

Motivating  
Context

The Among  
constraint

Complexity

Conclusion

# Multi-Agent Low Range Sensing and the Among Constraint

SWIM 2011

Gilles Chabert, Frédéric Boyer, Sophie Demassey

15 June 2011

Motivating  
Context

The Among  
constraint

Complexity

Conclusion

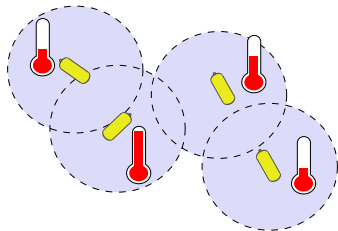
- 1 Motivating Context
- 2 The Among constraint
- 3 Complexity
- 4 Conclusion

# Motivating Context

Consider  $N$  agents using emitters/receivers

Signal :

- with low range
- omnidirectional
- satisfying a superimposition principle



Motivating  
Context

The Among  
constraint

Complexity

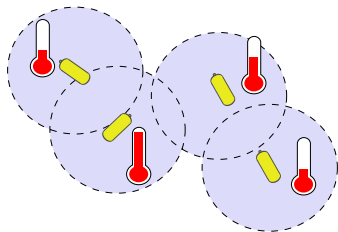
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Motivating  
Context

The Among  
constraint

Complexity

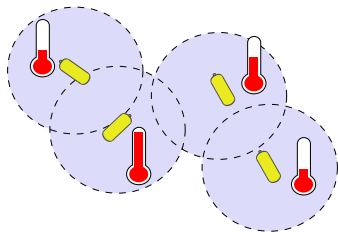
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Motivating  
Context

The Among  
constraint

Complexity

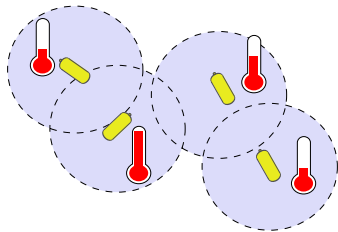
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Motivating  
Context

The Among  
constraint

Complexity

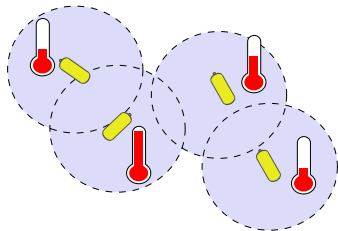
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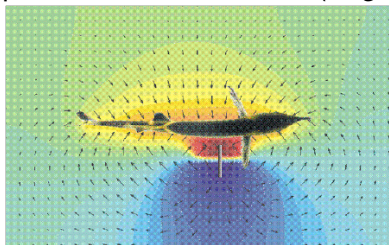
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The example of the electric sense (*Angels project*)



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Motivating  
Context

The Among  
constraint

Complexity

Conclusion

Given the state (position) of  $n$  agents  $x_1, \dots, x_N$ .

Evolution equation :

$$\dot{x} = \begin{pmatrix} \dot{x}_1 \\ \vdots \\ \dot{x}_n \end{pmatrix} = f(x, u) = \begin{pmatrix} f_1(x_1, u) \\ \vdots \\ f_n(x_n, u) \end{pmatrix}$$

Observation equation (example) :

$$y = \begin{pmatrix} y_1 \\ \vdots \\ y_n \end{pmatrix} = g(x, u) = \begin{pmatrix} \left( \sum_{i \neq 1} \frac{1}{\|x_i - x_1\|^k} \right) \\ \vdots \\ \left( \sum_{i \neq N} \frac{1}{\|x_i - x_n\|^k} \right) \end{pmatrix}$$

SLAM is difficult since  $g$  is hard to inverse



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Motivating  
Context

The Among  
constraint

Complexity

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Motivating  
Context

The Among  
constraint

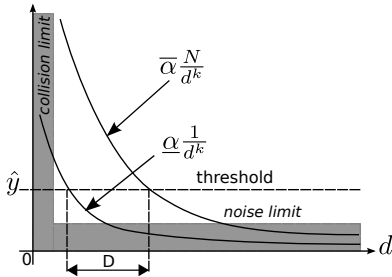
Complexity

Conclusion

- 1 Motivating Context
- 2 The Among constraint**
- 3 Complexity
- 4 Conclusion

# The Among constraint

Obtention of a *detection* distance  $D$  for robot  $n^{\circ}i$  :



