

INSA

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APPLIQUÉES
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Computer Science Department

CH8: CONSTRAINT (LOGIC) PROGRAMMING

A BRIEF INTRODUCTION
(NOT COVERED DURING LECTURES)

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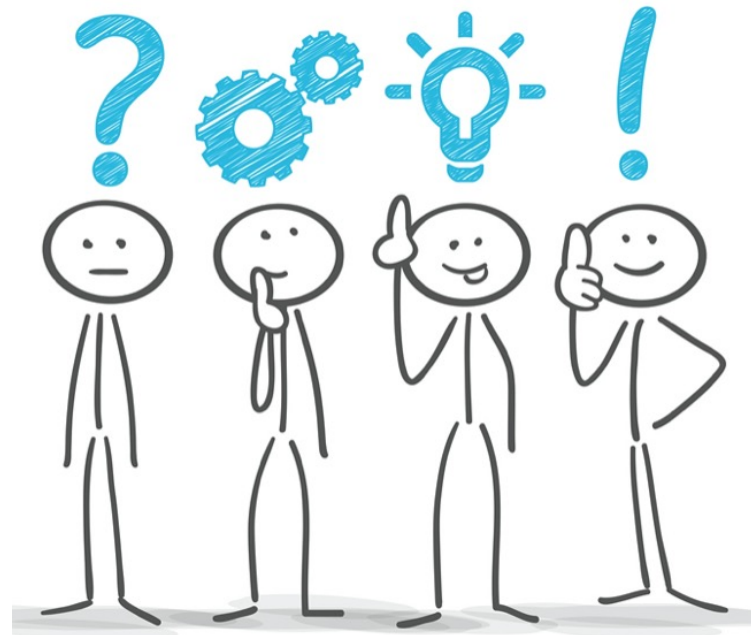
Sudoku 1/14

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

The challenge is to fill the grid with numbers from 1 to 9 such that every row, every column, and every 3x3 sub-grid contains the digits 1 to 9.

- Fill in **1** slot, **explain why this is a valid step**

Allow yourself some time to search before looking at solutions 😊



Sudoku 14/14

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

- Column constraints : 7
- Line constraint + block constraint : 4

Sudoku 2/14

1. In the next grid, finish to remove the impossible values due to the initially given values
 - Has the order an impact on the amount of values removed ?
2. On what to reason next ?
 - A square ? A line ? A column ?
 - Which one ? And why ?

