

Verifying Array Programs by Transforming Verification Conditions

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Proving Partial Correctness

Given the program *prog*:

```
x=0; y=0;  
while (x < n) {x=x+1; y=y+2}
```

and the specification:

```
{n ≥ 1} prog {y > x}
```

Generate the verification conditions (VCs):

1. $x=0 \wedge y=0 \wedge n \geq 1 \rightarrow P(x, y, n)$
2. $P(x, y, n) \wedge x < n \rightarrow P(x+1, y+2, n)$
3. $P(x, y, n) \wedge x \geq n \rightarrow y > x$

Initialization
Loop invariant
Exit

and prove they are satisfiable, i.e., we can find an interpretation for P that makes the VCs true.

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Initialization

Loop invariant

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and prove they are **satisfiable**, i.e., we can find an interpretation for P that makes the VCs true.

The interpretation

$$P(x, y, n) \equiv (x=0 \wedge y=0 \wedge n \geq 1) \vee y > x$$

makes the VCs true

$$1'. \quad x=0 \wedge y=0 \wedge n \geq 1 \rightarrow (x=0 \wedge y=0 \wedge n \geq 1) \vee y > x$$

$$2'. \quad ((x=0 \wedge y=0 \wedge n \geq 1) \vee y > x) \wedge x < n$$

$$\rightarrow (x+1=0 \wedge y+2=0 \wedge n \geq 1) \vee y+2 > x+1$$

$$3'. \quad ((x=0 \wedge y=0 \wedge n \geq 1) \vee y > x) \wedge x \geq n \rightarrow y > x$$

and hence the specification $\{n \geq 1\} \text{ prog } \{y > x\}$ is valid.

Problem: How to find the interpretation for P automatically?

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Proving Satisfiability of Verification Conditions

- The VCs are a set of **Horn clauses with constraints**
- or, equivalently, a **constraint logic program V** :
 1. $x=0 \wedge y=0 \wedge n \geq 1 \rightarrow P(x, y, n)$ **Constrained fact**
 2. $P(x, y, n) \wedge x < n \rightarrow P(x + 1, y + 2, n)$ **Rule**
 4. $P(x, y, n) \wedge x \geq n \wedge y \leq x \rightarrow \text{false}$ **Query**

The VCs are satisfiable iff **false** not in the least model of V .

- Methods for proving the satisfiability of VCs within CHC/CLP:
 - CounterExample Guided Abstraction Refinement, Interpolation, Satisfiability Modulo Theories
 - Symbolic execution of CLP
 - Static Analysis and Transformation of CLP

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A Transformation-based Method

- Apply transformations that preserve the least model to V :

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2. $P(x, y, n) \wedge x < n \rightarrow P(x + 1, y + 2, n)$

4. $P(x, y, n) \wedge x \geq n \wedge y \leq x \rightarrow \text{false}$

and derive the equisatisfiable V' :

5. $Q(x, y, n) \wedge x < n \wedge x > y \wedge y \geq 0 \rightarrow Q(x + 1, y + 2, n)$

6. $Q(x, y, n) \wedge x \geq n \wedge x \geq y \wedge y \geq 0 \wedge n \geq 1 \rightarrow \text{false}$

No constrained facts: V' satisfiable with $Q(x, y, n) \equiv \text{false}$.

- Problem: How to transform V into V' automatically?
- Some work done for programs over integers [De Angelis et al. PEPM-13].
- This work: Design automatic transformation strategies of VCs for programs over arrays.

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Outline of the Talk

- Constraint Logic Programming as a **metalanguage** for representing
 - the imperative program (integer and array variables)
 - the semantics of the imperative language (i.e., the interpreter)
 - the property to be verified
- Verification method based on CLP program transformation
 - Semantics-preserving **unfold/fold rules and strategies**
 - **VC generation** by specialization of the interpreter
 - **VC transformation** by propagation of the property to be verified
- The verification method at work: **Sequence Array Initialization**
- Experimental evaluation

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CLP with integer and array constraints

- A CLP **clause** is an implication $c \wedge G \rightarrow H$, written as:

$$H \text{ :- } c, G.$$

where H is an atom, c is a constraint, and G is a conjunction of atoms

- A **constraint** is a conjunction of:
 - **equalities/inequalities over integers** ($p_1 = p_2$, $p_1 \geq p_2$, $p_1 > p_2$)
 - **array constraints**:
 - `read(a, i, v)` (the i -th element of array a is v)
 - `write(a, i, v, b)`
(array b is equal to array a except that its i -th element is v)
 - `dim(a, n)` (the dimension of a is n)
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- Semantics: **least model** of the program with the fixed interpretation of constraints.