Motivating  
Context

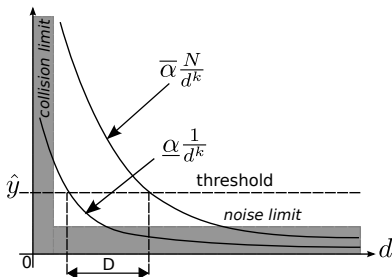
The Among  
constraint

Complexity

Conclusion

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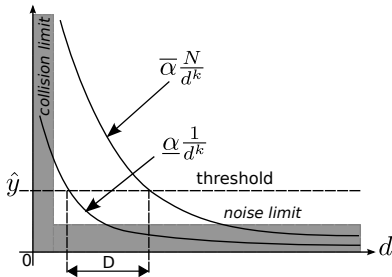
Obtention of a *detection* distance  $D$  for robot  $n^{\circ}i$  :



If  $y_i > \hat{y}$  at least one agent is at distance  $< \bar{D}$   
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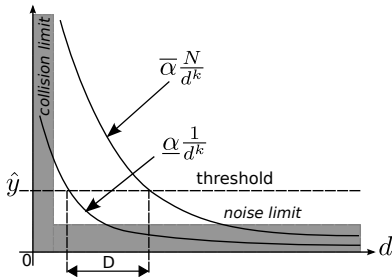
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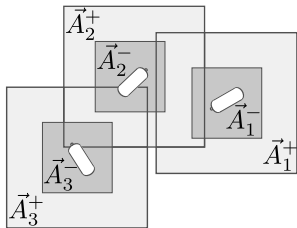
⇒ This is an example of a new (here : boolean-valued)  
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⇒ Very similar to Jaulin's approach (range only SLAM)

# The Among constraint

## Inversion by hand (example)

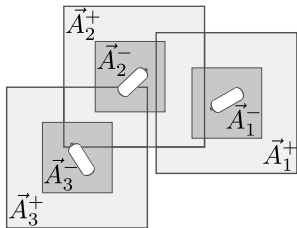
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$$y_2 < \hat{y}$$

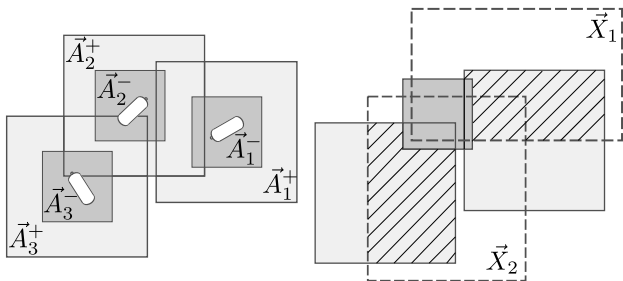
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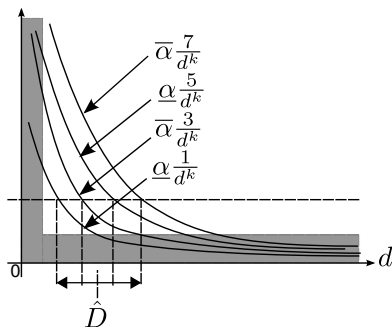
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$$y_3 > \hat{y}$$

# The Among constraint

Now, the  $y$  function can be further discretized.



If no agent is less distant than  $\hat{D}$  from the beacon then :  
 $y_i > \hat{y} \implies$  there is between 3 and 7 agents at distance  $< \bar{D}$

# The Among constraint

This leads to the following generalization :

## Generalization

Let :

$(\vec{x}_j)_{j \in J}$  be variables (*agents positions*)

$\vec{V}$  be value domains (*detection areas*)

$K$  a discrete interval (*bounds on the number of detected agents*)

Motivating  
Context

The Among  
constraint

Complexity

Conclusion

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In fact, we have here a conjunction of `among` (*as many as agents playing the role of beacons*).