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

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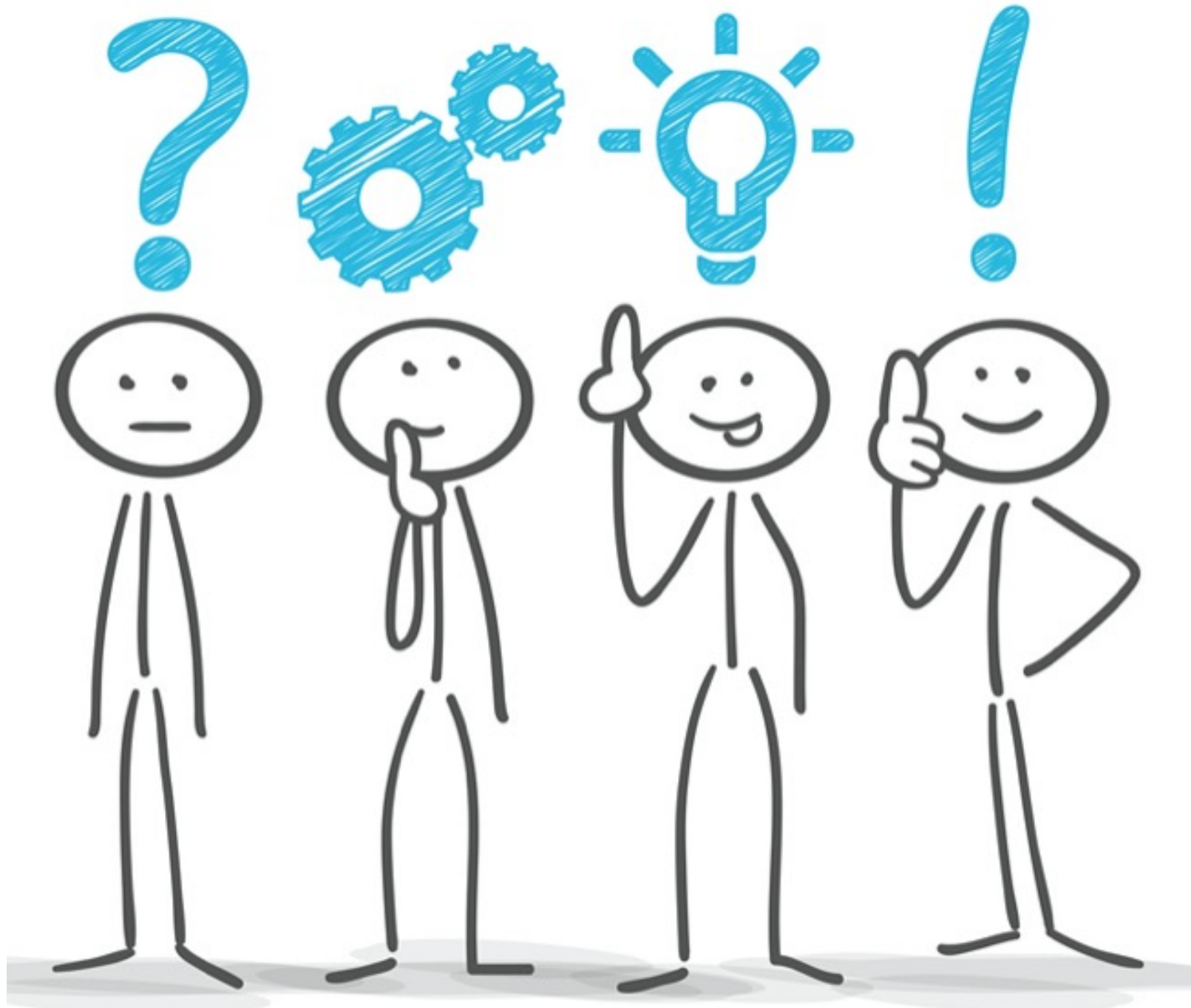
Sudoku 4/14

1. Assume we take the upper left most square, what can be deduced ?

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

1. .
2. .
3. .
4. .
5. .

Allow yourself some time to search before looking at solutions 😊



Sudoku 4bis/14

What can be deduced ?

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

1. l1.c1 can only contain 9
 - remove 9 from the rest of line 1, col 1, square 1
2. 1 can only be in the first line
 - remove 1 from line 1 in other squares
3. 7 can only be in l1.c2
 - 1 can thus not be in l1.c2
 - remove 7 from the rest of line 1, col 2
4. 1 can only be in l1.c3
 - 5 cannot be in l1.c3
 - remove 1 from the rest of c3
5. 4 and 5 can only be in col 1
 1. remove 4 and 5 from col 1 in other squares

What would have happened if we had taken step 3 in second ?