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Running Example: Array Initialization

Program SeqInit

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

An Execution

$[4, _, _, _] \implies [4, 5, _, _] \implies [4, 5, 6, _] \implies [4, 5, 6, 7]$

Partial Correctness Specification

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

SeqInit

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

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CLP encoding of program SeqInit

A set of `at(label, command)` facts. while commands are replaced by `ite` and `goto`. `elem(a,i)` stands for `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)`.

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`at(l_h , halt)`.

A **transition semantics** for the imperative language is defined by:

- a set of **configurations**, i.e., a CLP term: $\text{cf}(C, D)$

where:

- C is a **command**
- D is an **environment**,
i.e., a list of [variable identifier, value] pairs:

$[[\text{int}(i), 4], [\text{array}(a), [4, 5, 6, 7]]]$

- a **transition relation**: $\text{tr}(\text{cf}(C, D), \text{cf}(C1, D1))$

The transition for **array assignment**

- **command**: $L : a[ie] = e$
- **environment**: D
- **transition**:

```
tr(cf(cmd(L,asgn(elem(A,IE),E)),D),
   cf(cmd(L1,C),D1)) :-
    eval(IE,D,I),
    eval(E,D,V),
    lookup(D,array(A),FA),
    write(FA,I,V,FA1),
    update(D,array(A),FA1,D1),
    nextlab(L,L1),
    at(L1,C).
```

```
source configuration
target configuration
evaluate index expr
evaluate expression
get array from env
update array
update environment
next label
next command
```

CLP encoding of (in)correctness

Given the Specification $\{\varphi_{init}\} \text{ prog } \{\psi\}$ define $\varphi_{error} \equiv \neg\psi$

Definition (Partial Correctness)

A program *prog* is **correct** w.r.t. φ_{init} and φ_{error} if
from any initial configuration satisfying φ_{init}
no final configuration satisfying φ_{error} can be reached.
Otherwise, program P is **incorrect**.

Definition (CLP encoding of incorrectness)

```
incorrect :- errorConf(X), reach(X).      incorrectness  
reach(Y) :- tr(X,Y), reach(X).          reachability  
reach(Y) :- initConf(Y).  
errorConf(X)  $\equiv$  X is a configuration satisfying  $\varphi_{error}$   
initConf(Y)  $\equiv$  Y is a configuration satisfying  $\varphi_{init}$ 
```

Theorem (Correctness of Encoding)

prog is correct iff `incorrect` $\notin M(Int)$ (the least model of *Int*)

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Partial Correctness Specification

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

SeqInit

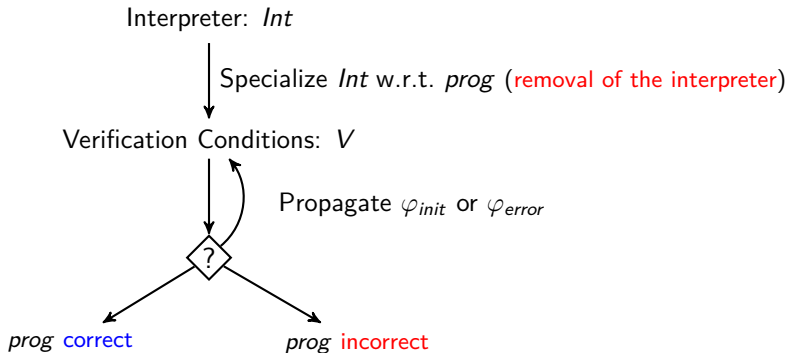
$$\{\forall j (0 \leq j \wedge j + 1 < n \rightarrow a[j] < a[j+1])\}$$
 $\neg\varphi_{error}$

$$\{\exists j (0 \leq j \wedge j + 1 < n \wedge a[j] \geq a[j+1])\}$$
 φ_{error} CLP encoding of φ_{init} and φ_{error}

$$\text{phiInit}(I, N, A) :- I \geq 0, \text{dim}(A, N), N \geq 1.$$

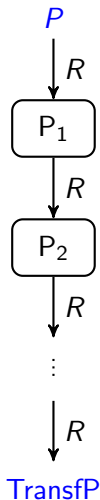
$$\text{phiError}(N, A) :- J \geq 0, J + 1 < N, J1 = J + 1, AJ \geq AJ1, \\ \text{read}(A, J, AJ), \text{read}(A, J1, AJ1).$$

The Transformation-based Verification Method



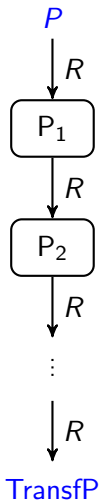
- **$prog$ correct** if no constrained facts appear in the VCs.
- **$prog$ incorrect** if the fact incorrect. appears in the VCs.

