

# How to write and prove programs with constraints and linear logic?

Thierry Martinez  
Contraintes Project-Team

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# “Contraintes” project-team

**Topic** Formal semantics for programming languages

**Methods** Logic and constraints

- Applications**
- ▶ Solving/optimization of combinatorial problems
  - ▶ Systems Biology

# “Contraintes” project-team

**Topic** Formal semantics for programming languages  
modeling

**Methods** Logic and constraints

- Applications**
- ▶ Solving/optimization of combinatorial problems
  - ▶ Systems Biology







# Sudoku

We probably all know the rules of the Sudoku...

- ▶ for every line  $i$  and every column  $j$ , the case  $(i, j)$  should have a value  $1 \leq X_{(i,j)} \leq 9$ .

	0	1	2	3	4	5	6	7	8
0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
2	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
4	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
5	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
6	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
7	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
8	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>

- ▶ for every line  $i$  and every pair  $(j, k)$  of distinct columns, we should have  $X_{(i,j)} \neq X_{(i,k)}$ .
- ▶ for every column  $i$  and every pair  $(j, k)$  of distinct lines, we should have  $X_{(j,i)} \neq X_{(k,i)}$ .

# Sudoku

We probably all know the rules of the Sudoku...

- ▶ for every line  $i$  and every column  $j$ , the case  $(i, j)$  should have a value  $1 \leq X_{(i,j)} \leq 9$ .

	0	1	2	3	4	5	6	7	8
0	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
1	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
2	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
3	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
4	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
5	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
6	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>	<input type="checkbox"/>
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- ▶ for every line  $i$  and every pair  $(j, k)$  of distinct columns, we should have  $X_{(i,j)} \neq X_{(i,k)}$ .
- ▶ for every column  $i$  and every pair  $(j, k)$  of distinct lines, we should have  $X_{(j,i)} \neq X_{(k,i)}$ .
- ▶ for every  $3 \times 3$ -block  $(i, j)$  and every distinct cases  $(m, n)$  and  $(m', n')$  in this block, we should have  $X_{3 \times (i,j) + (m,n)} \neq X_{3 \times (i,j) + (m',n')}$ .



# Sudoku

We probably all know the rules of the Sudoku...

- ▶  $\forall ij \in \{0 \dots 8\}, 1 \leq X_{(i,j)} \leq 9$
- ▶  $\forall ijk \in \{0 \dots 8\}, j \neq k \Rightarrow X_{(i,j)} \neq X_{(i,k)}$

Logical formulas

- ▶  $\forall ijk \in \{0 \dots 8\}, j \neq k \Rightarrow X_{(j,i)} \neq X_{(k,i)}$
- ▶  $\forall ijmnm'n' \in \{0 \dots 2\}, (m, n) \neq (m', n') \Rightarrow X_{3 \times (i,j) + (m,n)} \neq X_{3 \times (i,j) + (m',n')}$

## Constraints

- ▶ Constraints = atomic formulas,  $X_{(1,1)} \neq X_{(1,2)}$
- ▶ Model = conjunction of constraints

$$\bigwedge \text{constraints} \Rightarrow \text{solution}$$

- ▶ Constraints formalized as relations:

$$"X_{(1,1)} \neq X_{(1,2)}" = \{(X_{(i,j)})_{0 \leq i \leq 8, 0 \leq j \leq 8} \mid X_{(1,1)} \neq X_{(1,2)}\}$$

- ▶ The set of solutions is the intersection

$$\bigcap \{\text{relations}\} = \{\text{set of solutions}\}$$

- ▶ Explicit representation is intractable

## Domain and propagation

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

## Domain and propagation

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

Domain:

x → 

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

## Domain and propagation

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

Domain:

x	→	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---	---

## Domain and propagation

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

Domain:

x → 

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

## Domain and propagation

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

Domain:

x → 

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

## Domain and propagation

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

Domain:

$x \rightarrow$ 

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



## Domain and propagation

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

## Domain and propagation

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

There exists  $x \in 1, \dots, 9$  such that  $c_x = 1$ .

$x \longrightarrow$ 

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

## Domain and propagation

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

There exists  $x \in 1, \dots, 9$  such that  $c_x = 1$ .

$x \longrightarrow$ 

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

## Domain and propagation

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

There exists  $x \in 1, \dots, 9$  such that  $c_x = 1$ .

$x \longrightarrow$ 

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

## Domain and propagation

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

There exists  $x \in 1, \dots, 9$  such that  $c_x = 1$ .

