# JuMP (part 2): Exercises

### Skills targeted:

- Structure, model and solve a concrete optimisation situation.
- Solve an optimisation problem using an algebraic language and a MIP solver.
- Formulate an implicit linear programming model with JuMP.
- Handle vectors and matrices with Julia.
- Present the optimisation results according a specified format.

#### Activities:

- Write the linear programming model corresponding to a problem.
- Write the obtained model with JuMP.
- · Write the all-in-one program which
  - 1 brings together the data into an adequate datastructure,
  - 2 states the optimisation model,
  - 3 computes the optimal solution.

# Situation 1 (

# Assigning agents to tasks

#### Situation

The linear assignment problem is a fundamental combinatorial optimization problem. It can be stated as follows:

The problem instance has a number of agents and a number of tasks. Any agent can be assigned to perform any task, incurring some cost that may vary depending on the agent-task assignment. It is required to perform as many tasks as possible by assigning at most one agent to each task and at most one task to each agent, in such a way that the total cost of the assignment is minimized.

## **Example**

A company has 4 machines available for assignment to 4 tasks. Any machine can be assigned to any task, and each task requires processing by one machine. The time required to set up each machine for the processing of each task is given in the table below.

| Machines  | Task1 | Task2 | Task3 | Task4 |
|-----------|-------|-------|-------|-------|
| Machine 1 | 13    | 4     | 7     | 6     |
| Machine 2 | 1     | 11    | 5     | 4     |
| Machine 3 | 6     | 7     | 2     | 8     |
| Machine 4 | 1     | 3     | 5     | 9     |

In this example, each value represents a time (hours).

#### Question

Write an implicit model which minimize the total setup time needed for the processing of all four tasks. Find the corresponding minimal value and a corresponding assignment.

#### Solution

Entrée []:

# Situation 2 (

# **Guiding perseverance to discover Mars**

#### **Situation**

While the real Perseverance rover is having fun on Mars, we imagine an alternative version that scouts out an  $N^* \times N^*$  grid of Mars according to the following rules:

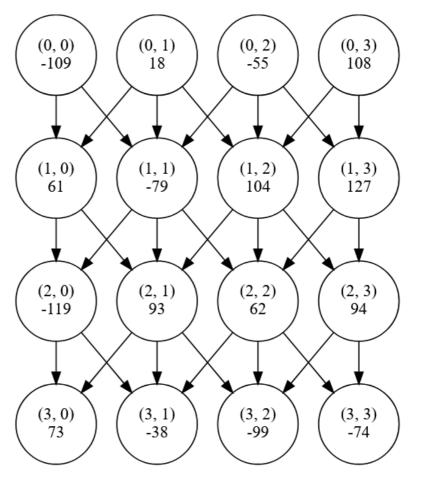
- Surveying a cell is possible only if all its upper neighbors were already explored. The upper neighbors of (a,b) are defined as (a-1,b-1), (a-1,b), (a-1,b+1). Cells that are not on the N\*XN\* grid do not need to be surveyed first.
- Each cell has a "score" between 0-255 points, indicating how valuable it is to explore it.
- Exploring a cell also requires rover maintenance, equivalent to a "cost" of 128 points.

The goal of the rover is to earn the maximum score possible from the grid. This means choosing which cells to explore that satisfy condition 1, such that the total score gained, considering 2 and 3, is the maximum score possible.

We represent the grid as an  $N^* \times N^*$  array of numbers given in hexadecimal format. As an example, consider the following  $4^* \times 4^*$  grid representation:

13 92 49 EC BD 31 E8 FF 09 DD BE DE C9 5A 1D 36

Which represents the following grid (the arrow  $A^* \rightarrow B^*$  means "Exploring  $A^*$  is a prerequisite to exploring \*B"):



For example, the value -109 in cell (0,0) is obtained by converting 13 in hexadecimal notion to 16+3=19 and subtracting 128, obtaining -109. Similarly, the value 18 in (0,1) is obtained by converting 92 to  $9\16+2=146^*$  and subtracting 128.