Sudoku 5/14

1. What happens if only half of the numbers are initially given ?
2. What if the given numbers are randomly changed ?

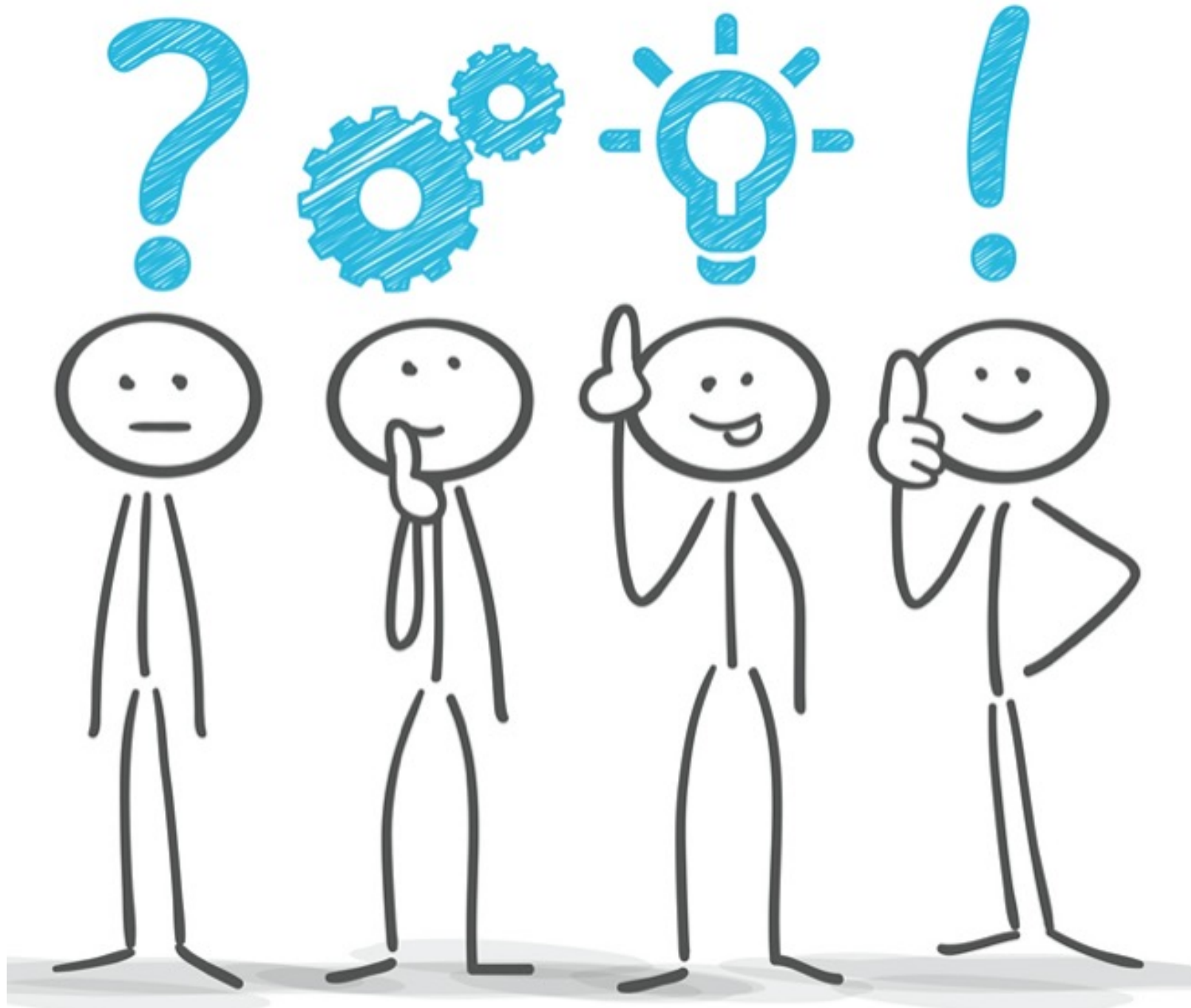
Sudoku 6/14

- In the next grid, all impossible values have been removed
- We should **try values**
 - on which cell(s) does it seem the most promising and why ?

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

7/14

Allow yourself some time to search before looking at solutions 😊



Sudoku 6bis/14

Cell(s) where it seems most promising to try values

- those with only 2 values left
- those with a value that appears often “as possible” in other cells
- ...