Unfold/Fold Program Transformation



- transformation **rules**:
 $R \in \{ \text{Definition, Unfolding, Folding, Clause Removal, Constraint Replacement} \}$
- the transformation rules **preserve the semantics**:
 $\text{incorrect} \in M(P) \text{ iff } \text{incorrect} \in M(\text{TransfP})$
- the rules must be guided by a **strategy**.

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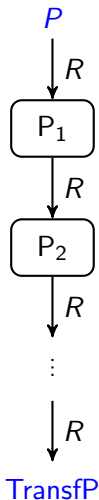


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$$\text{newp}(X) \text{ :- } c, A$$

R2. **Unfolding.** A symbolic evaluation step (resolution)

given $H \text{ :- } c, \underline{A}, G$

$$\underline{A} \text{ :- } d_1, G_1, \dots, \underline{A} \text{ :- } d_m, G_m$$

derive $H \text{ :- } c, d_1, G_1, G, \dots, H \text{ :- } c, d_m, G_m, G$

R3. **Folding.** Matching a predicate definition (e.g., a loop invariant)

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R4. **Clause Removal.** Removal of clauses with unsatisfiable constraint or subsumed by others

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derive $H :- c, d_1, G_1, G, \dots, H :- c, d_m, G_m, G$

R3. **Folding.** Matching a predicate definition (e.g., a loop invariant)

given $H :- d, \underline{A}, G$

$$\text{newp}(X) :- c, \underline{A} \quad \text{and} \quad d \rightarrow c$$

derive $H :- d, \text{newp}(X), G$

R4. **Clause Removal.** Removal of clauses with unsatisfiable constraint or subsumed by others

R5. Constraint Replacement:

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

Then replace

$H :- c_0, d, G$

by

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

The Unfold/Fold Transformation strategy

Transform(P)

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

Theorem (Correctness of the Transformation Strategy)

$\text{incorrect} \in M(P)$ iff $\text{incorrect} \in M(\text{TransfP})$

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Generating Verification Conditions via Specialization

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

- `tr` (i.e., the operational semantics of the imperative language)
- `at` (i.e., the encoding of *prog*)

The Specialized Interpreter for SeqInit (Verification Conditions V)

```
incorrect :- J ≥ 0, J + 1 < N, J1 = J + 1, AJ ≥ AJ1, N ≤ I,  
            read(A, J, AJ), read(A, J1, AJ1), p(I, N, A).  
p(I1, N, B) :- 1 ≤ I, I < N, D = I - 1, I1 = I + 1, V = U + 1,  
              read(A, D, U), write(A, I, V, B), p(I, N, A).  
p(I, N, A) :- I = 1, N ≥ 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`.

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Propagating the Error Property by Unfold/Fold Transformation

The Unfold/Fold transformation strategy propagates the error property with the goal of

- either removing all constrained facts from V
- or deriving the fact `incorrect`.

The Output of the U/F Strategy for *SeqInit*

```
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), new2(I, N, A).  
new2(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), new2(I, N, A).
```

No constrained facts: the program *SeqInit* is `correct`.

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    read(A, D, X), write(A, I, Y, B), new2(I, N, A).
```

No constrained facts: the program *SeqInit* is **correct**.