For the grid above, the optimal score is 424, and can be achieved via the following set:

$$[(0,0),(0,1),(0,2),(0,3),(1,0),(1,1),(1,2),(1,3),(2,1),(2,2),(2,3)]$$

## Question

Find the maximum score and a set of cells achieving it for the following 20×20 grid:

```
BC E6 56 29 99 95 AE 27 9F 89 88 8F BC B4
2A 71 44 7F AF 96
                 72 57 13 DD 08 44 9E A0 13 09 3F D5 AA 06
5E DB E1 EF 14 0B
                 42 B8 F3 8E 58 F0 FA 7F 7C BD FF AF DB D9
13 3E 5D D4 30 FB
                 60 CA B4 A1 73 E4 31 B5 B3 0C 85 DD 27 42
4F D0 11 09 28 39
                 1B 40 7C B1 01 79 52 53 65 65 BE 0F 4A 43
CD D7 A6 FE 7F 51
                 25 AB CC 20 F9 CC 7F 3B 4F 22 9C 72 F5 FE
F9 BF A5 58 1F C7
                 EA B2 E4 F8 72 7B 80 A2 D7 C1 4F 46 D1 5E
FA AB 12 40 82 7E
                 52 BF 4D 37 C6 5F 3D EF 56 11 D2 69 A4 02
0D 58 11 A7 9E 06
                 F6 B2 60 AF 83 08 4E 11 71 27 60 6F 9E 0A
D3 19 20 F6 A3 40
                 B7 26 1B 3A 18 FE E3 3C FB DA 7E 78 CA 49
F3 FE 14 86 53 E9
                 1A 19 54 BD 1A 55 20 3B 59 42 8C 07 BA C5
27 A6 31 87 2A E2
                 36 82 E0 14 B6 09 C9 F5 57 5B 16 1A FA 1C
8A B2 DB F2 41 52
                 87 AC 9F CC 65 0A 4C 6F 87 FD 30 7D B4 FA
CB 6D 03 64 CD 19
                 DC 22 FB B1 32 98 75 62 EF 1A 14 DC 5E 0A
A2 ED 12 B5 CA C0
                 05 BE F3 1F CB B7 8A 8F 62 BA 11 12 A0 F6
79 FC 4D 97 74 4A
                 3C B9 0A 92 5E 8A DD A6 09 FF 68 82 F2 EE
9F 17 D2 D5 5C 72
                 76 CD OD GE 61 DD 41 D4 E0 ED EC 70 71 01
```

## **Solution**

## Entrée [1]: # The matrix for the full size example:

v=[0xBC 0xE6 0x56 0x29 0x99 0x95 0xAE 0x27 0x9F 0x89 0x88 0x8F 0xBC 0x72 0x57 0x13 0xDD 0x08 0x44 0x9E 0xA0 0x13 0x09 0x3F 0xD5 0xAA 0x42 0xB8 0xF3 0x8E 0x58 0xF0 0xFA 0x7F 0x7C 0xBD 0xFF 0xAF 0xDB 0x60 0xCA 0xB4 0xA1 0x73 0xE4 0x31 0xB5 0xB3 0x0C 0x85 0xDD 0x27 0x1B 0x40 0x7C 0xB1 0x01 0x79 0x52 0x53 0x65 0x65 0xBE 0x0F 0x4A 0x25 0xAB 0xCC 0x20 0xF9 0xCC 0x7F 0x3B 0x4F 0x22 0x9C 0x72 0xF5 0xEA 0xB2 0xE4 0xF8 0x72 0x7B 0x80 0xA2 0xD7 0xC1 0x4F 0x46 0xD1 0x52 0xBF 0x4D 0x37 0xC6 0x5F 0x3D 0xEF 0x56 0x11 0xD2 0x69 0xA4 0xF6 0xB2 0x60 0xAF 0x83 0x08 0x4E 0x11 0x71 0x27 0x60 0x6F 0x9E 0xB7 0x26 0x1B 0x3A 0x18 0xFE 0xE3 0x3C 0xFB 0xDA 0x7E 0x78 0xCA 0x1A 0x19 0x54 0xBD 0x1A 0x55 0x20 0x3B 0x59 0x42 0x8C 0x07 0xBA 0x36 0x82 0xE0 0x14 0xB6 0x09 0xC9 0xF5 0x57 0x5B 0x16 0x1A 0xFA 0x87 0xAC 0x9F 0xCC 0x65 0x0A 0x4C 0x6F 0x87 0xFD 0x30 0x7D 0xB4 0xDC 0x22 0xFB 0xB1 0x32 0x98 0x75 0x62 0xEF 0x1A 0x14 0xDC 0x5E 0x05 0xBE 0xF3 0x1F 0xCB 0xB7 0x8A 0x8F 0x62 0xBA 0x11 0x12 0xA0 0x3C 0xB9 0x0A 0x92 0x5E 0x8A 0xDD 0xA6 0x09 0xFF 0x68 0x82 0xF2 0x76 0xCD 0x8D 0x05 0x61 0xBB 0x41 0x94 0xF9 0xFD 0x5C 0x72 0x71 0x45 0x3F 0x00 0x43 0xBB 0x07 0x1D 0x85 0xFC 0xE2 0x24 0xCE 0x76 0xFB 0x89 0xD1 0xE3 0x81 0x0C 0xE1 0x4C 0x37 0xB2 0x1D 0x60 0x40 AVEE AVD7 AVAE AVD7 AV7D AV0C AVCO AVEE AV7A AVAD AV17 AV7D AVEE

