

# Introduction

## Computational Intelligence, Lecture 1

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## Statement

A lot of modern methods, computations and algorithms are backed by numerical optimization tools.

## What we want?

To go from a "I hope it works" to a solid understanding of the mathematics and use-cases of those tools.

## Why we want it?

It should allow us to solve a much wider range of problems, and solve them much more effectively.

# MOTIVATING EXAMPLE

We have the following problem: find such  $\mathbf{x}$  that minimizes  $\mathbf{x}^\top \mathbf{M} \mathbf{x}$ , while  $\mathbf{C} \mathbf{x} = \mathbf{y}$ . In other words:

$$\begin{aligned} & \underset{\mathbf{x}}{\text{minimize}} && \mathbf{x}^\top \mathbf{M} \mathbf{x}, \\ & \text{subject to} && \mathbf{C} \mathbf{x} = \mathbf{y}. \end{aligned} \tag{1}$$

More concrete:

$$\begin{aligned} & \underset{\mathbf{x}}{\text{minimize}} && \begin{bmatrix} x_1 & x_2 & x_3 \end{bmatrix} \begin{bmatrix} 1 & 0 & 1 \\ 0 & 5 & 0 \\ 1 & 0 & 3 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}, \\ & \text{subject to} && \begin{bmatrix} 1 & 7 & 2 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix} = 1. \end{aligned} \tag{2}$$

How do we solve it?

# MOTIVATING EXAMPLE

## fmincon

One very popular way of doing it is by use of a general-purpose local optimization solver, such as **fmincon** provided by MATLAB. Here is one possible solution:

```
0 M = [1 0 1; 0 5 0; 1 0 3];  
  C = [1 7 2];  
2  y = 1;  
  
4  fnc = @(x) x'*M*x;  
  con = @(x) deal([], C*x-y);  
6  x = fmincon(fnc, zeros(3, 1), [], [], [], [], [], con)
```

Average solution time is **4.8 ms** (this depends on many factors, so treat it only as a relative information). Solution is  $\mathbf{x} = [0.0442 \quad 0.1239 \quad 0.0442]$ .

# MOTIVATING EXAMPLE

## quadprog

A more sophisticated, but still a very straightforward approach is to use a dedicated solver for this class of problems `quadprog` provided by MATLAB. Here is the solution:

```
0 M = [1 0 1; 0 5 0; 1 0 3];  
  C = [1 7 2];  
2  y = 1;  
  
4  x = quadprog(M, [], [], [], C, y)
```

Average solution time is **0.56** ms, an order of magnitude less than with `fmincon`.

# MOTIVATING EXAMPLE

## SVD-based solution

We can use an algebraic solution, based on SVD decomposition (or its derivative methods - null space and pseudo-inverse), as follows:

```
0 M = [1 0 1; 0 5 0; 1 0 3];  
  C = [1 7 2];  
2  y = 1;  
  
4  tol = 10−5;  
  [P, N] = pinv_null(C, tol);  
6  x = ( eye(3) − N*((N'*M*N) \ (N'*M)) ) * P*y
```

Where `pinv_null` is a function combining `pinv` and `null`, obtained from a single SVD decomposition.

Average solution time is **0.027** ms,  $\sim 20$  times faster than `quadprog` and  $\sim 200$  times faster than `fmincon`.

# MOTIVATING EXAMPLE

## CVX-based solution

Finally, we can invoke one of the most powerful convex optimization tools with a user-friendly coding style - CVX:

```
0 M = [1 0 1; 0 5 0; 1 0 3];  
  C = [1 7 2];  
2 y = 1;  
  
4 cvx_begin  
  variables x(3);  
6 minimize( x' * M * x );  
  subject to  
8      C*x == y;  
  cvx_end
```

However, we will see that the overhead for the call to the solver for this task is excessive. Average solution time is **282** ms, which is  $\sim 60$  times slower than `fmincon`.



Lecture slides are available via Github, links are on Moodle

You can help improve these slides at:

[github.com/SergeiSa/Computational-Intelligence-Slides-Spring-2023](https://github.com/SergeiSa/Computational-Intelligence-Slides-Spring-2023)