$x \longrightarrow$ 

1	2	3	4	5	6	7	8	9
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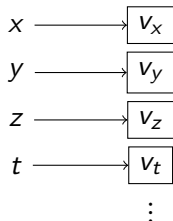
## Domain and propagation

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

# Memory paradigm shift

## RAM model

Addresses/  
Variables

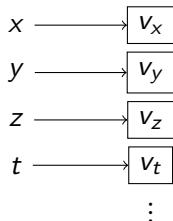


- ▶ Imperative paradigm:  
assigns many, reads many
- ▶ Functional paradigm:  
assigns once, reads many

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

There exist  $x, y, z, t \dots$  such that

increasing  
knowledge

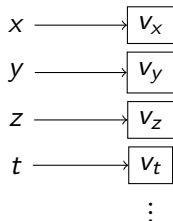
A vertical arrow pointing downwards, indicating that the amount of knowledge increases as the model progresses.



# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

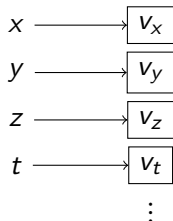
There exist  $x, y, z, t \dots$  such that  
 $x \in \{1, \dots, 15\}$

increasing  
knowledge ↓

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

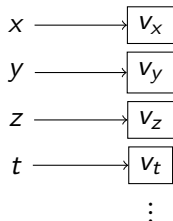
There exist  $x, y, z, t \dots$  such that  
 $x \in \{1, \dots, 15\}$  and  
 $y \in \{5, \dots, 50\}$

increasing  
knowledge ↓

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

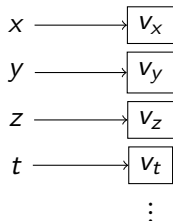
There exist  $x, y, z, t \dots$  such that  
 $x \in \{1, \dots, 15\}$  and  
 $y \in \{5, \dots, 50\}$  and  
 $y \leq x$

increasing  
knowledge ↓

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

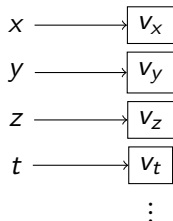
There exist  $x, y, z, t \dots$  such that  
 $x \in \{15, \dots, 15\}$  and  
 $y \in \{5, \dots, 50\}$  and  
 $y \leq x$

increasing  
knowledge

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

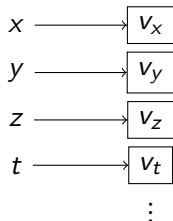
There exist  $x, y, z, t \dots$  such that  
 $x \in \{~~1~~5, \dots, 15\}$  and  
 $y \in \{5, \dots, ~~50~~15\}$  and  
 $y \leq x$

increasing  
knowledge

# Memory paradigm shift

RAM model

Addresses/  
Variables



Constraint memory model  
(Partial information)

There exist  $x, y, z, t \dots$  such that  
 $x \in \{~~1~~5, \dots, 15\}$  and  
 $y \in \{5, \dots, ~~50~~15\}$  and  
 $y \leq x$  and  
 $z \in \mathbb{Q} \cap [5, 9]$   
and more...

increasing  
knowledge ↓

## Propagation power

1	2	3	x	5	y	7	8	9
4			7				2	3
7			z	2				
2	1					8		7
3		5	8	9	7	2	1	
8		7	2	1		3		5
5	3	2				9	7	8
6		1	9	7			3	2
9	7				2			

x → 

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

y → 

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

z → 

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

## Propagation power

1	2	3	x	5	y	7	8	9
4			7				2	3
7			z	2				
2	1					8		7
3		5	8	9	7	2	1	
8		7	2	1		3		5
5	3	2				9	7	8
6		1	9	7			3	2
9	7				2			