### Out[1]: 20×20 Matrix{UInt8}:

| 20×20 Matrix(UINt8): |       |   |   |      |  |          |        |       |       |       |
|----------------------|-------|---|---|------|--|----------|--------|-------|-------|-------|
| 0xbc 0xe6            | 0x56  | 0x29                                    | 0×99                                    | 0x95 |  | 0x2a     | 0x71   | 0×44  | 0x7f  | 0x    |
| af 0x96              |       |   |   |      |  |          |        |       |       | _     |
| 0x72 0x57            | 0x13  | 0xdd                                    | 0×08                                    | 0x44 |  | 0x5e     | 0xdb   | 0xe1  | 0xef  | 0x    |
| 14 0x0b              |       |   |   |      |  |          |        |       |       |       |
| 0x42 0xb8            | 0xf3  | 0x8e                                    | 0x58                                    | 0xf0 |  | 0x13     | 0x3e   | 0x5d  | 0xd4  | 0x    |
| 30 0xfb              |       |   |   |      |  |          |        |       |       |       |
| 0x60 0xca            | 0xb4  | 0xa1                                    | 0x73                                    | 0xe4 |  | 0x4f     | 0xd0   | 0×11  | 0x09  | 0x    |
| 28 0x39              |       |   |   |      |  |          |        |       |       |       |
| 0x1b 0x40            | 0x7c  | 0xb1                                    | 0×01                                    | 0x79 |  | 0xcd     | 0xd7   | 0xa6  | 0xfe  | 0x    |
| 7f 0x51              |       |   |   |      |  |          |        |       |       |       |
| 0x25 0xab            | 0xcc  | 0x20                                    | 0xf9                                    | 0xcc |  | 0xf9     | 0xbf   | 0xa5  | 0x58  | 0x    |
| 1f 0xc7              |       |   |   |      |  |          |        |       |       |       |
| 0xea 0xb2            | 0xe4  | 0xf8                                    | 0x72                                    | 0x7b |  | 0xfa     | 0xab   | 0x12  | 0×40  | 0x    |
| 82 0x7e              |       | • | • |      |  | <b>.</b> | 0710.0 | •/    |       | • , , |
| 0x52 0xbf            | 0x4d  | 0x37                                    | 0xc6                                    | 0x5f |  | 0x0d     | 0x58   | 0×11  | 0xa7  | 0x    |
| 9e 0x06              | OXTO  | UNST                                    | OXCO                                    | UNDI |  | OXOG     | UNDU   | OXII  | σχαγ  | ΟΛ    |
| 0xf6 0xb2            | 0×60  | 0xaf                                    | 0x83                                    | 0×08 |  | 0xd3     | 0×19   | 0×20  | 0xf6  | 0x    |
| a3 0x40              | 0.00  | υλαι                                    | 0,00                                    | 0.00 |  | UNUJ     | UNIS   | 0120  | 0.110 | 0.7   |
| 0xb7 0x26            | 0x1b  | 0x3a                                    | 0×18                                    | 0xfe |  | 0xf3     | 0xfe   | 0×14  | 0×86  | 0x    |
| 53 0xe9              | OXID  | uxsa                                    | AXIO                                    | UXIC |  | UXIS     | UXIE   | UX 14 | 0000  | UΧ    |
|                      | OvE 4 | avhd                                    | 0v15                                    | 0x55 |  | 0v27     | 0,456  | 0v21  | 0,407 | ۵v    |
| 0x1a 0x19            | 0x54  | 0xbd                                    | 0x1a                                    | охээ |  | 0×27     | 0xa6   | 0x31  | 0×87  | 0x    |
| 2a 0xe2              | 0 0   | 0 11                                    | 0.16                                    | 0 00 |  | 0 0      | 0 1 0  | o 11  | 0 (0  | •     |
| 0x36 0x82            | 0xe0  | 0×14                                    | 0xb6                                    | 0x09 |  | 0x8a     | 0xb2   | 0xdb  | 0xf2  | 0x    |
| 41 0x52              |       | _                                       |   |      |  |          |        |       |       | _     |
| 0x87 0xac            | 0x9f  | 0xcc                                    | 0x65                                    | 0x0a |  | 0xcb     | 0x6d   | 0x03  | 0x64  | 0x    |
| cd 0x19              |       |   |   |      |  |          |        |       |       | _     |
| 0xdc 0x22            | 0xfb  | 0xb1                                    | 0x32                                    | 0x98 |  | 0xa2     | 0xed   | 0x12  | 0xb5  | 0x    |
| ca 0xc0              |       |   |   |      |  |          |        |       |       |       |
| 0x05 0xbe            | 0xf3  | 0x1f                                    | 0xcb                                    | 0xb7 |  | 0x79     | 0xfc   | 0x4d  | 0x97  | 0x    |
| 74 0x4a              |       |   |   |      |  |          |        |       |       |       |
| 0x3c 0xb9            | 0x0a  | 0x92                                    | 0x5e                                    | 0x8a |  | 0x9f     | 0×17   | 0xd2  | 0xd5  | 0x    |
| 5c 0x72              |       |   |   |      |  |          |        |       |       |       |
| 0x76 0xcd            | 0x8d  | 0x05                                    | 0x61                                    | 0xbb |  | 0x54     | 0x3f   | 0x3b  | 0x32  | 0x    |
| e6 0x8f              |       |   |   |      |  |          |        |       |       |       |
| 0x45 0x3f            | 0×00  | 0x43                                    | 0xbb                                    | 0×07 |  | 0x96     | 0×40   | 0×10  | 0xfb  | 0x    |
| 64 0x88              |       | _                                       |   | -    |  |          | -      | -     | -     |       |
|                      |       |   |   |      |  |          |        |       |       |       |