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Motivating  
Context

The Among  
constraint

**Complexity**

Conclusion

- 1 Motivating Context
- 2 The Among constraint
- 3 Complexity**
- 4 Conclusion

State of the art on the satisfiability of conjunctions of among :

- NP-Complete when  $V_i$  are not necessarily intervals
- But polynomial if they are all disjoint
- ... and when  $V_i$  are non-disjoint intervals ?
- ... and in dimension  $> 1$  ?

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Motivating  
Context

The Among  
constraint

Complexity

Conclusion



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Context

The Among  
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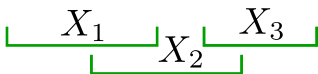
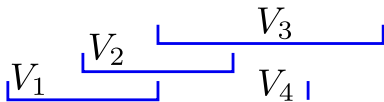
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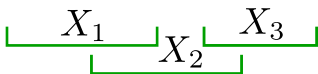
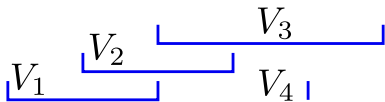


The SACAMI problem

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The SACAMI problem

SACAMI is NP-complete in dimension  $> 1$

Motivating  
Context

The Among  
constraint

Complexity

Conclusion

Transformation from NVECTOR.

SACAMI is NP-complete in dimension  $> 1$

Transformation from NVECTOR.

*Input*:  $([x]_1, \dots, [x]_n, k)$ .

Motivating  
Context

The Among  
constraint

Complexity

Conclusion

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Motivating  
Context

The Among  
constraint

Complexity

Conclusion

## Transformation from NVECTOR.

*Input* :  $([x]_1, \dots, [x]_n, k)$ .

*Question* : does exist  $x_i \in [x]_i$  such that

$$\text{nvector}((x_1, \dots, x_n), k)?$$

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Motivating  
Context

The Among  
constraint

Complexity

Conclusion

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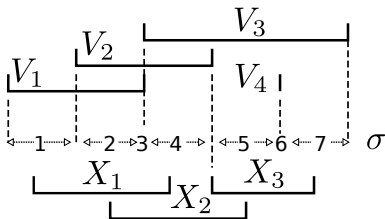
$$\text{nvector}((x_1, \dots, x_n), k)?$$

*New Question* : does exist  $y_i \in \bigcup_{j=1}^n [x]_j$ ? such that

$$\begin{array}{c} \text{among}((y_1, \dots, y_k), [x]_1, [1, k]) \\ \wedge \\ \text{among}((y_1, \dots, y_k), [x]_n, [1, k]) \end{array} ?$$



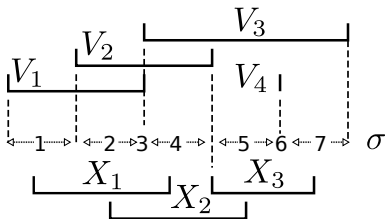
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We will count the number of variables that take their values inside the slice "s".  
Let  $y_s = |\{j \in J, x_j = s\}|$ .

- (1) is a linear program solvable in polynomial time
- (2) is polynomial (Regin's theorem)
- What about the conjunction of both ?

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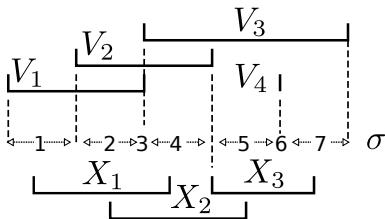
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Motivating  
Context

The Among  
constraint

Complexity

Conclusion



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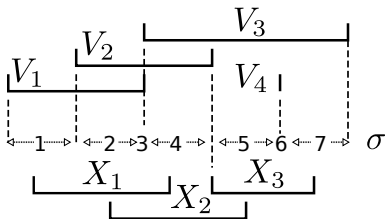
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Motivating  
Context