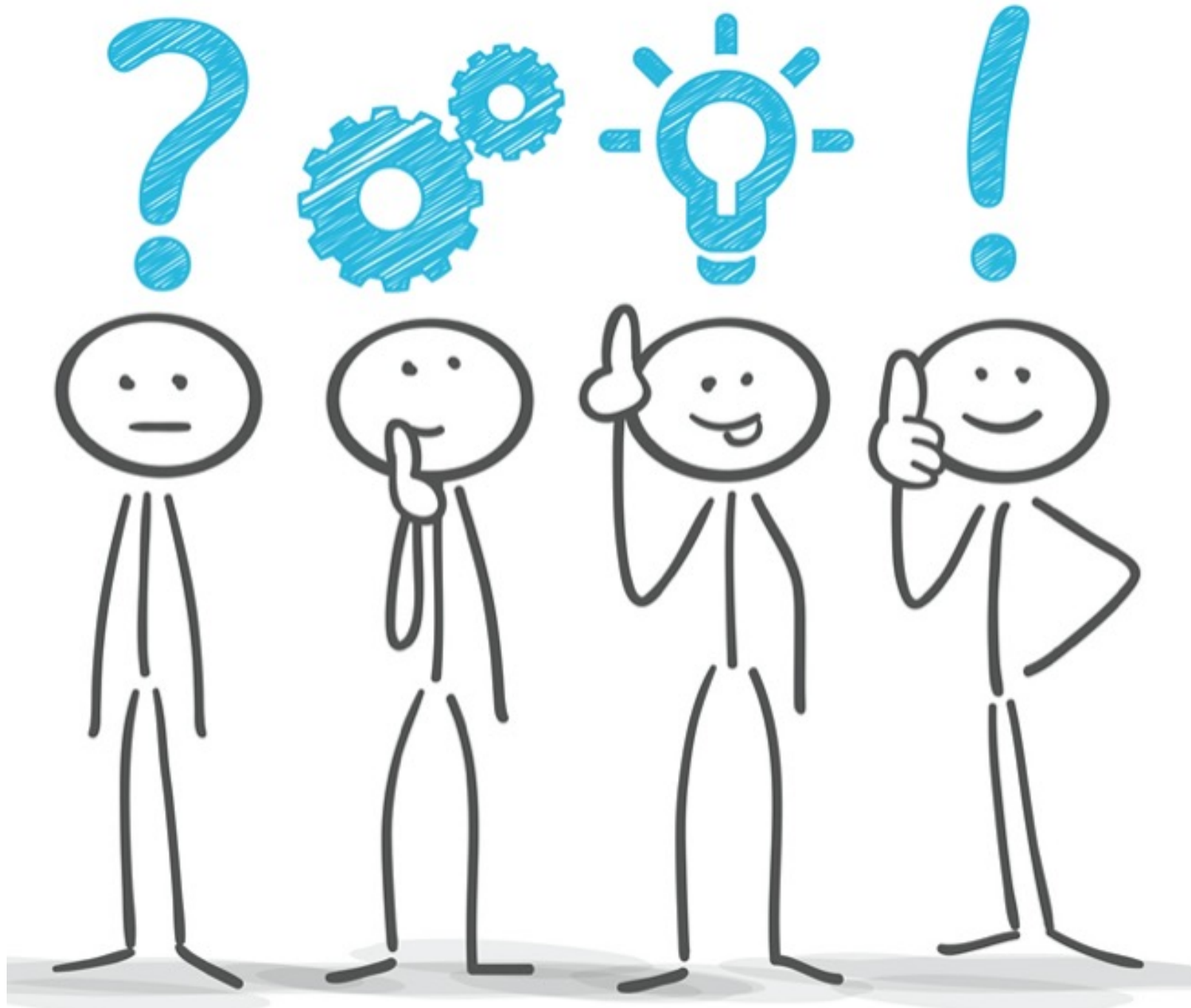
Sudoku 8/14

- In the next grid we have tried 7, a possible value, for I1.c1 and removed all impossible values
 - what can be noticed ?
- Try 7 at cell I2.c4 and propagate
 - what happens ?

