

Modeling Sudoku puzzles with Python

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Background - The OKlibrary

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- ▶ C++/Lisp/Bash

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- ▶ Modeling of Sudoku puzzles in a variety of domains
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Overview

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- ▶ Using `sudoku.py`
 - ▶ Creating puzzles

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 - ▶ Integer programming models
 - ▶ Polynomial models
- ▶ Using `sudoku.py`
 - ▶ Creating puzzles
 - ▶ Solving puzzles

A traditional Sudoku puzzle is a partial assignment of $1, \dots, 9$ to the cells of a 9×9 grid with the latin property on rows, columns and boxes.

2	5			3		9		1
	1				4			
4		7				2		8
		5	2					
				9	8	1		
	4				3			
			3	6			7	2
	7							3
9		3				6		4

A *solution* of a Sudoku puzzle is a total assignment which extends the original partial assignment and satisfies the same latin properties.

2	5	8	7	3	6	9	4	1
6	1	9	8	2	4	3	5	7
4	3	7	9	1	5	2	6	8
3	9	5	2	7	1	4	8	6
7	6	2	4	9	8	1	3	5
8	4	1	6	5	3	7	2	9
1	8	4	3	6	9	5	7	2
5	7	6	1	4	2	8	9	3
9	2	3	5	8	7	6	1	4

A (*generalized*) *Sudoku* puzzle of boxsize n is a partial assignment of $1, \dots, n^2$ to the cells of an $n^2 \times n^2$ grid with the latin property on rows, columns and boxes.

2	5			3		9		1
	1				4			
4		7				2		8
		5	2					
				9	8	1		
	4				3			
			3	6			7	2
	7							3
9		3				6		4

Constraint Satisfaction Problems

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A *constraint satisfaction problem* (CSP) is a collection of *constraints*.

A *constraint* restricts the values assigned to certain *variables*.

A *variable* v has an associated *domain* $D(v)$.

A *solution* of a CSP is an assignment to the variables which satisfies all the constraints.

Modeling Sudoku – Variables

For a Sudoku puzzle of boxsize n we have variables

$$x_i \quad 1 \leq i \leq n^4$$

The domain $D(x_i) = \{1, \dots, n^2\}$.

$x_i = j$ means that cell i is assigned value j .

Modeling Sudoku – The AllDifferent constraint

The *AllDifferent constraint* forces a set of variables to have mutually different values.

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- ▶ Row 1: AllDifferent(x_1, x_2, x_3, x_4)

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For example, if $n = 2$:

- ▶ Row 1: $\text{AllDifferent}(x_1, x_2, x_3, x_4)$
- ▶ Column 1: $\text{AllDifferent}(x_1, x_5, x_9, x_{13})$

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The *AllDifferent constraint* forces a set of variables to have mutually different values.

For example, if $n = 2$:

- ▶ Row 1: $\text{AllDifferent}(x_1, x_2, x_3, x_4)$
- ▶ Column 1: $\text{AllDifferent}(x_1, x_5, x_9, x_{13})$
- ▶ Box 1: $\text{AllDifferent}(x_1, x_2, x_5, x_6)$

Modeling Sudoku – The ExactSum constraint

The *ExactSum* constraint restricts the values of variables to have a given sum.

So, if $x_4 = 3$, we can use the constraint $\text{ExactSum}(x_4, 3)$

Modeling Sudoku – python-constraint

<http://labix.org/python-constraint>

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```
>>> from constraint import Problem
```

```
>>> from sudoku import cells , symbols
```

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```
>>> from constraint import Problem
```

```
>>> from sudoku import cells, symbols
```

```
>>> cp = Problem()
```

```
>>> cp.addVariables(cells(2), symbols(2))
```

Modeling Sudoku – The empty board

```
>>> from sudoku import \  
      cells_by_row, cells_by_col, cells_by_box
```

Modeling Sudoku – The empty board

```
>>> from sudoku import \  
      cells_by_row, cells_by_col, cells_by_box
```

```
>>> sudoku.cells_by_row(2)  
[[1, 2, 3, 4], [5, 6, 7, 8],  
 [9, 10, 11, 12], [13, 14, 15, 16]]
```

Modeling Sudoku – The empty board

```
>>> from sudoku import \  
      cells_by_row, cells_by_col, cells_by_box
```

```
>>> sudoku.cells_by_row(2)  
[[1, 2, 3, 4], [5, 6, 7, 8],  
 [9, 10, 11, 12], [13, 14, 15, 16]]
```

```
>>> sudoku.cells_by_col(2)  
[[1, 5, 9, 13], [2, 6, 10, 14],  
 [3, 7, 11, 15], [4, 8, 12, 16]]
```


Modeling Sudoku – The empty board

```
>>> from sudoku import \  
      cells_by_row, cells_by_col, cells_by_box
```

```
>>> sudoku.cells_by_row(2)  
[[1, 2, 3, 4], [5, 6, 7, 8],  
 [9, 10, 11, 12], [13, 14, 15, 16]]
```

```
>>> sudoku.cells_by_col(2)  
[[1, 5, 9, 13], [2, 6, 10, 14],  
 [3, 7, 11, 15], [4, 8, 12, 16]]
```

```
>>> sudoku.cells_by_box(2)  
[[1, 2, 5, 6], [3, 4, 7, 8],  
 [9, 10, 13, 14], [11, 12, 15, 16]]
```

Modeling Sudoku – The empty board

```
>>> for row in cells_by_row(2):  
...     cp.addConstraint(AllDifferentConstraint(), row)  
... 
```

