

MA3077 (DLI) Operational Research

Lecture 2 – Linear programming

Dr Neslihan Suzen

Lecture Outline

Today's goal is to:

- introduce the concepts of optimisation and linear programming,
- learn how to solve linear programming problems using a graphical method,
- learn how to write a linear programming problem in standard form,
- and learn how some nonlinear functions can be modeled in a linear fashion.

Today's lecture is loosely based on chapters 2.1 and 2.2 of the [Mosek Cookbook](#).

What is optimisation?

Optimisation is a technique to determine the best possible solution to a given problem.

This is done by first formulating a problem in mathematical terms, and then by applying suitable optimisation algorithms.

Formulating the problem in mathematical terms can be challenging. Coding it up can also require some skills.

Optimisation – key terms

To formulate the mathematical model, one must first identify:

- **the objective:** a function that describes how "optimal" a configuration is, and that you aim to maximise or minimise (e.g.: profit, cost, production,...)
- **the control/decision variables:** what you can modify to maximise/minimise the objective function (e.g.: resource allocation, ...)
- **the constraints:** the conditions that the control variable must satisfy (eg: time and resource constraints, ...)

A trivial example – problem statement

You have £15 and you want to purchase as much flour as possible to bake delicious bread.

Your local supermarket sales loose flour at £1 per kg.

How many kg of flour will you buy?

A trivial example – mathematical model

Of course, the answer is 15 kg. To model this task as an optimisation problem, let x be how many kilograms of flour you want to purchase. Then, $x = 15$ is the solution to the optimisation problem

Here,

- the *control variable* is x
- the *objective function* is $z = 15x$
- the *constraints* are $x \geq 0$ and $x \leq 15$.

This is a *linear programming problem* because both the objective and the constraints can be expressed with linear functions.

An example – problem statement

Description: A chemical plant produces two compounds (compound A and B).

- Producing 1 kg of compound A requires 1 kg of raw material and 8 processing hours, whereas 1 kg of compound B requires 2 kg of raw material and 7 processing hours.
- Compound A can be sold at £80 per kg, whereas compound B at £120 per kg.
- The market can absorb at most 3 kg of compound A.
- The chemical plant currently owns 6 kg of raw material and has 28 processing hours available.

Question: How many kilograms of each compound should the plant produce to maximise the revenue?

An example – mathematical formulation 1/2

To formulate this problem as a mathematical model, we introduce the control variables x and y to denote the amount of compound A and B to be produced (in kg), respectively.

Then, the *objective* function, which we want to maximise, can be written as:

and the *constraints* are:

(constraint on raw material available)

(constraint on processing time available)

(constraint imposed by market)

(hidden constraints)

An example – mathematical formulation 2/2

Mathematically, we usually write the problem more compactly as shown in the right column.

Maximise:

subject to:

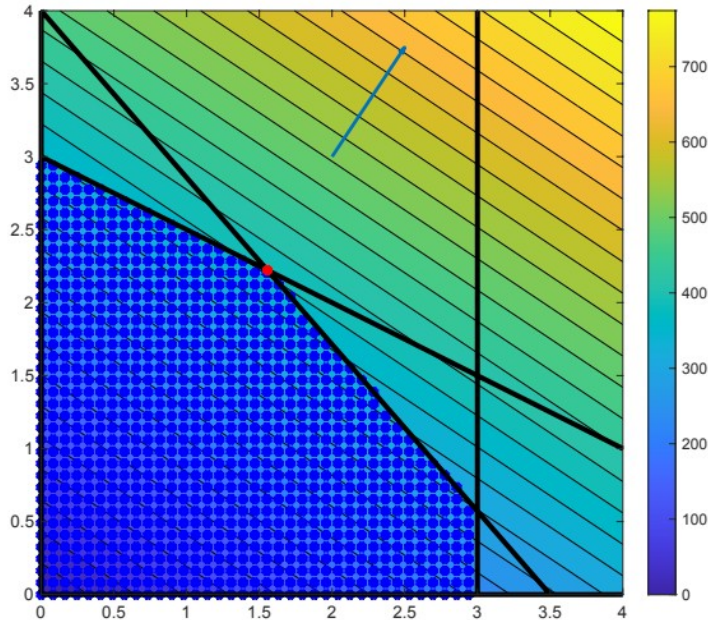
Maximise:

subject to:

This is a *linear programming problem* because both the objective and the constraints can be expressed with linear functions.

An example – graphical solution (with Matlab)

(with Matlab see OR02_feasible_region.m)



Note:

- the *feasible region* is a convex polygon,
- the optimum is at a vertex,
- the maximum is attained at the intersection of the lines

In this case, we say that the two inequality constraints

are *active* (or *tight*) at the optimum.

Linear programming in standard form

Linear programming problems can be written in many ways, e.g.:

for some b . Formulation 1) is called the *standard form*.

Lemma: Representations 1), 2), and 3) (and similar combinations), are all equivalent (for possibly different matrices A , b , and dimensions n).

Linear programming in standard form – Proof 1/3

Lemma: The following representations are equivalent.

Proof: 1) can be written as 2):

Note that there are no constraints on x , hence x can be written as $x = x^+ - x^-$.

Linear programming in standard form – Proof 2/3

Lemma: The following representations are equivalent.

Proof: 2) can be written as 1):

Remark: the new variable is known as *slack variable*.

Linear programming in standard form – Proof 3/3

Lemma: The following representations are equivalent.

Proof: 2) is equivalent to 3):

Note that if x solves 2) and x solves 3), then .



Linear modelling - maximum

The inequality is equivalent to the inequalities

The inequality can be treated analogously. Similarly,

can be rewritten as the linear programming problem

Application: piecewise-affine functions can be used to approximate nonlinear functions accurately (e.g.), and hence to approximate a nonlinear (convex) problem with a linear one.

Linear modelling – absolute value and ℓ_1 -norm

When the absolute value of a scalar enters the model as a constraint, e.g.,

this inequality can be modelled with the inequalities

The ℓ_1 -norm of a vector is defined as

The inequality can be modelled with the inequalities

Linear modelling - ℓ_1 -norm

The ℓ_1 -norm of a vector \mathbf{x} is defined as

The inequality can be modelled as follows,

where \mathbf{z} is an auxiliary variable

Application: Given an underdetermined linear system $\mathbf{A}\mathbf{x} = \mathbf{b}$, the optimization problem can be used to find a *sparse solution* (a solution with as many zeros as possible). This is the gist of [compressed sensing](#).

Summary

Today we have learnt

- how to solve simple (2 dimensional) linear programming problems using a graphical method.
- that linear programming problems can be written in many equivalent formulations, and that one of them is known as standard form.
- that some nonlinear functions such as *max*, *min*, *abs*, \max , and \min can be described using linear functions.

Self-study

1. A farmer owns 80 acres and produces wheat and barley. To produce these crops, the farmer incurs some costs (seeds, fertilizers, etc.). An acre of wheat costs £100, whereas an acre of barley costs £120. To sell the crops at the most favorable market conditions (£1.50 per bushel of wheat and £3.00 per bushel of barley), the farmer stores them in a barn that has capacity for 5'000 bushels. An acre cultivated with wheat produces 115 bushels, whereas an acre allocated to barley produces 35 bushels. Knowing that the farmer currently has £16'000 available for expenses, how should they plant their field?
2. Create your own (2 dimensional) linear programming problem and solve it using the graphical method. Then, write your example in standard form.