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

9/14

Allow yourself some time to search before looking at solutions 😊



9bis/14

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

Failure !
We need to
backtrack

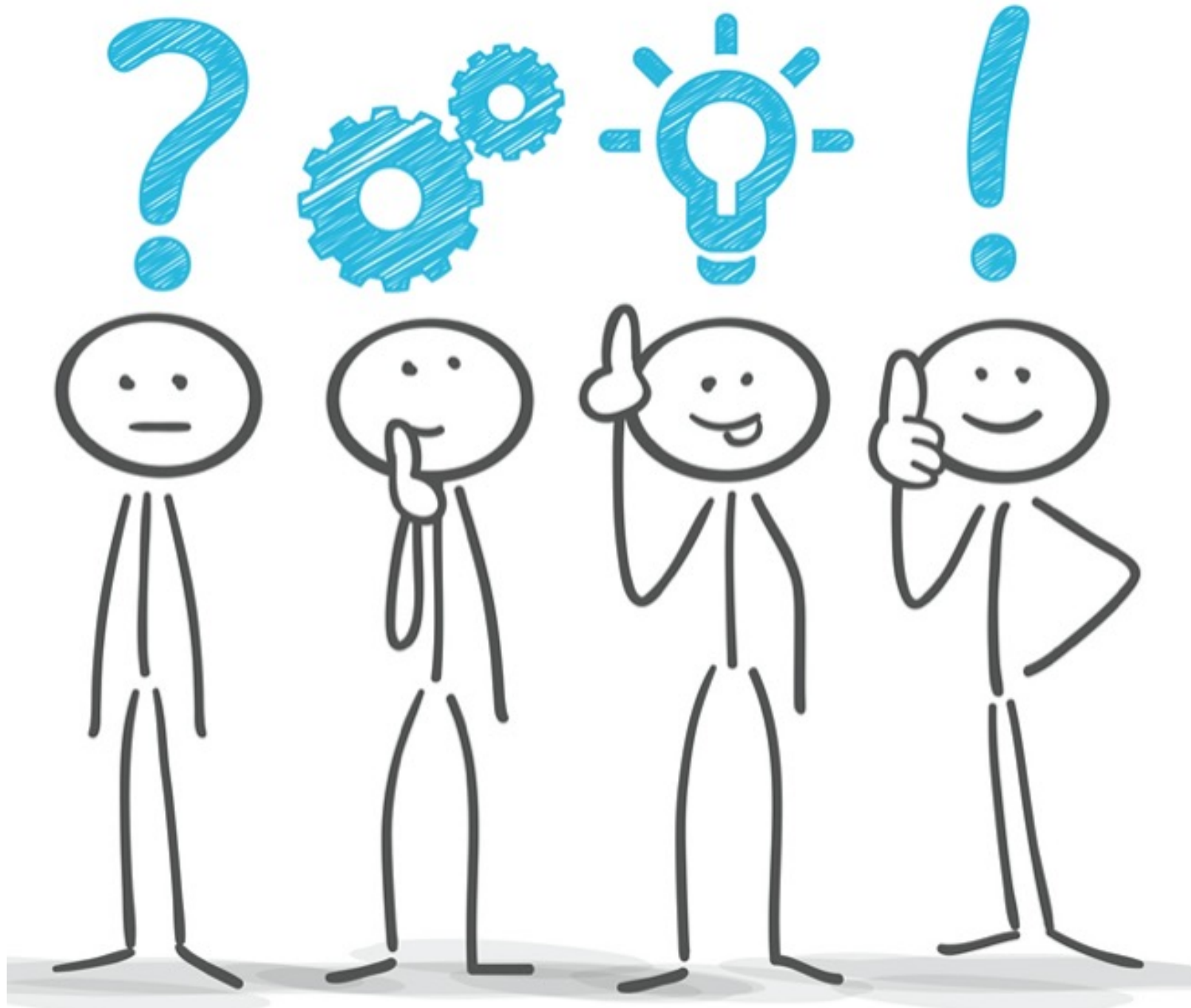
Remarks

- Removing all the impossible values does not necessarily lead to a single solution
 - Failures can occur
 - Several values per slots may still be possible
 - Values have to be tried
 - Trying a value is in general insufficient
 - Propagating inconsistent values is necessary
- **In the general case, the two aspects have to be executed in turn**

Sudoku 10/14

- What are the parameters of the previous reasoning ?
 - How are chosen the particular objects to reason upon ?
 1. .
 2. .
 3. ...
 - Which actions are used ?
 1. .
 2. .
 3. .
 4. .