The Among  
constraint

Complexity

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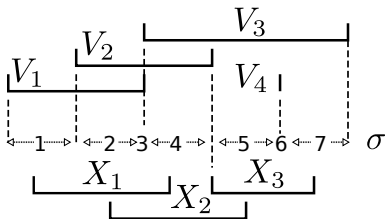
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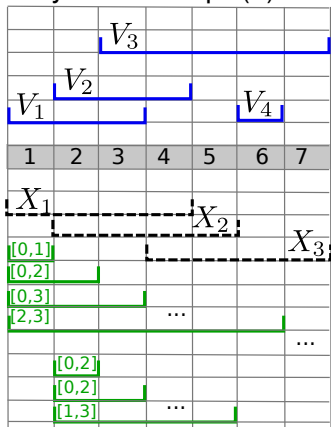
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Key idea : "drop" (2) and "inflate" (1) :

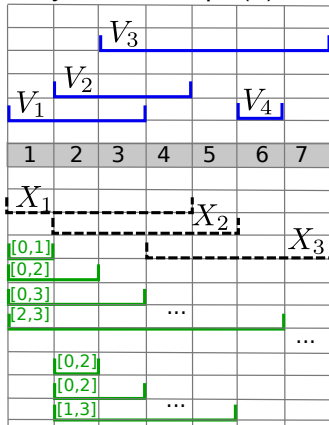


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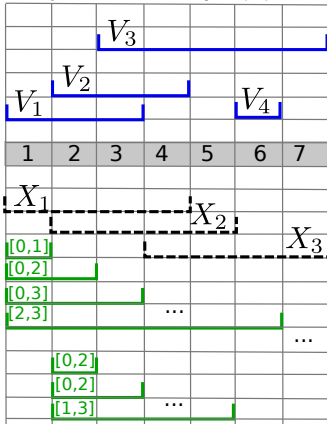
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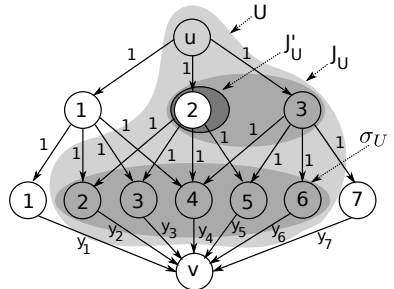
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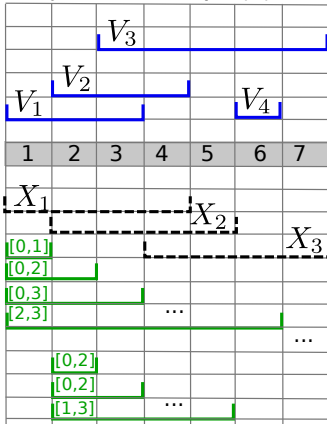


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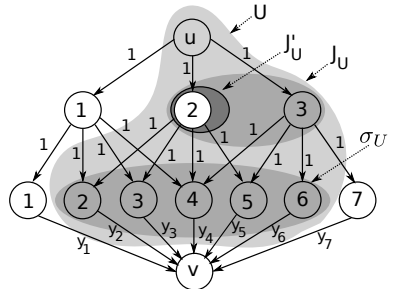


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Motivating  
Context

The Among  
constraint

Complexity

Conclusion

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- 2 The Among constraint
- 3 Complexity
- 4 Conclusion**

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Motivating  
Context

The Among  
constraint

Complexity

Conclusion

- We have generalized Jaulin's idea of detection/no-detection constraint introducing the among **constraint**
- This makes unexpected connections with other fields of research (logistics)
- We have studied the complexity of a conjunction of among
- It is NP-hard with vector domains
- And polynomial in the one-dimensional case
- A filtering algorithm (not using Simplexe !) has been set up
- This technique will be implemented with the electric sense in the Angels project

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Context

The Among  
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Complexity

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Context

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Context

The Among  
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