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# Missing Solutions

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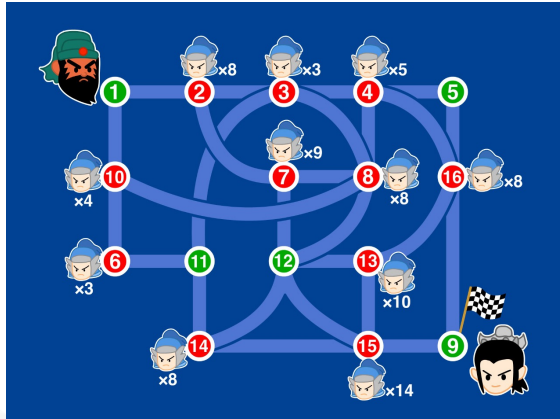
## Planning an Escape



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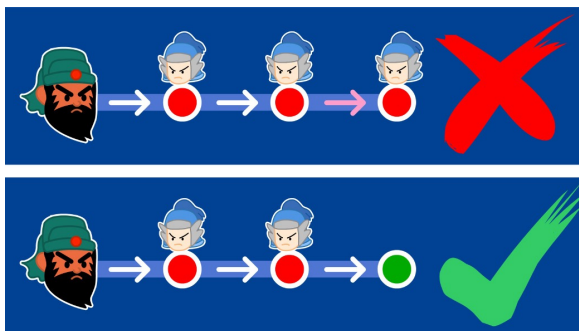


## Planning an Escape



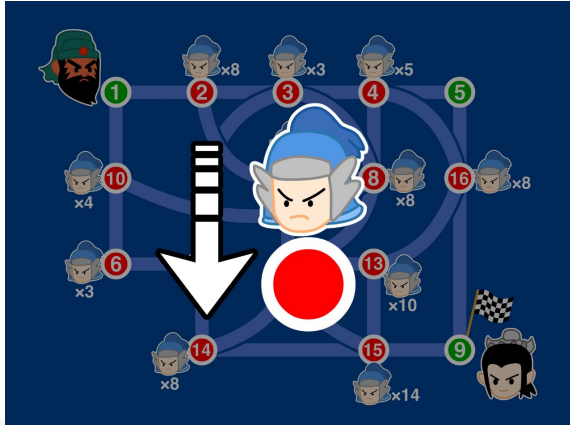
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## A Path with Resting Points



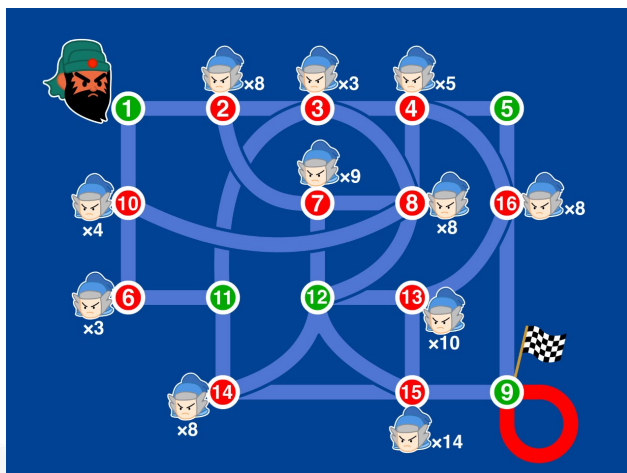
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## Objective



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## Data to Represent a Graph (escape.dzn)



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## Table Data for the Path (escape.dzn)

⌘ Should use assert to check data!

```
n = 16;
guard = [0, 8, 3, 5, 0, 3, 9, 8, 0, 4, 0, 0, 10,
8, 14, 8];
m = 27;
edge = [| 1,2 | 1,10 | 2,3 | 2,7 | 3,4
        | 3,8 | 3,11 | 4,5 | 4,8 | 4,16
        | 5,16 | 6,10 | 6,11 | 7,8 | 7,12
        | 8,10 | 8,12 | 9,9 | 9,15 | 9,16
        | 11,14 | 12,13 | 12,14 | 12,15 | 13,15
        | 13,16 | 14,15 |];

rest = 3;
start = 1;
dest = 9;
maxstep = 10; % anticipated max number of steps
```

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## Planning an Escape (escape.mzn)

⌘ Data

```
int: n; set of int: NODE = 1..n;
array[NODE] of int: guard;
int: m; set of int: EDGE = 1..m;
array[EDGE,1..2] of NODE: edge;
NODE: start;
NODE: dest;
int: rest; % resting every rest junctions
```

⌘ Decisions

```
int: maxstep;
var int: step; % the actual number of steps
set of int: STEP = 1..maxstep;
array[STEP] of var NODE: path;
```

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## The Table Global Constraint

- ⌘ A global constraint for representing abstract relations

```
table(array[1..n] of var int: x,  
      array[1..T,1..n] of int: t)
```

- ⌘ Enforces that the  $x$ 's take all take a value from one row of the table  $t$

- ⌘ E.g.