Allow yourself some time to search before looking at solutions 😊



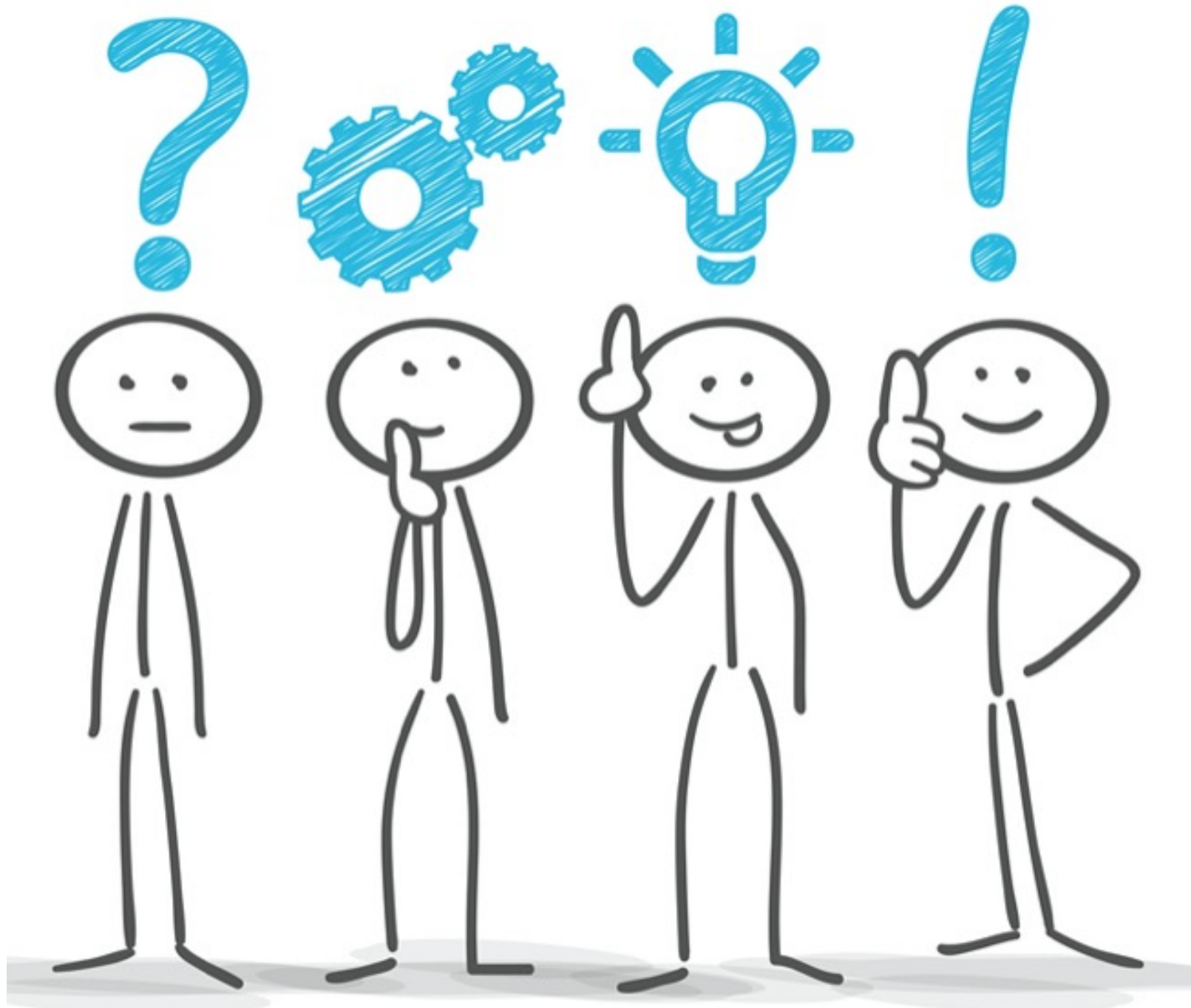
Sudoku 10bis/14

- What are the parameters of the previous reasoning ?
 - How are chosen the particular objects to reason upon ?
 1. the most constrained, or
 2. the first one in a line, or
 3. ...
 - Which actions are used ?
 1. detect only possible values at a given slot, line, column, square using different heuristics
 2. remove impossible values at a given place, line, column, square propagating constraints
 3. try a value at a given slot
 4. backtrack on failures
 5. ...

Sudoku 11/14

- What is difficult for human-beings ?
- What is difficult for computers ?