x → 1 2 3 4 5 6 7 8 9

y → 1 2 3 4 5 6 7 8 9

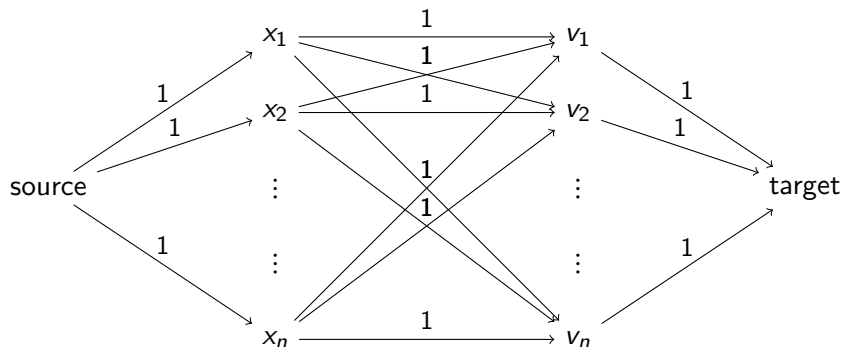
z → 1 2 3 4 5 6 7 8 9



## Propagation power

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

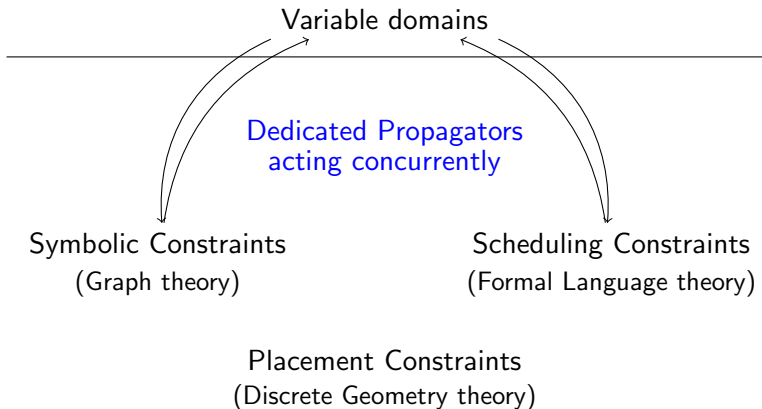
## Flow-network algorithm



Residual network of Ford-Fulkerson: reduced domain

# Concurrent programming framework

## Constraint Model

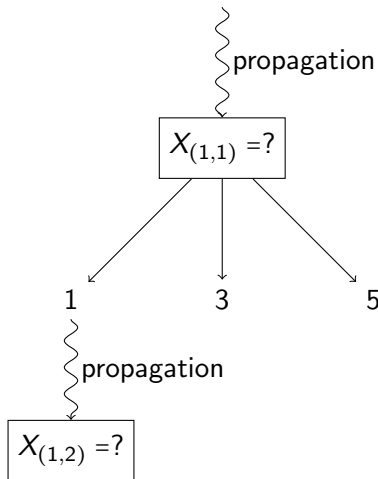


## NP-completeness

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

Propagators are polynomial. Finding a solution is NP-complete.

## Propagation and search



### Andorra Principle

Do the deterministic bits first.

## Conjunction and disjunction

- ▶ In constraint programming, “and” between constraint
  
- ▶ “or” to express choices: in Sudoku,  
 $X_{(1,1)} = 1 \vee X_{(1,1)} = 2 \vee \dots \vee X_{(1,1)} = 9$

# Logic programming: logic as a programming language

- ▶ Abstracting programming traits: concurrency, non determinism...
  
- ▶ Every computation is the search for a proof

Programs = Logical formulas

Execution = Proof search

What is a proof for a conjunction?

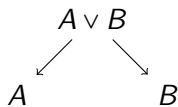
$$\frac{\frac{\vdots}{A} \quad \frac{\vdots}{B}}{A \wedge B}$$



What is a proof for a disjunction?

$$\frac{\vdots}{A} \\ \hline A \vee B$$

$$\frac{\vdots}{B} \\ \hline A \vee B$$



## The logical implication as synchronization mechanism

$$\frac{\frac{\vdots}{A} \quad \frac{\vdots}{A \Rightarrow B}}{B}$$

## Logic operators as programming constructs

- ▶ “and”,  $\wedge$ : parallel composition
- ▶ “or”,  $\vee$ : non-deterministic choice
- ▶ “implies”,  $\Rightarrow$ : synchronization between parallel tasks (wait)
- ▶ “exists”,  $\exists$ : introducing local variables
- ▶ elementary formulas: constraints, for adding knowledge about variables

To implement propagators, need to update domains (imperative features).

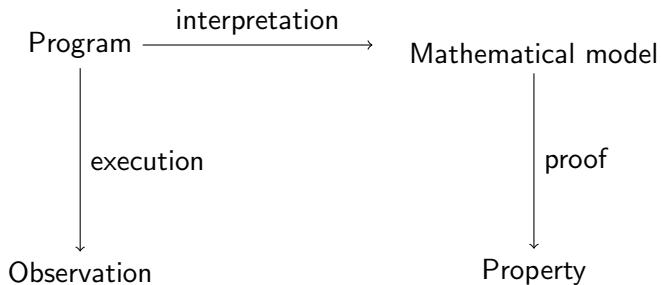
# The Linear Concurrent Constraint Programming project

- ▶ Linear logic (Girard, 87): logic where formulas are resources
- ▶ Linear implication  $A \multimap B$  is a process which transforms and consumes  $A$  to produce  $B$
- ▶ Synchronization mechanism relying on linear implication updates the knowledge by removing some hypotheses

