



# High-Level Implementation of Consistency Techniques

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# Motivation

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Propagation behaviour in CP systems:

- Strength/cost of propagation hard-wired
  - only occasionally configurable
- System-specific set of implemented constraints
  - no standard set of global constraints
  - but constraint catalog lists 235 of them [Beldiceanu et al]
- Efficient propagation algorithms are constraint-specific
  - take a long time to develop
- Implemented procedurally or via rules
  - correctness/mainainability

→ declarative prototyping facility can be useful



# Overview

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- Constraint definitions
- Reification and its shortcomings
- GP - Generalised Propagation
- Applications of GP
- GP Algorithm

# Constraint definitions

- Basic constraints, e.g. equality, domains (decidable)

```
x=5, Y::1..9
```

- Built-in constraints (e.g. bounds/arc consistent)

```
x #>= 3*y+7, alldifferent([X,Y,Z])
```

ECLiPSe Syntax

- User-defined constraints

- Extensional definition (table, disjunctive)

```
% product(Name,Resource1,Resource2,Profit)
```

```
product(101, 3, 7, 36).
```

```
...
```

```
product(999, 5, 2, 23).
```

- Intensional definition (logical combinations of built-in constraints)

```
no_overlap(S1,S2,D) :-
```

```
S1+D #>= S2 ; S2+D #>= S1.
```



# Propagation choices

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## When?

- Once before search (preprocessing)
- Whenever a variable gets instantiated
- Whenever a domain is reduced
- More/Less urgently than other constraints

## What?

- Just check current assignment
- Derive further instantiations
- Derive domain reductions

## Where?

- Per constraint
- Sub-problem
- Whole problem



Well known:

## User-defined Constraints via “reification”

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The system must provide “reified” versions of constraints, e.g.

$$\begin{aligned} =\langle (X, Y, B) \Leftrightarrow & \quad X =\langle Y \quad \text{iff} \quad B=1 \\ & \quad X > Y \quad \text{iff} \quad B=0 \end{aligned}$$

The Boolean represents the truth value of the constraint.

Similar to Big-M constraints in MIP.

Reified primitives can be connected by combining Booleans:

$$\#=\langle (X+7, Y, B1), \#=\langle (Y+7, X, B2), B1+B2 \#>= 1.$$

The Boolean can be hidden under syntactic sugar:

$$X+7 \#=\langle Y \quad \text{or} \quad Y+7 \#=\langle X.$$





# Generalised Propagation (GP)

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**A generic algorithm to extract information  
from disjunctive specifications**

```
c(1,2) .
```

```
c(1,3) .
```

```
c(3,4) .
```

```
?- c(X,Y) infers fd.
```

```
X = X{[1, 3]}
```

```
Y = Y{2 .. 4}
```

**First described in [LeProvost&Wallace 93]**

**Implemented in ECLiPSe system as library “propia”**





# The *infers* Annotation

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GP annotation says what you want to infer:

- Goal *infers* **Language**

Use strongest available representation in Language (e.g. fd for finite domains) covering all solutions