Allow yourself some time to search before looking at solutions 😊



Sudoku 11bis/14

- What is difficult for human-beings ?
 - to choose heuristics and places to reason upon
 - to apply heuristics consistently
 - to remember what has already been tried
 - to backtrack (what to undo? in which order ? until where ?)
- What is difficult for computers ?
 - to choose heuristics and places to reason upon

Sudoku: ~50 lines of a C++ program of 262 lines

```
static int disambiguate_board(int board[9][9]) {
    int game_solved = 0;
    int changed = 1;
    int invalid = 0;

    while ((changed) && (!invalid)) {
        game_solved = 0;
        changed = 0;
        for (int i = 0; i < 3; ++i) {
            for (int j = 0; j < 3; ++j) {
                int square_base_y = i*3;
                int square_base_x = j*3;
                for (int k = 0; k < 3; ++k) {
                    for (int l = 0; l < 3; ++l) {
                        int definite = 0;
                        for (int m = 1; m <= 9; ++m) {
                            if (onlies[m] == board[square_base_y+k][square_base_x+l]) definite = m;
                        }
                        if (definite) {
                            for (int n = 0; n < 3; ++n) {
                                for (int o = 0; o < 3; ++o) {
                                    if ((n != k) || (o != l)) {
                                        int before = board[square_base_y+n][square_base_x+o];
                                        board[square_base_y+n][square_base_x+o] &= negates[definite];
                                        if (before != board[square_base_y+n][square_base_x+o]) changed++;
                                        if (board[square_base_y+n][square_base_x+o] == 0x000) invalid++;
                                    }
                                }
                            }
                        }
                    }
                }
            }
        }
    }
}
```

```
for (int i = 0; i < 9; ++i) {
    for (int j = 0; j < 9; ++j) {
        int definite = 0;
        for (int m = 1; m <= 9; ++m) {
            if (onlies[m] == board[i][j]) definite = m;
        }
        if (definite) {
            for (int k = 0; k < 9; ++k) {
                if (k != i) {
                    int before = board[k][j];
                    board[k][j] &= negates[definite];
                    if (before != board[k][j]) changed++;
                    if (board[k][j] == 0x000) invalid++;
                }
            }
            if (k != j) {
                int before = board[i][k];
                board[i][k] &= negates[definite];
                if (before != board[i][k]) changed++;
                if (board[i][k] == 0x000) invalid++;
            }
        }
    }
}
for (int i = 0; i < 3; ++i) {
    for (int j = 0; j < 3; ++j) {
        for (int m = 1; m <= 9; ++m) {
            int count = 0;
            int posx = -1;
            int posy = -1;
            for (int k = 0; k < 3; ++k) {
                for (int l = 0; l < 3; ++l) {
                    int y = (i*3)+k;
                    int x = (j*3)+l;
                    if (board[y][x] & onlies[m]) {
                        posy = y;
                        posx = x;
                        count++;
                    }
                }
            }
        }
    }
}
```

Note the
number of
nested loops !!

The whole ECLiPSe-CLP demo program

```
:- lib(ic).
```

```
:- import alldifferent/1 from ic_global.
```

```
solve(SudokuName) :-  
    problem(SudokuName, Board),  
    print_board(Board),  
    sudoku(Board),  
    print_board(Board).
```

```
sudoku(Board) :-  
    dim(Board, [9,9]),  
    Board :: 1..9,  
    col_and_rows_all_diff(Board),  
    sub_square_all_diff(Board),  
    labeling(Board).
```

```
col_and_rows_all_diff(Board) :-  
    ( for(I, 1, 9),  
      param(Board)  
    do  
        Row is Board[I, 1..9],  
        alldifferent(Row),  
        Col is Board[1..9, I],  
        alldifferent(Col)  
    ).
```

```
sub_square_all_diff(Board) :-  
    ( multifer([I, J], 1, 9, 3),  
      param(Board)  
    do  
        ( multifer([K, L], 0, 2),  
          param(Board, I, J),  
          foreach(X, SubSquare)  
        do  
            X is Board[I+K, J+L]  
        ),  
        alldifferent(SubSquare)  
    ).
```