Modeling Sudoku – The empty board

```
>>> for row in cells_by_row(2):  
...     cp.addConstraint(AllDifferentConstraint(), row)  
...
```

```
>>> for col in cells_by_col(2):  
...     cp.addConstraint(AllDifferentConstraint(), col)  
...
```

Modeling Sudoku – The empty board

```
>>> for row in cells_by_row(2):  
...     cp.addConstraint(AllDifferentConstraint(), row)  
...  
  
>>> for col in cells_by_col(2):  
...     cp.addConstraint(AllDifferentConstraint(), col)  
...  
  
>>> for box in cells_by_box(2):  
...     cp.addConstraint(AllDifferentConstraint(), box)
```

Modeling Sudoku – Puzzles

```
>>> d = {3: 2, 5: 2, 6: 1, 7: 4, \  
        8: 3, 10: 4, 12: 2, 13: 1}
```

Modeling Sudoku – Puzzles

```
>>> d = {3: 2, 5: 2, 6: 1, 7: 4, \  
         8: 3, 10: 4, 12: 2, 13: 1}  
  
>>> from constraint import ExactSumConstraint as Exact  
>>> for cell in d:  
...     cp.addConstraint(Exact(d[cell]), cell)
```

Modeling Sudoku – Solving

```
>>> cp.getSolution()
```

```
{1: 4,  
 2: 3,  
 3: 2,  
 4: 1,  
 5: 2,  
 6: 1,  
 7: 4,  
 8: 3,  
 9: 3,  
10: 4,  
11: 1,  
12: 2,  
13: 1,  
14: 2,  
15: 3,  
16: 4}
```

Modeling Sudoku – Puzzle objects

```
>>> from sudoku import Puzzle
```


Modeling Sudoku – Puzzle objects

```
>>> from sudoku import Puzzle
```

```
>>> Puzzle(cp.getSolution(), 2)
```

```
+-----+-----+
| 4 3 | 2 1 |
| 2 1 | 4 3 |
+-----+-----+
| 3 4 | 1 2 |
| 1 2 | 3 4 |
+-----+-----+
```

Modeling Sudoku – The solve function

```
>>> p = Puzzle(d, 2)
```

Modeling Sudoku – The solve function

```
>>> p = Puzzle(d, 2)
```

```
>>> from sudoku import solve
```

```
>>> solve(p)
```

```
+-----+-----+
| 4 3 | 2 1 |
| 2 1 | 4 3 |
+-----+-----+
| 3 4 | 1 2 |
| 1 2 | 3 4 |
+-----+-----+
```

Modeling Sudoku – Graph models

- ▶ J. Gago-Vargas, I. Hartillo-Hermosa, J. Martin-Morales, J. M. Ucha- Enriquez, *Sudokus and Groebner Bases: not only a Divertimento*, In: Lecture Notes in Computer Science, vol. 4194. pp. 155-165. 2005

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- ▶ The graph model has a *node* for every cell. Two nodes are adjacent in the graph model if they represent *dependent cells*.

Modeling Sudoku – Graph models

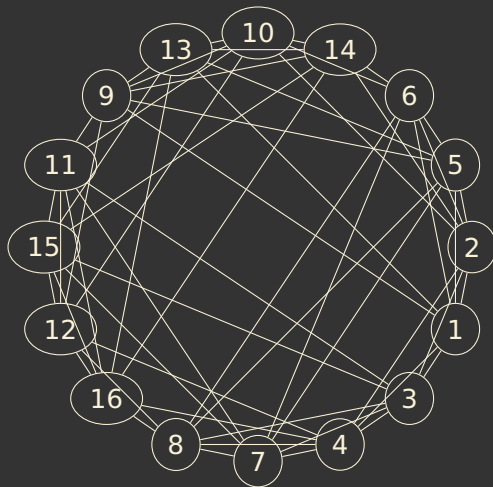


Figure: The Shidoku graph

Modeling Sudoku – Graph models

Networkx : <http://networkx.lanl.gov/>

```
>>> from networkx import Graph
```

```
>>> g = Graph()
```

```
>>> g.add_nodes_from(cells(2))
```

Modeling Sudoku – Graph models

Networkx : <http://networkx.lanl.gov/>

```
>>> from networkx import Graph
```

```
>>> g = Graph()
```

```
>>> g.add_nodes_from(cells(2))
```

```
>>> from sudoku import dependent_cells
```

```
>>> g.add_edges_from(dependent_cells(2))
```


Modeling Sudoku – Node coloring

```
>>> for cell in d:  
...     g.node[cell]['color'] = d[cell]
```

Modeling Sudoku – Node coloring

```
>>> for cell in d:  
...     g.node[cell]['color'] = d[cell]  
  
>>> from sudoku import node_coloring, n_colors  
>>> cg = node_coloring(g)  
>>> n_colors(cg)  
6
```

Modeling Sudoku – Node coloring

```
>>> for cell in d:  
...     g.node[cell]['color'] = d[cell]  
  
>>> from sudoku import node_coloring, n_colors  
>>> cg = node_coloring(g)  
>>> n_colors(cg)  
6
```

```
>>> from sudoku import graph_to_dict  
>>> s = Puzzle(graph_to_dict(cg), 2)  
>>> s
```

```
+-----+-----+  
| 3 5 | 2 6 |  
| 2 1 | 4 3 |  
+-----+-----+  
| 5 4 | 3 2 |  
| 1 2 | 5 4 |  
+-----+-----+
```

Modeling Sudoku – Further models

Modeling domain

Python library

Integer Programming

pyglpk v0.3

<http://tfinley.net/software/pyglpk/>

Polynomials

sympy

<http://code.google.com/p/sympy/>