Weaker (and cheaper) variants are available

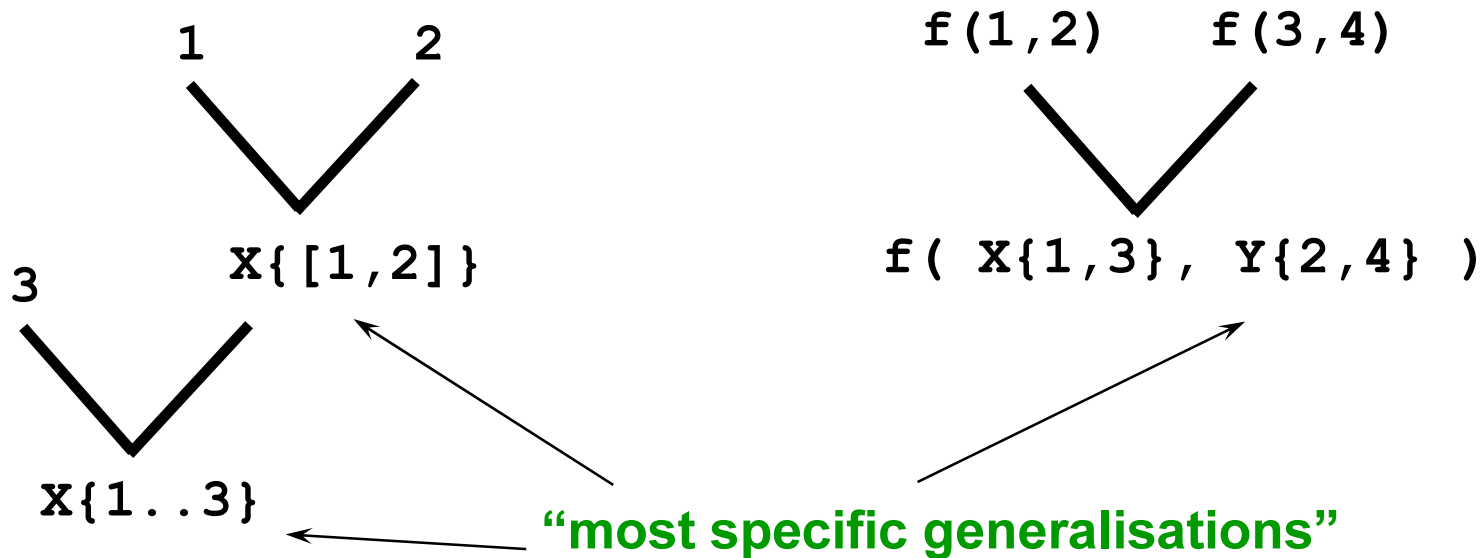
- Goal *infers* **consistent**

Fail as soon as inconsistency can be proven

- Goal *infers* **unique**

Instantiate as soon as unique solution exists

# Most Specific Generalisation over Finite Domains and Structured Terms





# Arc consistency (i)

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- Arc consistency from extensional definition:

```
% extensional constraint spec
```

```
c(1,2).
```

```
c(1,3).
```

```
c(3,4).
```

```
% arc-consistent version
```

```
ac_c(X,Y) :- c(X,Y) infers fd.
```

```
?- ac_c(X, Y).
```

```
X = X{[1, 3]}
```

```
Y = Y{[2..4]}
```

```
There is 1 delayed goal.
```

```
?- ac_c(X, Y), X = 1.
```

```
X = 1
```

```
Y = Y{[2,3]}
```

```
There is 1 delayed goal.
```

# Constructive disjunction with GP

The inferences from disjunctive branches are merged constructively:

```
?- [A,B]::1..10, (A + 7 #=< B ; B + 7 #=< A) infers fd.  
                1..3      8..10  1..3      8..10
```

```
A = A{ [1 .. 3, 8 .. 10] }  
B = B{ [1 .. 3, 8 .. 10] }
```

Note difference with reification – no inference because neither side is (dis)entailed:

```
?- [A,B]::1..10, (A + 7 #=< B or B + 7 #=< A) .  
  
A = A{1 .. 10}  
B = B{1 .. 10}
```



## Arc-consistency (ii)

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Arc consistency on top of weaker consistency (e.g. test, forward checking)

```
ac_constr(Xs) :-  
    (  
        weak_constr(Xs),  
        labeling(Xs)  
    ) infers fd.
```

Or, usually more efficient:

```
ac_constr(Xs) :-  
    (  
        weak_constr(Xs),  
        member(X, Xs),  
        indomain(X),  
        once labeling(Xs)  
    ) infers fd.
```



# Singleton Arc-consistency

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Singleton arc consistency from arc consistency, on a subproblem:

```
sac_constr(Xs) :-  
    (  
        ac_constr(<some Xs>), ..., ac_constr(<some Xs>),  
        member(X, Xs),  
        indomain(X)  
    ) infers ic.
```

If performed on the whole problem, simpler variant: *shaving*

```
shave(Xs) :-  
    ( foreach(X,Xs) do  
        findall(X, indomain(X), Values),  
        X :: Values  
    ).
```

Shaving often effective as a preprocessing step before actual search.