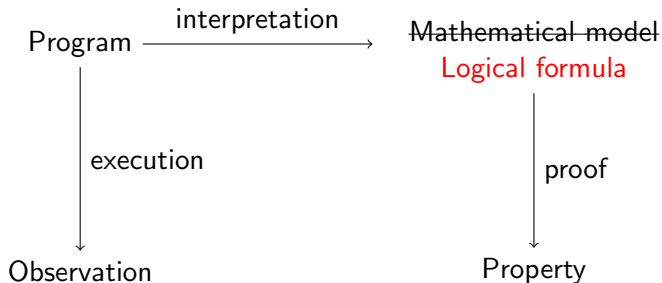
# Linear logic as a concurrent programming language

- ▶ Constraints = messages, with partial knowledge
- ▶ Logic variables = communication channel
- ▶ Existential operator ( $\exists$ ) = channel locality
- ▶ Universal operator ( $\forall$ ) = generic synchronization  
( $\forall x(a(x) \multimap \dots)$ )

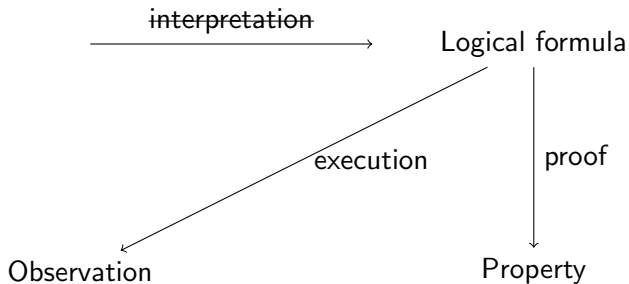
# Semantics of programming languages



# Semantics of programming languages

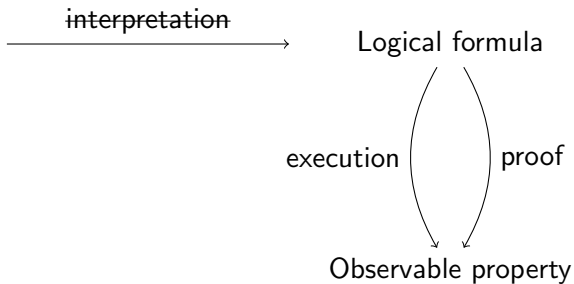


# Semantics of programming languages

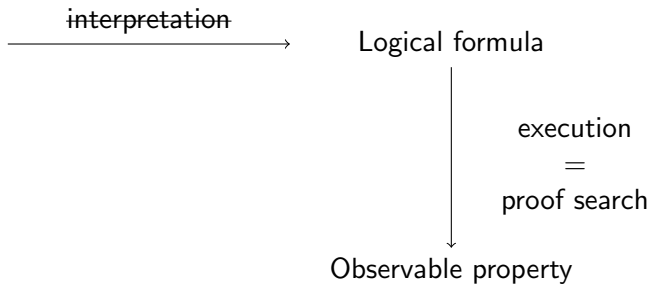




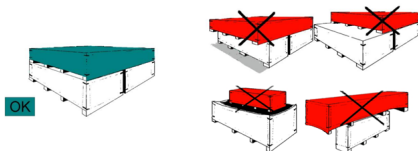
# Semantics of programming languages



# Semantics of programming languages



# Warehouse bin-packing



Box placements in containers:

- ▶ variables = box positions
- ▶ constraints = weight distribution, gravity...

Industrial partnerships with PSA, Fiat...

## Optimizing energy in underground trains timetable

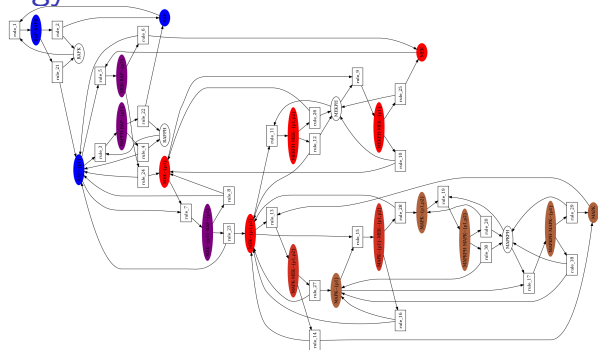


Reduce energy consumption by slight timetable shifting:

- ▶ variables = time shift
- ▶ constraints = energy limit

Industrial partnership with General Electrics

# Analysis of large graphs of reaction networks in Systems Biology



Model analysis for conservation laws, dead-locks, comparisons between models.

- ▶ variables = molecules / vertices
- ▶ constraints = graph structure

Industrial partnership with Dassault Systeme

## The design and the implementation of LCC

**Design** Selection of the right logical fragment of linear logic for modular programming, re-use of code, imperative traits...

**Implementation** The LCC compiler (and a compiler for a modular extension of Prolog), with efficient algorithms for proof search

**Output** Compiler for a new programming language for concurrent, imperative and constraint programming.  
Mono-paradigm: semantics driven by proof theory.

That's all folks!

Thank you!  
Let's go for questions.