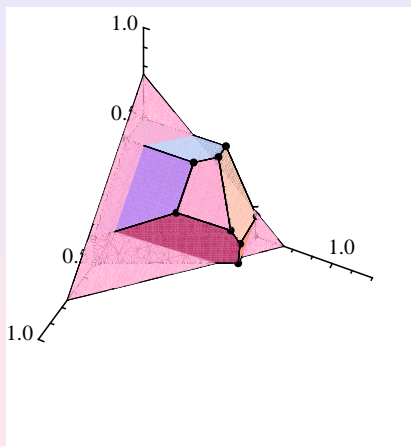
$$2y + z \leq 4/3$$

$$z + x \leq 2/3$$

$$y \leq 3/5$$

$$z \leq 1/2$$

$$x, y, z \geq 0.$$



Properties of the feasible set

It is intuitively clear, from the visualizations, that following properties are true.

Theorem

Feasible set Ω_P convex polytope in \mathbb{R}^n .

Theorem

*Let Ω_P is bounded. There exists $\inf_{x \in \Omega_P} f(x)$, and it is reached in some **extremal point** $x^* \in \Omega_P$. Set of the optimal solutions $\Omega_P^* = \{x \mid x \in \Omega_P, f(x) = f(x^*)\}$ is convex.*

Theorem

Feasible solution $x \in \Omega_P$ is the basic solution if and only if it is extremal point of the set Ω_P .

Conclusion: Optimal solution is one of the most $\binom{n}{m}$ extremal points (basic solutions) of the set Ω_P . This fact is fundamental for the geometrical and simplex method.

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Conclusion

- We develop the symbolic implementation and visualization of geometrical method for solving 2D and 3D linear programming problems.
- Software is made in MATHEMATICA 5.2 and MATHEMATICA 6.0, it is free and can be downloaded from the web site:

<http://tesla.pmf.ni.ac.yu/people/dexter/freewaresoftware.htm>

This software can be used in:

- Educational purpose (teaching LP university and talented high school students).
- Scientific purpose (construction of new methods and heuristics for solving LP)

Example: Minimal angles method (Stojković, Stanimirović 2002).

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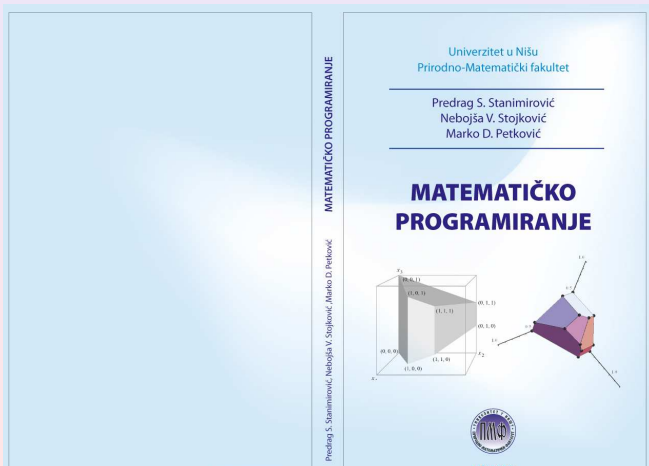
Future work

Some directions for the future considerations:

- Visualization of the simplex method.
- Visualization of the primal-dual interior point methods.
- Visualization of the multicriteria optimization methods including the set of Pareto optimal solutions.
- Visualization of the unconstrained nonlinear programming methods (Simplex I, Simplex II, parabola method, gradient methods, etc.)
- Visual consideration of the game theory.

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Thanks for attention!