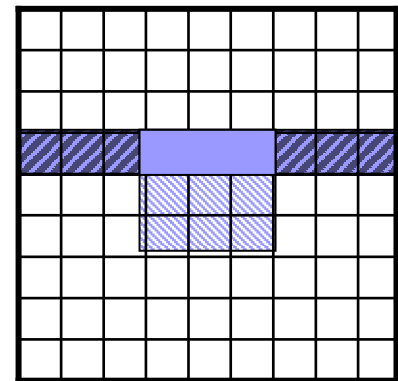
E.g. sudoku solvable with ac-alldifferent and shaving – no deep search needed [Simonis].

# Arc-consistency from arc-consistency

Combining constraints to form a sub-problem.  
Make result arc-consistent again:

E.g. a constraint for sudoku:

```
overlapping_alldifferent(Xs, Ys) :-  
    intersect(Xs, Ys, Overlaps),  
    (  
        alldifferent(Xs), alldifferent(Ys),  
        labeling(Overlaps)  
    ) infers ic.
```





# GP Applications Summary

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- Disjunctive combinations
  - extensional or intensional constraint definitions
- Factoring subproblems
  - effectively create problem-specific global constraints
  - approximate their solution set repeatedly
  - export that approximation repeatedly to the full problem
- Conjunctive combination of overlapping constraints
  - to form larger global constraints
- Prototyping AC constraints
  - expensive when done naively, need good generic GP algorithm
  - better to use a less disjunctive specification, see below

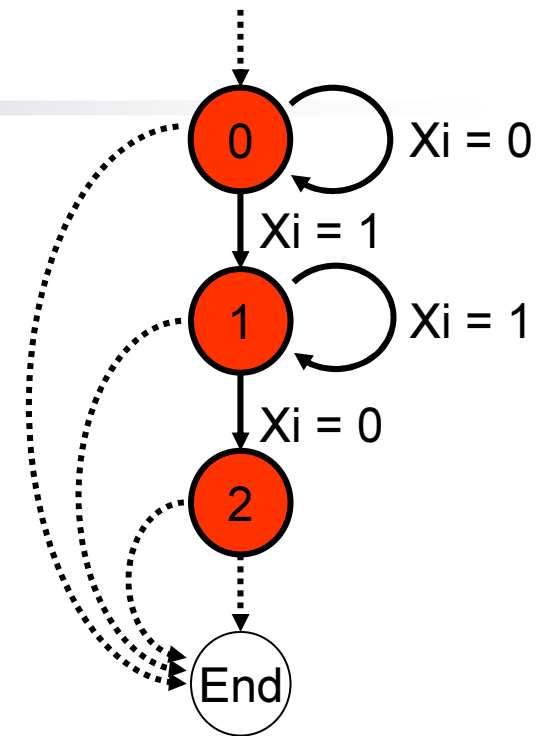


# Graph/automaton method (i)

- Beldiceanu et al, 2004:  
Deriving Filtering Algorithms from Constraint Checkers

```
global_contiguity(Xs) :-
```

```
    StateEnd :: 0..2,  
    (  
        fromto(Xs, [X|Xs1], Xs1, []),  
        fromto(0, StateIn, StateOut, StateEnd)  
    do  
        (  
            StateIn = 0, (X = 0, StateOut = 0 ; X = 1, StateOut = 1 )  
            ;  
            StateIn = 1, (X = 0, StateOut = 2 ; X = 1, StateOut = 1 )  
            ;  
            StateIn = 2, X = 0, StateOut = 2  
        )  
    ) infers ac  
).
```