Rewrite rules for Constraint Replacement based on the Theory of Arrays:

Array congruence

(AC) $I = J, \text{read}(A, I, U), \text{read}(A, J, V) \rightarrow U = V$

[AC1] replace: $I = J, \text{read}(A, I, U), \text{read}(A, J, V)$
by: $I = J, \text{read}(A, I, U), U = V$

[AC2] replace: $U \neq V, \text{read}(A, I, U), \text{read}(A, J, V)$
by: $U \neq V, \text{read}(A, I, U), \text{read}(A, J, V), I \neq J$

Read-over-Write

(RoW1) $I = J$, write(A, I, U, B), read(B, J, V) $\rightarrow U = V$

(RoW2) $I \neq J$, write(A, I, U, B), read(B, J, V) \rightarrow read(A, J, V)

[RoW1] replace: $I = J$, write(A, I, U, B), read(B, J, V)
by: $I = J$, write(A, I, U, B), $U = V$

[RoW2] replace: $I \neq J$, write(A, I, U, B), read(B, J, V)
by: $I \neq J$, write(A, I, U, B), read(A, J, V)

[RoW12] replace: write(A, I, U, B), read(B, J, V)
by: $I = J$, write(A, I, U, B), $U = V$
and $I \neq J$, write(A, I, U, B), read(A, J, V)

- The most critical transformation step within the unfold/fold transformation strategy is the **introduction of new predicate definitions** to be used for folding.

• Given $p(X) :- c(X, Y), \underline{q(Y)}.$

Introduce $\text{newp}(Y) :- d(Y), \underline{q(Y)}.$

where $c(X, Y) \rightarrow d(Y)$ ($d(Y)$ is a **generalization** of $c(X, Y)$)

and fold: $p(X) :- c(X, Y), \text{newp}(Y).$

- Generalization strategies based on **widening** and **convex-hull** of linear constraints.

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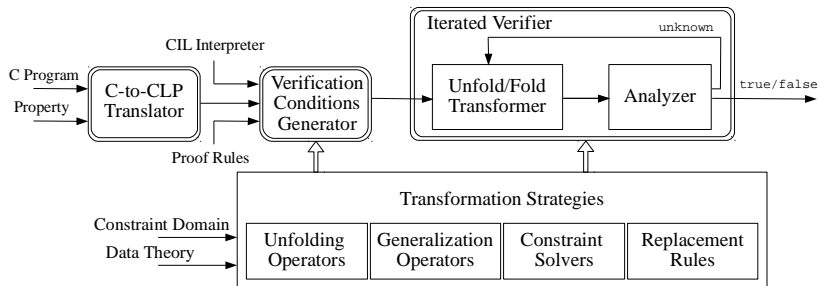
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- The VeriMAP tool <http://map.uniroma2.it/VeriMAP>



Experimental evaluation

Program	Gen_W	Gen_{WD}	Gen_S	Gen_{SD}
<i>init</i>	<i>unknown</i>	0.06	0.10	0.08
<i>init-partial</i>	<i>unknown</i>	0.06	0.07	0.08
<i>init-non-constant</i>	<i>unknown</i>	0.06	0.22	0.22
<i>init-sequence</i>	<i>unknown</i>	0.80	<i>unknown</i>	1.20
<i>copy</i>	<i>unknown</i>	0.27	0.33	0.29
<i>copy-partial</i>	<i>unknown</i>	0.29	0.34	0.34
<i>copy-reverse</i>	<i>unknown</i>	0.27	0.46	0.45
<i>max</i>	<i>unknown</i>	0.31	0.24	0.33
<i>sum</i>	<i>unknown</i>	0.68	1.14	1.12
<i>difference</i>	<i>unknown</i>	0.66	1.15	1.11
<i>find</i>	0.25	0.43	0.46	0.45
<i>first-not-null</i>	0.38	0.41	0.42	0.42
<i>find-first-non-null</i>	1.24	1.87	1.94	1.93
<i>partition</i>	0.06	0.11	0.14	0.12
<i>insertionsort-inner</i>	0.21	0.26	0.45	0.43
<i>bubblesort-inner</i>	2.46	2.71	2.45	2.75
<i>selectionsort-inner</i>	7.20	6.40	7.23	7.16
precision	7	17	16	17
total time	11.80	15.65	17.14	18.48
average time	1.69	0.92	1.07	1.09

What Can Transformation do for Verification?

- Help build a verification framework which is **parametric** with respect to:
 - programming language and its operational semantics
 - properties and proof rules
 - theory of data structures
- PT can be used both for **generating** VCs (in the form of CLP) and for **proving** their satisfiability
- The input and the output of PT are semantically equivalent CLP programs. This allows:
 - **incremental verification**
 - **iteration** for refining verification
 - easy **interoperation** with other verifiers that use Horn clause format

Future Work

- More experiments (e.g., nested loops)
- Recursive functions
- More theories (lists, heaps, etc.)
- Other programming languages, properties, proof rules

Thanks for your attention!