Two nested
loops only

```
print_board(Board) :-  
    dim(Board, [9,9]),  
    ( for(I,1,9), param(Board) do  
        ( for(J,1,9), param(Board,I) do  
            X is Board[I,J],  
            ( var(X) -> write(" _") ; printf(" %2d",  
              [X]) )  
        ),  
        nl  
    ),  
    nl.
```

```
%-----  
% Sample data
```

```
problem(sudoku1, [(  
    [(_,_, 2, _,_, 5, _, 7, 9),  
    [(1,_, 5, _,_, 3, _,_,_),  
    [(_,_,_,_,_, 6, _,_),  
    [(_, 1,_, 4, _,_, 9, _,_),  
    [(_, 9,_,_,_,_, 8, _,),  
    [(_,_, 4, _,_, 9, _, 1,_,),  
    [(_,_, 9,_,_,_,_,_,_),  
    [(_,_,_, 1,_,_, 3,_, 6),  
    [(6, 8,_, 3,_,_, 4,_,_)]).
```

Sudoku 14/14

- Which program is easier to understand ?
- Which one is easier to maintain ?
- Which one is easier to tune ?
- Which version is easier to write?
- Where does the “miracle” come from ?
 - The CLP version states what has to be done
 - A solver addresses how it is achieved, and in an optimized way
 - A lot of research and work has been invested in existing solvers : no need to re-invent the wheel

What is a constraint?

- Let X_1, \dots, X_n be a finite sequence of **variables**
- each associated with a set of possible values called its **domain**, D_1, \dots, D_n
- A constraint on X_1, \dots, X_n is a **relation**, included in $D_1 \times \dots \times D_n$
- Rm: **constraint \equiv relation \equiv equation**

Constraint programming

- 1. Modeling:** Formulate the problem as a finite set of constraints
 - a Constraint Satisfaction Problem (CSP)
- 2. Solving:** Solve the CSP
 - if possible by using a constraint programming system
- 3. Mapping:** Map the solution to the CSP to a solution to the original problem

The Constraint Satisfaction Problem

- An instance of the Constraint Satisfaction Problem (CSP) consists of
 - *a finite* set of variables, X_1, \dots, X_n ,
 - for each variable X_i a set of values, D_i , called its domain,
 - *a finite* set of constraints. Each restricts the values that the variables can simultaneously take.
 - Examples: $x \neq y$. $x + y \leq z$
- A total assignment maps each variable to an element in its domain.
 - It is a total function
- A solution to an instance of the constraint satisfaction problem is a total assignment that satisfies **all** the constraints.

The Constraint Satisfaction Problem

Given an instance of CSP the goal is usually **one of**

- determine whether the instance **has any** solutions
 - In that case the CSP is said **consistent** or **feasible**
 - find **any** solution
 - find **all** solutions
 - find a solution that **optimizes** some given objective function
 - Determine that there is no solution (refutation)
- Note that in many cases finding a solution (even if not optimal) is already very useful (and can already be a challenge)

Constraint **Logic** Programming

- The advantage of Constraint **Logic** Programming is that it offers both
 - backtracking
 - traversal of the **control flow** search space
 - constraint propagation
 - filtering/pruning of the **data** space

“Constraint” problems

- Puzzles
- **Planning and Scheduling**
 - Assignment problems
 - Jobshop Scheduling
 - Warehouse location
 - Ecologist traveler
 - Covering a square with smaller squares of different sizes.
 - Scheduling players for sport tournaments
 - Computing a staff roster
 - Airline crew scheduling
 - ...

Characteristics of “constraint” problems



- There are **no general methods or algorithms**
 - NP-completeness (cf complexity course)
- Different strategies and heuristics have to be tested
 - **different input data may lead to different strategies**
- Requirements are quickly changing
 - Programs should be flexible enough to adapt to these changes rapidly

Remarks

- Solvers significantly ease the resolution of “constraint problems”
 - Especially important for large complex problems

but

- Each solver has its own algorithms and heuristics in order to propagate constraints
- These algorithms and heuristics are in general quite complex
 - Choosing proper solvers is an issue
 - Choosing a relevant model is an issue
 - Using proper strategies inside the solvers is also an issue

Background knowledge is mandatory.

- **I recommend to follow some course, for example on ECLIPSE ELearning Website**
 - video lectures, slides, handouts and other material
 - 20 (!) chapters
 - **An impressive lists of applications**
 - by Helmut Simonis
 - <http://www.eclipseclp.org/ELearning/>