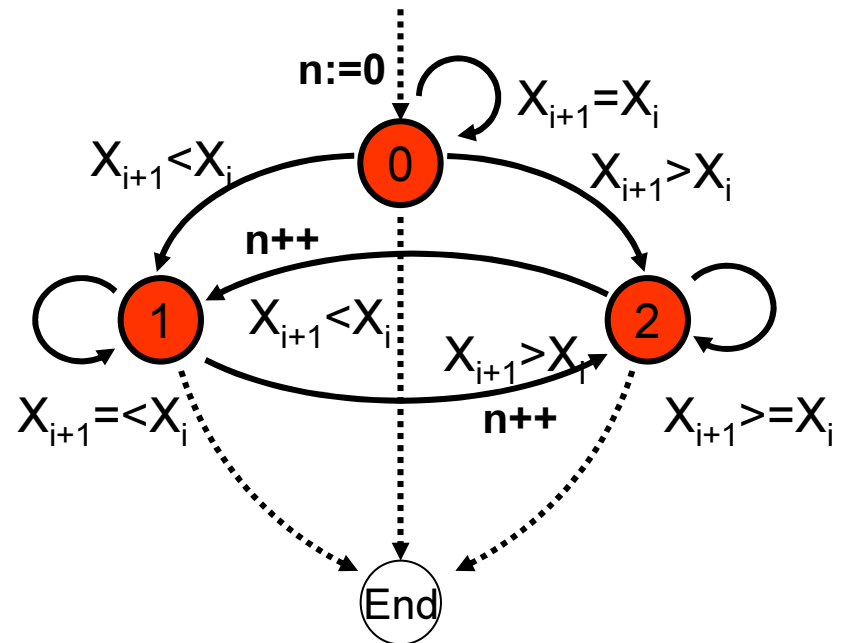


# Graph/automaton method (ii)

```

inflexion(N, Xs) :-
  StateEnd :: 0..2,
  (
    fromto(Xs, [X1,X2|Xs1], [X2|Xs1], [_]),
    foreach(Ninc, Nincs),
    fromto(0, StateIn, StateOut, StateEnd)
  do
    (X1 #< X2) #= (Sig #= 1),
    (X1 #= X2) #= (Sig #= 2),
    (X1 #> X2) #= (Sig #= 3),
    ( StateIn = 0,
      ( Sig=1, Ninc=0, StateOut=1
        ; Sig=2, Ninc=0, StateOut=0
        ; Sig=3, Ninc=0, StateOut=2 )
    ; StateIn = 1,
      ( Sig=1, Ninc=0, StateOut=1
        ; Sig=2, Ninc=0, StateOut=1
        ; Sig=3, Ninc=1, StateOut=2 )
    ; StateIn = 2,
      ( Sig=1, Ninc=1, StateOut=1
        ; Sig=2, Ninc=0, StateOut=2
        ; Sig=3, Ninc=0, StateOut=2 )
    ) infers ac
  ),
  N #= sum(Nincs).

```





# Naïve GP Algorithm

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## Goal infers Language

Find all solutions to Goal, and put them in a set

Find the most specific generalisation of all the terms in the set

E.g. `member(X, [1,2,3])` infers `fd`

Find all solutions to `member(X,[1,2,3])`: `{1,2,3}`

Find the most specific generalisation of `{1,2,3}`: `X{ [1,2,3] }`

Efficient when all solutions can be tabled.



# Robust GP Algorithm: Topological B&B

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Goal infers Language

Find one solution **S** to Goal

The current most specific generalisation **MSG = S**

Repeat

    Find a solution **NewS** to Goal

        which is NOT an instance of **MSG**

    Find the most specific generalisation **NewMSG**

        of **MSG** and **NewS**

**MSG := NewMSG**

until no such solution remains



# Resources

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- Functionality available in the ECLiPSe system
  - Main web site [www.eclipse-clp.org](http://www.eclipse-clp.org)
  - Tutorial, papers, manuals, mailing lists
  - Sources at [www.sourceforge.net/eclipse-clp](http://www.sourceforge.net/eclipse-clp)
- ECLiPSe is open-source (MPL) and freely usable
  - Owned/sponsored by Cisco Systems
- References
  - T. Le Provost, M. Wallace: "Generalised Constraint Propagation Over the CLP Scheme", Journal of Logic Programming, 16/3, 1993.
  - N. Beldiceanu, M. Carlsson, T. Petit, "Deriving Filtering Algorithms from Constraint Checkers", CP2004, LNCS, Springer, 2004.