Comparison of Solvers:

1. Gurobi:

- · A commercial solver with high efficiency and performance.
- Requires a license (free for academic use).
- · Offers robust support for large-scale optimization problems.

2. **PuLP:**

- An open-source solver that works well for small to medium-sized LP problems.
- Supports multiple back-end solvers like CBC and GLPK.
- Easier to use but may be slower than Gurobi for large problems.

3. CVXPY:

- $\bullet \ \ \textbf{A Python-based convex optimization framework}.$
- More **flexible** for complex optimization problems (e.g., quadratic, cone, and semidefinite programming).
- · Less optimized for large-scale LPs compared to Gurobi.

Example Problem

Problem Statement:

A person needs at least 500 calories and 20 grams of protein per meal. They can choose between Food A and Food B, with the following nutritional values and costs:

Food Item	Calories per serving	Protein (g) per serving	Cost per serving (€)
Food A	250	10	3
Food B	200	5	2

We define:

- x_A = number of servings of Food A
- x_B = number of servings of **Food B**

Formulation:

Minimize cost:

Minimize $Z = 3x_A + 2x_B$

Subject to:

 $250x_A + 200x_B \geq 500 \quad \text{(Calorie constraint)}$

 $10x_A + 5x_B \geq 20 \quad \text{(Protein constraint)}$

 $x_A, x_B \geq 0 \quad (\text{Non-negativity constraint})$

Brief Explanation of the Code

The code solves a Linear Programming (LP) problem using three different solvers: Gurobi, PuLP, and CVXPY.

Libraries & Functions Used:

1. Gurobi (gurobipy)

- Model(): Creates an optimization model.
- addVar(): Defines decision variables.
- $\operatorname{setObjective}()$: Sets the objective function (minimizing cost).
- addConstr(): Adds constraints to the model.
- optimize(): Solves the LP problem.
- Why? Gurobi is a high-performance solver, efficient for large-scale problems.

2. PuLP (pulp)

- LpProblem(): Defines an LP problem.
- LpVariable(): Creates variables with lower bounds.
- +=: Defines the objective function and constraints.
- · solve(): Runs the solver.
- value(): Extracts solution values.
- Why? PuLP is a simple, open-source solver for LP problems.

3. CVXPY (cvxpy)

- · Variable(): Creates decision variables.
- $\boldsymbol{\cdot}$ Minimize(): Defines the objective function.
- $\bullet \ \, {\tt Problem(\,): Combines \, objective \, and \, constraints \, into \, an \, optimization \, problem.}$
- solve(): Finds the optimal solution.
- Why? CVXPY is useful for more complex convex optimization problems.

Results:

Gurobi Optimizer version 12.0.1 build v12.0.1rc0 (mac64[arm] - Darwin 24.3.0 24D70)

CPU model: Apple M3

Thread count: 8 physical cores, 8 logical processors, using up to 8 threads

Optimize a model with 2 rows, 2 columns and 4 nonzeros

Model fingerprint: 0xcc35f89a

Coefficient statistics:

Matrix range [5e+00, 2e+02]

Objective range [2e+00, 3e+00]

Bounds range [0e+00, 0e+00]

RHS range [2e+01, 5e+02]

Presolve time: 0.00s

Presolved: 2 rows, 2 columns, 4 nonzeros

Iteration Objective Primal Inf. Dual Inf. Time

0 0.0000000e+00 5.125000e+01 0.000000e+00 0s

2 6.0000000e+00 0.000000e+00 0.000000e+00 0s

Solved in 2 iterations and 0.00 seconds (0.00 work units)

Optimal objective 6.00000000e+00

Gurobi Solution:

x_A = 2.0

 $x_B = 0.0$

Optimal Cost = 6.0

GLPSOL--GLPK LP/MIP Solver 5.0

Parameter(s) specified in the command line:

- $-- cpxlp / var/folders/4n/6ydjnj8d16x_m4by160ndjw80000gn/T/7e1970ea859b40458ba18e72a0043249-pulp.lp. \\$
- $-o\ /var/folders/4n/6ydjnj8d16x_m4by160ndjw80000gn/T/7e1970ea859b40458ba18e72a0043249-pulp.sol$

 $Reading\ problem\ data\ from\ '\ / var/folders/4n/6ydjnj8d16x_m4by160ndjw80000gn/T/7e1970ea859b40458ba18e72a0043249-pulp.lp'...$

2 rows, 2 columns, 4 non-zeros

```
7 lines were read
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GLPK Simplex Optimizer 5.0

2 rows, 2 columns, 4 non-zeros

Preprocessing...

2 rows, 2 columns, 4 non-zeros

Scaling...

A: $min|aij| = 5.000e+00 \ max|aij| = 2.500e+02 \ ratio = 5.000e+01$ GM: $min|aij| = 8.891e-01 \ max|aij| = 1.125e+00 \ ratio = 1.265e+00$ EQ: $min|aij| = 7.906e-01 \ max|aij| = 1.000e+00 \ ratio = 1.265e+00$

Constructing initial basis...

Size of triangular part is 2

0: obj = 0.0000000000e+00 inf = 5.064e+00 (2) 1: obj = 6.000000000e+00 inf = 4.189e-17 (0)

OPTIMAL LP SOLUTION FOUND

Time used: 0.0 secs

Memory used: 0.0 Mb (32525 bytes)

 $Writing\ basic\ solution\ to\ '/var/folders/4n/6ydjnj8d16x_m4by160ndjw80000gn/T/7e1970ea859b40458ba18e72a0043249-pulp.sol'...$

PuLP Solution:

x_A = 2.0

 $x_B = 0.0$

Optimal Cost = 6.0

CVXPY Solution:

x_A = 1.9999999986948422

x_B = 2.6830924434355166e-09

Optimal Cost = 6.000000014507116