| 0xfb  | 0x89 | 0xd1 | 0xe3 | 0x81 | 0x0c | 0xa5 | 0x2d | 0x3b | 0xe4 | 0x |
|-------|------|------|------|------|------|------|------|------|------|----|
| 85 0x | 87   |      |      |      |      |      |      |      |      |    |
| 0xe5  | 0xd7 | 0x05 | 0xd7 | 0x7d | 0x9c | 0x83 | 0x46 | 0x79 | 0x0d | 0x |
| 10 Av | 50   |      |      |      |      |      |      |      |      |    |

The program in Julia and JuMP:

Entrée []:

# Situation 3 (

# Packing different rectangles in a minimumarea rectangle

#### **Situation**

Rectangle packing is a packing problem where the objective is to determine whether a given set of small rectangles can be placed inside a given large polygon, such that no two small rectangles overlap.

Several variants exist and we consider here the variant where the objective is to pack different rectangles in a minimum-area rectangle. In this variant, the small rectangles can have varying lengths and widths, and their orientation is fixed (they cannot be rotated). The goal is to pack them in an enclosing rectangle of minimum area, with no boundaries on the enclosing rectangle's width or height.

This problem has an important application in combining images into a single larger image. A web page that loads a single larger image often renders faster in the browser than the same page loading multiple small images, due to the overhead involved in requesting each image from the web server.

(Definition from <a href="https://en.wikipedia.org/wiki/Rectangle\_packing">https://en.wikipedia.org/wiki/Rectangle\_packing</a>))

Example of the application of this optimization problem for building CSS sprites:

Not good: Wasted space making the CSS Sprite bigger than it needs to be.



Better:
Packing the images in as small
a CSS Sprite as possible reduces
load time and bandwidth.

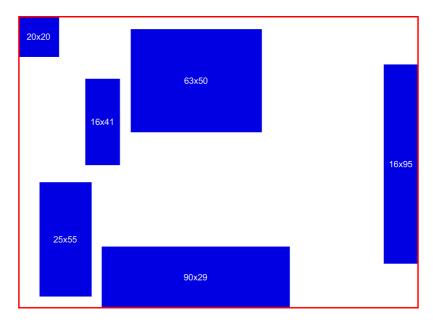


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(Image from <a href="https://www.codeproject.com/Articles/210979/Fast-optimizing-rectangle-packing-algorithm-for-bu">https://www.codeproject.com/Articles/210979/Fast-optimizing-rectangle-packing-algorithm-for-bu</a>))

#### Question

Find the minimum-area rectangle for the following rectangles:



with

Display automatically your optimal solution found using the plotting tools available in Julia.

### **Solution**

The program in Julia and JuMP:

Entrée []: