

# Program Verification using Constraint Handling Rules and Array Constraint Generalizations

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Workshop on:  
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- Encoding partial correctness of array programs into CLP programs.
- (A) Generation of the verification conditions  
(i.e., removal of the interpreter).
- (B) Check of satisfiability of the verification conditions  
via CLP program transformation.
- Manipulation of Array Constraints  
via Constraint Handling Rules (CHR).
- Experimental evaluation.

Proving partial correctness: our method

# Proving Partial Correctness of Imperative Programs

Consider a **program** and a **partial correctness triple**:

```
prog: while(x < n) {  
    x = x + 1;  
    y = y + 2;  
}
```

 $\{ x = 0 \wedge y = 0 \wedge n \geq 1 \}$ 

prog

 $\{ y > x \}$ 

(A) Generate the **Verification Conditions** (VC's)

- |    |   |                |
|----|---|----------------|
| 1. | $x = 0 \wedge y = 0 \wedge n \geq 1 \rightarrow P(x, y, n)$                 | Initialization |
| 2. | $P(x, y, n) \wedge x < n \rightarrow P(x + 1, y + 2, n)$                    | Loop           |
| 3. | $P(x, y, n) \wedge x \geq n \wedge y \leq x \rightarrow \textit{incorrect}$ | Exit           |

(B) If the VC's are **satisfiable** (i.e., there is an interpretation for  $P(x, y, n)$  that makes 1, 2, and 3 true), then the **partial correctness triple** holds.

# The CLP Transformation Method

(A) Generate the VC's as a CLP program **from the partial correctness triple and the definition of the semantics**:

$V$ : 1\*.  $p(X,Y,N) :- X=0, Y=0, N \geq 1.$  (a constrained fact)  
2\*.  $p(X1,Y1,N) :- X < N, X1=X+1, Y1=Y+2, p(X, Y, N).$   
3\*. **incorrect**  $:- X \geq N, Y \leq X, p(X, Y, N).$

Theorem: The VC's are **satisfiable** iff **incorrect**  $\notin$  **the least model**  $M(V)$ .

(B) Apply transformation rules that **preserve the least model**  $M(V)$ .

$V'$ : 4.  $q(X1, Y1, N) :- X < N, X > Y, Y \geq 0, X1=X+1, Y1=Y+2, q(X, Y, N).$   
5. **incorrect**  $:- X \geq N, Y \leq X, Y \geq 0, N \geq 1, q(X, Y, N).$

least model preserved: **incorrect**  $\notin M(V)$  iff **incorrect**  $\notin M(V')$

no constrained facts for  $q$ : **incorrect**  $\notin M(V')$

Thus,  $\{x=0 \wedge y=0 \wedge n \geq 1\} \text{ prog } \{y > x\}$  holds.

Encoding partial correctness  
of array programs into CLP

# Encoding Partial Correctness into CLP

Consider the triple  $\{\varphi_{init}\} prog \{\neg\varphi_{error}\}$ .

A program  $prog$  is **incorrect** w.r.t.  $\varphi_{init}$  and  $\varphi_{error}$

if a final configuration satisfying  $\varphi_{error}$

is reachable from an initial configuration satisfying  $\varphi_{init}$ .

Definition ( the interpreter  $Int$  with the transition predicate  $tr(X,Y)$  )

$reach(X) :- \text{initConf}(X).$

$reach(Y) :- tr(X,Y), reach(X).$

**incorrect**  $:- \text{errorConf}(X), reach(X).$

+ clauses for  $tr$  (i.e., the operat. semantics of the programming language)

## Theorem

$prog$  is **incorrect** iff **incorrect**  $\in M(Int)$

A program  $prog$  is **correct** iff it is not **incorrect**.

# tr(X, Y): the operational semantics

<code>L: Id = Expr</code>	<code>tr( cf(cmd(L, asgn(Id, Expr)), S), cf(cmd(L1, C1), S1)) :-   aeval(Expr, S, V),           <i>evaluate expression</i>   update(Id, V, S, S1),       <i>update store</i>   nextlabel(L, L1),          <i>next label</i>   at(L1, C1).                <i>next command</i></code>
<code>L: if(Expr) {   L1: ... } else   L2: ... }</code>	<code>tr( cf(cmd(L, ite(Expr, L1, L2)), S), cf(C, S)) :-   beval(Expr, S),           <i>expression is true</i>   at(L1, C).                <i>next command</i>  <code>tr( cf(cmd(L, ite(Expr, L1, L2)), S), cf(C, S)) :-   beval(not(Expr), S),     <i>expression is false</i>   at(L2, C).                <i>next command</i></code></code>
<code>L: goto L1</code>	<code>tr( cf(cmd(L, goto(L1)), S), cf(C, S)) :-   at(L1, C).                <i>next command</i></code>



# tr(X,Y): the operational semantics for array assignment

*array assignment*:  $L : a[ie] = e$

*old store*: S

*new store*: S1

*transition*:

$\text{tr}( \text{cf}(\text{cmd}(L, \text{asgn}(\text{elem}(A, \text{IE}), E)), S),$	<i>old configuration</i> cf
$\text{cf}(\text{cmd}(L1, C), S1) ) :-$	<i>new configuration</i> cf
$\text{eval}(\text{IE}, S, I),$	<i>evaluate index expr</i> IE
$\text{eval}(E, S, V),$	<i>evaluate expression</i> E
$\text{lookup}(S, \text{array}(A), \text{FA}),$	<i>get array</i> FA <i>from store</i> S
$\text{write}(\text{FA}, I, V, \text{FA1}),$	<i>update array</i> FA, <i>getting</i> FA1
$\text{update}(S, \text{array}(A), \text{FA1}, S1),$	<i>update store</i> S, <i>getting</i> S1
$\text{nextlab}(L, L1),$	<i>next label</i> L1
$\text{at}(L1, C).$	<i>command</i> C <i>at next label</i>

## Running Example: Up Array Initialization

### Program *Uplnit*

```
i=1;
while (i < n) {
    a[i] = a[i-1]+1;
    i = i+1;
}
```

### An Execution of *Uplnit* (assume $n=4$ and $a[0]=2$ )

$[2, ?, ?, ?] \rightarrow [2, 3, ?, ?] \rightarrow [2, 3, 4, ?] \rightarrow [2, 3, 4, 5]$

# Running Example: Up Array Initialization

Given the **program** *Uplnit* and the **partial correctness triple**

```
i=1;
while (i < n) {
  a[i] = a[i-1]+1;
  i = i+1;
}
```

$$\{i \geq 0 \wedge n \geq 1 \wedge n = \text{dim}(a)\}$$

*Uplnit*

$$\{\forall j (0 \leq j \wedge j + 1 < n \rightarrow a[j] < a[j+1])\}$$

## CLP encoding of program *Uplnit*

- A set of **at**(label, command) facts.
  - while becomes **ite** + **goto**.
  - a[i] becomes **elem**(a,i).
- ```
at(l0, asgn(i, 1)).
at(l1, ite(less(i, n), l2, lh)).
at(l2, asgn(elem(a, i),
  plus(elem(a, minus(i, 1)), 1))).
at(l3, asgn(i, plus(i, 1))).
at(l4, goto(l1)).
at(lh, halt).
```

## CLP encoding of $\varphi_{init}$ and $\varphi_{error}$

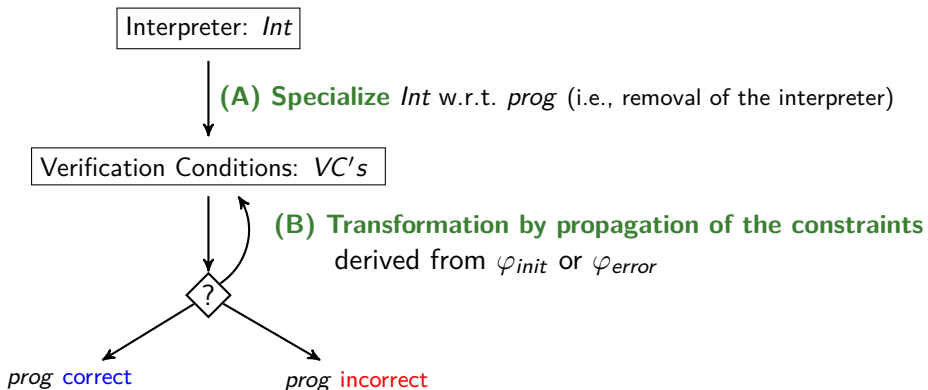
**initConf**( $l_0, I, N, A$ ) :-  
 $I \geq 0, N \geq 1.$

**errorConf**( $l_h, N, A$ ) :-  
 $W \geq 0, W + 1 < N, \boxed{Z = W + 1, U \geq V},$   
**read**(A,  $\boxed{W, U}$ ), **read**(A,  $\boxed{Z, V}$ ).

## The array constraints: read and write

- if  $a[i]=v$ , then  $\text{read}(A,I,V)$  holds
- if  $a[i]:=v$ , then  $\text{write}(A,I,V,B)$  holds, that is,  
the array B is an array identical to A  
except that array B in position I has value V

# The Transformation-based Verification Method



- *prog* correct if no constrained facts appear in the *VC*'s.
- *prog* incorrect if the fact incorrect. appears in the *VC*'s.

## Transform

```
TransfP =  $\emptyset$ ;  
Defs = { incorrect :- errorConf(X), reach(X) };  
while  $\exists q \in$  Defs do  
  Cls = Unfolding(q);  
  Cls = ConstraintReplacement(Cls);  
  Cls = ClauseRemoval(Cls);  
  Defs = (Defs - {q})  $\cup$  Definitionarray(Cls);  
  TransfP = TransfP  $\cup$  Folding(Cls, Defs);  
od
```

# Generation of Verification Conditions

The specialization of *Int* w.r.t. *prog* removes all references to:

- *tr* and
- *at*

## VC: The Verification Conditions for *Uplnit*

```
incorrect :- Z=W+1, W $\geq$ 0, W+1<N, U $\geq$ V, N $\leq$ I,  
            read(A,W,U), read(A,Z,V), new1(I,N,A).  
new1(I1,N,B) :- 1 $\leq$ I, I<N, D=I-1, I1=I+1, V=U+1,  
              read(A,D,U), write(A,I,V,B), new1(I,N,A).  
new1(I,N,A) :- I=1, N $\geq$ 1.
```

- A constrained fact is present:  
we cannot conclude that the program is *correct*.
- The fact *incorrect* is not present:  
we cannot conclude that the program is *incorrect* either.

Check satisfiability of VC's  
via CLP transformation:

Propagation of Integer and Array Constraints

---



# Constraint Replacement Rules (CHR)

If  $\mathcal{A} \models \forall (c_0 \leftrightarrow (c_1 \vee \dots \vee c_n))$ , where  $\mathcal{A}$  is the Theory of Arrays

Then replace  $H :- c_0, d, G$

by  $H :- c_1, d, G, \dots, H :- c_n, d, G$

**Constraint Handling Rules** [Frühwirth et al.] for Constraint Replacement:

AC1. Array-Congruence-1: **if  $i=j$  then  $a[i]=a[j]$**

$\text{read}(A, I, X) \setminus \text{read}(A1, J, Y) \Leftrightarrow A == A1, I = J \mid X = Y.$

AC2. Array-Congruence-2: **if  $a[i] \neq a[j]$  then  $i \neq j$**

$\text{read}(A, I, X), \text{read}(A1, J, Y) \Rightarrow A == A1, X \langle \rangle Y \mid I \langle \rangle J.$

ROW. Read-Over-Write:  **$\{a[i]=x; y=a[j]\}$  if  $i=j$  then  $x=y$**

$\text{write}(A, I, X, A1) \setminus \text{read}(A2, J, Y) \Leftrightarrow A1 == A2 \mid$

$(I = J, X = Y) ; (I \langle \rangle J, \text{read}(A, J, Y)).$

# Up Array Initialization

```
new3(A,B,C) :- A=2+H, B-H ≤ 3, E-H ≤ 1, E ≥ 1, B-H ≥ 2, ...,  
  read(N,H,M), read(C,D,F), write(N,J,K,C), read(C,E,G),  
  reach(J,B,N).
```

- by applying the ROW rule:

```
new3(A,B,C) :- J=1+D, A=2+D, K=1+I, I < F, ..., J=E, K=G,  
  read(C,D,F), read(N,D,I), write(N,J,K,C), read(C,E,G),  
write(N,J,K,C), read(C,E,G),  
  reach(J,B,N).
```

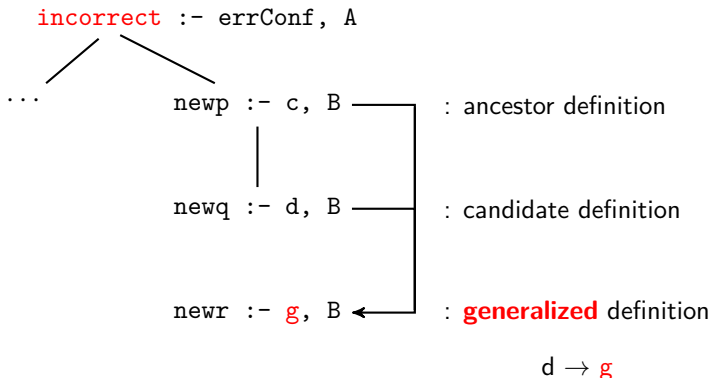
```
new3(A,B,C) :- J=1+D, A=2+D, K=1+I, I < F, ..., J <> E,  
  read(C,D,F), read(N,D,I), write(N,J,K,C), read(C,E,G),  
write(N,J,K,C), read(C,E,G),  
  reach(J,B,N).
```

- by applying the ROW, AC1, and AC2 rules:

```
new3(A,B,C) :- A=1+H, E=1+D, J=-1+H, K=1+L, D-H ≤ -2, H < B, ...  
  read(N,E,G), read(N,D,F), read(N,J,L), write(N,H,K,C),  
  reach(J,B,M).
```

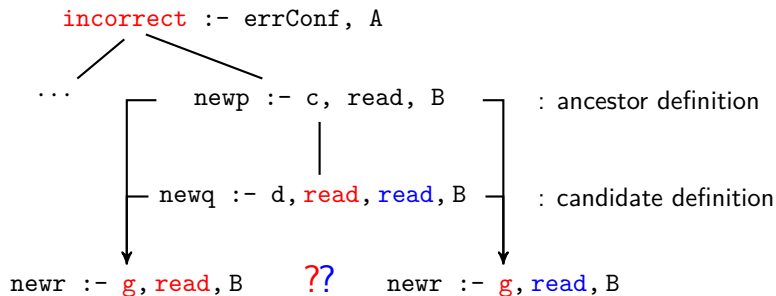
# Constraint Generalizations

Definitions are arranged as a tree:



Generalization operators based on **widening** and **convex-hull** [Cousot-Cousot 77, Cousot-Halbwachs 78].

# Array Constraint Generalizations



- We decorate CLP variables with the associated **identifiers** of the imperative program.

## VC: The Verification Conditions for *Uplnit* (decorated)

```

incorrect :- Z=W+1, W ≥ 0, W+1 < N, U ≥ V, N ≤ I,
           read(A, Wj, Ua[j]), read(A, Zj1, Va[j1]), new1(I, N, A).
new1(I1, N, B) :- 1 ≤ I, I < N, D=I-1, I1=I+1, V=U+1,
                 read(A, Di, Ua[i]), write(A, I, V, B), new1(I, N, A).
new1(I, N, A) :- I=1, N ≥ 1.
  
```

# Up Array Initialization

: ancestor definition

```
new3(I,N,A) :- E+1=F, E ≥ 0, I > F, G ≥ H, N > F, N ≤ I+1,  
read(A, Ej, Ga[j]), read(A, Fj1, Ha[j1]), reach(I,N,A).
```

: candidate definition

```
new4(I,N,A) :- E+1=F, E ≥ 0, I > F, G ≥ H, I=1+I1, I1+2 ≤ C, N ≤ I1+3,  
read(A, Ej, Ga[j]), read(A, Fj1, Ha[j1]), read(A, Pi, Qa[i]),  
reach(I,N,A).
```

: **generalized** definition

```
new5(I,N,A) :- E+1=F, E ≥ 0, I > F, G ≥ H, N > F,  
read(A, Ej, Ga[j]), read(A, Fj1, Ha[j1]), reach(I,N,A).
```

In the paper: a variable of the form  $G^v$  is encoded by `val(v,G)`.

# Derived Verification Conditions

By applying the transformation strategy *Transform* to the verification conditions for *Uplnit*, we get:

## $VC'$ : Transformed verification conditions for *Uplnit*

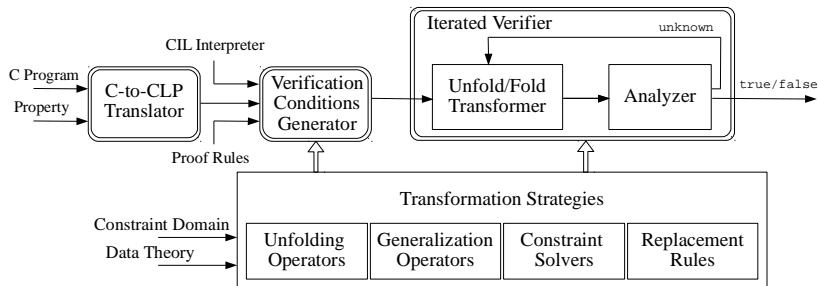
```
incorrect :- J1=J+1, J ≥ 0, J1 < I, AJ ≥ AJ1, D=I-1, N=I+1, Y=X+1,  
  read(A, J, AJ), read(A, J1, AJ1), read(A, D, X), write(A, I, Y, B),  
  new1(I, N, A).  
new1(I1, N, B) :- I1=I+1, Z=W+1, Y=X+1, D=I-1, N ≤ I+2,  
  I ≥ 1, Z < I, Z ≥ 1, N > I, U ≥ V, read(A, W, U), read(A, Z, V),  
  read(A, D, X), write(A, I, Y, B), new5(I, N, A).  
new5(I1, N, B) :- I1=I+1, Z=W+1, Y=X+1, D=I-1, I ≥ 1,  
  Z < I, Z ≥ 1, N > I, U ≥ V, read(A, W, U), read(A, Z, V),  
  read(A, D, X), write(A, I, Y, B), new5(I, N, A).
```

No constrained facts in  $VC'$ : **incorrect**  $\notin M(VC')$ .

The program *Uplnit* is **correct**.

## Experimental results

- The VeriMAP tool <http://map.uniroma2.it/VeriMAP>





# Experimental evaluation

| Program             | $Gen_{W,I,\mathbb{M}}$ | $Gen_{H,V,\subseteq}$ | $Gen_{H,V,\mathbb{M}}$ | $Gen_{H,I,\subseteq}$ | $Gen_{H,I,\mathbb{M}}$ |
|---------------------|------------------------|-----------------------|------------------------|-----------------------|------------------------|
| bubblesort-inner    | 0.9                    | <i>unknown</i>        | <i>unknown</i>         | <i>unknown</i>        | 1.52                   |
| copy-partial        | <i>unknown</i>         | <i>unknown</i>        | 3.52                   | 3.51                  | 3.54                   |
| copy-reverse        | <i>unknown</i>         | <i>unknown</i>        | 5.25                   | <i>unknown</i>        | 5.23                   |
| copy                | <i>unknown</i>         | <i>unknown</i>        | 5.00                   | 4.88                  | 4.90                   |
| find-first-non-null | 0.14                   | 0.66                  | 0.64                   | 0.28                  | 0.27                   |
| find                | 1.04                   | 6.53                  | 2.35                   | 2.33                  | 2.29                   |
| first-not-null      | 0.11                   | 0.22                  | 0.22                   | 0.22                  | 0.22                   |
| init-backward       | <i>unknown</i>         | 1.04                  | 1.04                   | 1.03                  | 1.04                   |
| init-non-constant   | <i>unknown</i>         | 2.51                  | 2.51                   | 2.47                  | 2.47                   |
| init-partial        | <i>unknown</i>         | 0.9                   | 0.89                   | 0.9                   | 0.89                   |
| init-sequence       | <i>unknown</i>         | 4.38                  | 4.33                   | 4.41                  | 4.29                   |
| init                | <i>unknown</i>         | 1.00                  | 0.97                   | 0.98                  | 0.98                   |
| insertionsort-inner | 0.58                   | 2.41                  | 2.4                    | 2.38                  | 2.37                   |
| max                 | <i>unknown</i>         | <i>unknown</i>        | 0.8                    | 0.81                  | 0.82                   |
| partition           | 0.84                   | 1.77                  | 1.78                   | 1.76                  | 1.76                   |
| rearrange-in-situ   | <i>unknown</i>         | <i>unknown</i>        | 3.06                   | 3.01                  | 3.03                   |
| selectionsort-inner | <i>unknown</i>         | <i>time-out</i>       | <i>unknown</i>         | 2.84                  | 2.83                   |
| verified            | 6                      | 10                    | 15                     | 15                    | 17                     |
| total time          | 3.61                   | 21.42                 | 34.76                  | 31.81                 | 38.45                  |
| average time        | 0.60                   | 2.14                  | 2.31                   | 2.12                  | 2.26                   |

# Future Work

- Proving recursively defined properties
- Imperative programs with recursive functions
- More data structure theories (lists, heaps, etc.)
- Other programming languages, properties, and proof rules

## Proving recursively defined properties

The *GCD* program

```

x = m;  y = n;
while (x != y) {
    if (x > y) x = x - y;
    else      y = y - x;
}
z = x;
% z = greatest-common-divisor
% of m and n

```

## partial correctness triple

$$\varphi_{init}(m,n) \equiv \{ m \geq 1 \wedge n \geq 1 \}$$

*GCD*

$$\varphi_{error}(m,n,z) \equiv \{ \exists d (\text{gcd}(m,n,d) \wedge d \neq z) \}$$

*GCD* property

$\text{gcd}(X, Y, D) :- X > Y, \quad X1 = X - Y, \quad \text{gcd}(X1, Y, D).$

$\text{gcd}(X, Y, D) :- X < Y, \quad Y1 = Y - X, \quad \text{gcd}(X, Y1, D).$

$\text{gcd}(X, Y, D) :- X = Y, \quad Y = D.$

CLP encoding of *GCD*

```
reach(X) :- initConf(X).
reach(Y) :- tr(X,Y), reach(X).
incorrect :- errorConf(X), reach(X).
```

---

```
initConf(cf(cmd(0, asgn(int(x), int(m))),
  [[int(m), M], [int(n), N], [int(x), X], [int(y), Y], [int(z), Z]])) :-
  M ≥ 1, N ≥ 1. %  $\varphi_{init}(m,n)$ 
```

```
errorConf(cf(cmd(h, halt),
  [[int(m), M], [int(n), N], [int(x), X], [int(y), Y], [int(z), Z]])) :-
  gcd(M, N, D), D ≠ Z. %  $\varphi_{error}(m,n,z)$ 
```

Generation of VC's; Propagation of  $\varphi_{error}(m,n,z)$

Transformed *GCD*

```
incorrect :- M ≥ 1, N ≥ 1, M > N, X1 = M - N, Z ≠ D, new1(M, N, X1, N, Z, D).
incorrect :- M ≥ 1, N ≥ 1, M < N, Y1 = N - M, Z ≠ D, new1(M, N, M, Y1, Z, D).
new1(M, N, X, Y, Z, D) :- M ≥ 1, N ≥ 1, X > Y, X1 = X - Y, Z ≠ D, new1(M, N, X1, Y, Z).
new1(M, N, X, Y, Z, D) :- M ≥ 1, N ≥ 1, X < Y, Y1 = Y - X, Z ≠ D, new1(M, N, X, Y1, Z).
```

No constrained fact: the *GCD* program is correct.

Try the VeriMAP tool!

<http://map.uniroma2.it/VeriMAP>

# Why Use CLP Transformation for Verification?

- CLP transformation can be used both for *generating* VC's and for *proving* their satisfiability
- CLP transformation is *parametric* with respect to:
  - the programming language and its semantics
  - the properties to be proved
  - the proof rules
  - the theories of the data structures
- The input CLP program and the transformed CLP program are *semantically equivalent*. This allows:
  - *composition* of transformations
  - *incremental verification* of properties
  - *easy inter-operability* with other verifiers that use Horn-clause format.

Our verification framework:

- CLP as a metalanguage for a formal definition of the programming language semantics and program properties
- Semantics preserving transformations of CLP as proof rules which are programming language independent.



# Automatic Proofs of Satisfiability of VC's

Various methods (incomplete list):

- Verification of safety of infinite state systems in Constraint Logic Programming (CLP) [Delzanno-Podelski]
- CounterExample Guided Abstraction Refinement (CEGAR), Interpolation, Satisfiability Modulo Theories [Podelski-Rybalchenko, Bjørner, McMillan, Alberti et al.]
- Symbolic execution of Constraint Logic Programs [Jaffar et al.]
- Static Analysis and Transformation of Constraint Logic Programs [Gallagher et al., Albert et al., De Angelis et al.]