

Introduction

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Simple Linear Optimization

```
# optimization framework
using JuMP;

# solvers
using CPLEX; using Gurobi; using Cbc;
```

Linear Programs

A straight forward approach to linear programming problems:

Given,

$$\frac{n!}{k!(n-k)!} = \binom{n}{k}$$

$$\text{\$ max ; } x_1 + 2x_2 + 5x_3 \text{\$}$$

subject to,

$$\text{\$ \begin{aligned} -x_1 + x_2 + 3x_3 &\leq -5 \\ x_1 + 3x_2 - 7x_3 &\leq 10 \\ 0 \leq x_1 &\leq 10 \\ 0 \leq x_2 &\leq 0 \\ 0 \leq x_3 &\leq 0 \end{aligned} \text{\$}$$

In Julia:

```
# optimization model
model = Model(Gurobi.Optimizer)

# variables
@variable(model, 0 <= x1 <= 10)
@variable(model, x2 >= 0)
@variable(model, x3 >= 0)

# objective
@objective(model, Max, x1 + 2x2 + 5x3)

@constraint(model, constraint1, -x1 + x2 + 3x3 <= -5)
@constraint(model, constraint2, x1 + 3x2 - 7x3 <= 10)
```

```
# take a peek  
display(model)
```

```
A JuMP Model  
Maximization problem with:  
Variables: 3  
Objective function type: GenericAffExpr{Float64,VariableRef}  
`GenericAffExpr{Float64,VariableRef}`-in-`MathOptInterface.LessThan{Float64}`: 2 constraints  
`VariableRef`-in-`MathOptInterface.GreaterThan{Float64}`: 3 constraints  
`VariableRef`-in-`MathOptInterface.LessThan{Float64}`: 1 constraint  
Model mode: AUTOMATIC  
CachingOptimizer state: EMPTY_OPTIMIZER  
Solver name: Gurobi  
Names registered in the model: constraint1, constraint2, x1, x2, x3
```

```
optimize!(model)  
  
values = [ JuMP.value(x1), JuMP.value(x2), JuMP.value(x3) ]  
  
display(values)
```

```
3-element Array{Float64,1}:  
 10.0  
  2.1875  
  0.9375
```

```
JuMP.dual(constraint1)  
JuMP.dual(constraint2)
```

```
-0.06249999999999989
```

Alternative

```
# model
m2 = Model(Gurobi.Optimizer)
```

```
# non-zero constraints
@variable(m2, x[1:3] >= 0)
```

```
3-element Array{VariableRef,1}:
 x[1]
 x[2]
 x[3]
```

$$\max \sum_{i=1}^3 c_i x_i$$

```
# coefficients
c = [1; 2; 5]
@objective(m2, Max, sum( c[i]*x[i] for i = 1:3))
```

$x[1] + 2 x[2] + 5 x[3]$

Matrix Notation: $Ax \leq b$

```
A = [-1 1 3;
      1 3 -7]
```

```
b = [-5; 10]
```

```
@constraint(m2, # model
  constraint[j=1:2], # num rows
  sum( A[j,i] * x[i] for i=1:3) <= b[j] )
```

```
# boundary constraint
@constraint(m2, bound, x[1] <= 10)
```

bound : $x[1] \leq 10.0$

Solve it

```
optimize!(m2)
```

Results

```
values = [ JuMP.value(x1), JuMP.value(x2), JuMP.value(x3) ]
```

```
display(values)
```

```
3-element Array{Float64,1}:
 10.0
  2.1875
  0.9375
```

```
JuMP.dual(constraint1)
JuMP.dual(constraint2)
```

-0.06249999999999989

Yet Another Way

```
m3 = Model(Gurobi.Optimizer)

c = [ 1; 2; 5]
A = [-1  1  3;
      1  3 -7]
b = [-5; 10]

index_x = 1:3
index_constraints = 1:2

@variable(m3, x[index_x] >= 0)

@objective(m3, Max, sum( c[i] * x[i] for i in index_x) )

@constraint(m3, constraint[j in index_constraints],
            sum( A[j, i] * x[i] for i in index_x) <= b[j] )

@constraint(m3, bound, x[1] <= 10)

optimize!(m3)

display(m3)
```

```
A JuMP Model
Maximization problem with:
Variables: 3
Objective function type: GenericAffExpr{Float64,VariableRef}
`GenericAffExpr{Float64,VariableRef}`-in-`MathOptInterface.LessThan{Float64}`: 3 constraints
`VariableRef`-in-`MathOptInterface.GreaterThan{Float64}`: 3 constraints
Model mode: AUTOMATIC
CachingOptimizer state: ATTACHED_OPTIMIZER
Solver name: Gurobi
Names registered in the model: bound, constraint, x
```

```
println("Optimal Solutions:")
```

Optimal Solutions:

```
for i in index_x
    println("x[$i] = ", value(x[i]))
end
```

```
x[1] = 10.0
x[2] = 2.1875
x[3] = 0.9375
```

```
println("Dual Variables:")
```

Dual Variables:

```
for j in index_constraints
    println("dual[$j] = ", dual(constraint[j]))
end
```

dual[1] = -1.8124999999999998

dual[2] = -0.06249999999999989

Mixed Integer Linear Programming

$$\max x_1 + 2x_2 + 5x_3$$

subject to,

$$\begin{aligned} & -x_1 + x_2 + 3x_3 \leq -5 \\ & x_1 + 3x_2 - 7x_3 \leq 10 \\ & 0 \leq x_1 \leq 10 \\ & x_2 \geq 0 \\ & x_3 \in \{0, 1\} \end{aligned}$$

```
m4 = Model(Gurobi.Optimizer)
```

```
@variable(m4, 0 <= x1 <= 10)
```

```
@variable(m4, x2 >= 0, Int)
```

```
@variable(m4, x3, Bin)
```

```
@objective(m4, Max, x1 + 2x2 + 5x3)
```

```
@constraint(m4, constraint1, -x1 + x2 + 3x3 <= -5)
```

```
@constraint(m4, constraint2, x1 + 3x2 - 7x3 <= 10)
```

```
display(m4)
```

A JuMP Model

Maximization problem with:

Variables: 3

Objective function type: GenericAffExpr{Float64,VariableRef}

`GenericAffExpr{Float64,VariableRef}`-in-`MathOptInterface.LessThan{Float64}`: 2 constraints

`VariableRef`-in-`MathOptInterface.GreaterThan{Float64}`: 2 constraints

`VariableRef`-in-`MathOptInterface.LessThan{Float64}`: 1 constraint

`VariableRef`-in-`MathOptInterface.Integer`: 1 constraint

`VariableRef`-in-`MathOptInterface.ZeroOne`: 1 constraint

Model mode: AUTOMATIC

CachingOptimizer state: EMPTY_OPTIMIZER

Solver name: Gurobi

Names registered in the model: constraint1, constraint2, x1, x2, x3

```
optimize!(m4)
```

```
println("Optimal Solutions:")
```

Optimal Solutions:

```
for i in index_x
```

```
    println("x[$i] = ", value(x[i]))
```

```
end
```

```
x[1] = 10.0
```

```
x[2] = 2.1875
```

```
x[3] = 0.9375
```

```
println("Dual Variables:")
```

Dual Variables:

```
for j in index_constraints
    println("dual[$j] = ", dual(constraint[j]))
end
```

dual[1] = -1.8124999999999998

dual[2] = -0.06249999999999989