- `table([x,y,z], [l 0,0,0 l 1,2,3 l 4,2,0 l])`
- either  $x = 0 \wedge y = 0 \wedge z = 0$
- or  $x = 1 \wedge y = 2 \wedge z = 3$
- or  $x = 4 \wedge y = 2 \wedge z = 0$

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## Representing a Path on a Graph (escape.mzn)

```
path[1] = start;  
forall(i in 1..maxstep-1)  
  (table([path[i],path[i+1]],edge));
```

- ⌘ The table constraint enforces that two consecutive path positions are connected by an edge

- ⌘ **Why the self edge at the destination??**

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## A Path with Unknown Length (escape.mzn)

- Make an **educated** guess on the maximum possible length of the path
  - The smaller the better, but not too small
  - Too large a guess will make the problem harder

```
int: maxstep;  
var int: step; % the actual number of steps  
set of int: STEP = 1..maxstep;  
array[STEP] of var NODE: path;
```

- Trick: **self edge** at the destination
  - Keep looping once the destination is reached
  - E.g. path = [1, 2, 3, 11, 14, 15, 9, 9, 9, 9]

```
forall(i in STEP) (i >= step -> path[i] = dest);
```

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## Sliding Sum

- The **sliding sum** global
  - sliding\_sum(int: low,
    - int: up,
    - int: seq,
    - array [int] of var int: vs)
  - enforces that each subsequence vs[i] .. vs[i+seq-1] sums to between low and up

- It is used to enforce properties of sequences

- E.g. sliding\_sum(4, 8, 4, x)

x = [1, 4, 2, 0, 0, 3, 4] ✓

x = [1, 4, 3, 0, 1, 0, 2] ✗

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## Resting Constraints and Objective (escape.mzn)

### ⌘ The resting constraints

- For our example, it requires in **every sequence** of “rest” number of nodes  $i$  in the path, at least one has  $\text{guard}[i] = 0$

```
sliding_sum(1, rest, rest,  
  [guard[path[i]] = 0 | i in STEP]);
```

### ⌘ Objective

```
solve minimize sum(i in STEP) (guard[path[i]]);
```

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## Planning an Escape

### ⌘ Running the model gives

```
====UNSATISFIABLE====
```

### ⌘ What do we do?

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## Missing Solutions

- ⌘ Possibly the worst things that can happen when running a model is
  - after longer than you want to wait
  - **no solution** is printed
- ⌘ First Fix (for optimization problems)
  - Run with all solutions printed
    - `-a, -all_solutions`
  - Without this no solution is printed if its not **proved optimal**
  - This is the default behavior in the IDE
- ⌘ And if still no solutions found!

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## Missing Solutions

- ⌘ More general techniques
  - Adding a solution to the problem
  - Relaxing constraints

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## Missing Solutions: Add a Solution

- ⌘ Construct a small instance that shows the problem
- ⌘ Construct something that should be a **solution**
- ⌘ Add it to the model, rerun!
- ⌘ With **luck** you get a message like  
`Model inconsistency detected.`
- ⌘ And a **line number** indicating where!
- ⌘ **Maybe not** :-(  
`warning: model inconsistency detected before search.`

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## Missing Solutions: Relaxing Constraints

- ⌘ Then what?
- ⌘ Try removing constraints one by one until a solution is found.
- ⌘ Narrow down the responsible (set of) constraints
- ⌘ Fix it!

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## Adding a Solution

- ⌘ Add an expected solution to the model

```
path = [1,10,6,11,14,15,9,9,9,9];  
step = 7;
```

- ⌘ Unfortunately in this case no error message? Just

```
=====UNSATISFIABLE=====
```

- ⌘ So lets start removing constraints

- minus sliding sum

```
=====UNSATISFIABLE=====
```

- minus table

```
-----  
=====
```

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## Adding a Solution

- ⌘ Seems like something to do with table?

- ⌘ But what?

- ⌘ Let's add a trace

- note useless without the solution

```
forall(i in 1..maxstep-1)  
    (trace("table([\ (path[i]),\ (path[i+1])), "  
        ++ "edge)\n",  
        table([path[i],path[i+1]],edge)));
```

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## Adding a Solution

### Running the model

```
table([1,10],edge)
table([10,6],edge)
table([6,11],edge)
table([11,14],edge)
table([14,15],edge)
table([15,9],edge)
table([9,9],edge)
table([9,9],edge)
table([9,9],edge)
=====UNSATISFIABLE=====
```

### Now is it clear what is going on?

### We only have one direction of the edges

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## Correcting the Model (escape-fixed.mzn)

### We need to create an undirected form of the edges. Just add a reverse of each edge

```
array[1..2*m,1..2] of NODE: uedge =
  array2d(1..2*m,1..2,
    [ edge[i,j] | i in EDGE, j in 1..2] ++
    [ edge[i,3-j] | i in EDGE, j in 1..2]);
```

### replace the use of edge with uedge

```
forall(i in 1..maxstep-1)
  (table([path[i],path[i+1]],uedge));
```

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## No Solutions

- ⌘ In the worst case
  - the model is too slow to solve!
  - so the solver just goes into a large search and never returns
- ⌘ What can you do!?
  - simplify the model
    - take into account less of the problem
    - look at the solutions of the simplified problem
    - can you use these
  - decompose the model
    - break the problem into two parts
    - solve the first part
    - fix a solution to the first part to define the second part

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## Summary

- ⌘ Debugging models is **HARD**
- ⌘ Key methods
  - Find a small example which shows the problem
  - Make sure the constraints generated are the constraints that you think they are
  - Generate a solution you expect to find
  - Switch off and on constraints in the model
  - Solve a simpler version of the problem first
    - by ignoring constraints/parts of the problem
- ⌘ Debugging is a **vital** skill to develop

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