Proving Horn Clause Specifications of Imperative Programs

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We present a method for verifying the correctness of an imperative program with respect to a specification defined in terms of a set of possibly recursive Horn clauses. Given a program *prog*, we consider a partial correctness specification of the form $\{\varphi\} prog \{\psi\}$, where the assertions φ and ψ are predicates defined by a set *Spec* of Horn clauses. The verification method consists in: (i) encoding the function computed by the program *prog* (according to the semantics of the imperative language) as a set *OpSem* of clauses, and then (ii) constructing a set *PC* of Horn clauses and a predicate *p* such that if *p* is false in the least model of *PC*, that is, $M(PC) \not\models p$, then $\{\varphi\} prog \{\psi\}$ is valid. We also present an extension of the verification method for showing total correctness of programs. Then we present a general proof technique based on unfold/fold transformations of Horn clauses, for checking whether or not $M(PC) \models p$ holds. We also outline a strategy for guiding the application of the unfold/fold transformation rules and performing correctness proofs in an automatic way. Finally, we show some experimental results based on a preliminary implementation of our method.

Keywords: Program verification, Horn clauses, Partial and total correctness specifications, Constraint Logic Programming, Program transformation.

1 Introduction

The main objective of program verification is to prove in a systematic, computer-aided way that programs are correct or, in other words, that programs meet their specifications. In this paper we deal with the problem of automatically proving the correctness of sequential, imperative programs.

One of the most established methodologies for specifying and proving program correctness is based on the Floyd-Hoare axiomatic approach (see [16] and also [4] for a recent presentation dealing with both sequential and concurrent programs). By following this approach, one can express *partial* and *total* correctness properties. A partial correctness specification of a program *prog* is a Hoare triple $\{\varphi\}$ *prog* $\{\psi\}$, where the *precondition* φ and the *postcondition* ψ are assertions in first order logic, meaning that if the input values of *prog* satisfy φ and program execution terminates, then the output values satisfy ψ . A total correctness specification is a partial correctness specification whose program *prog* terminates for all input values satisfying φ .

It is well-known that the problem of verifying whether or not a (partial or total) correctness specification holds is undecidable for Turing complete programming languages. In particular, the undecidability of partial correctness is due to the fact that in order to prove the validity of a triple $\{\varphi\}$ prog $\{\psi\}$ using Hoare logic, (i) we have to look for suitable auxiliary assertions, the so-called *invariants*, in an infinite space of formulas, and (ii) we have to establish logical validity of assertions, which is an undecidable problem. Thus, the best way we can address the problem of automating program verification is to design *incomplete* methods that work well in many practical cases. Some of these methods are based on *abstract interpretation* [6], whereby the search for invariants is restricted to a finitely generated set of formulas where validity is decidable. The most popular invariant generation techniques for programs manipulating integer variables restrict the search to the set of linear arithmetic constraints [7].

In recent years, several techniques for verifying programs that manipulate integers by generating linear arithmetic assertions, have been proposed (see, for instance, [1, 5, 8, 18, 15, 27, 28, 32]). Some of them use a representation of the program logic using Horn clauses and linear arithmetic constraints. This representation enables the use of very effective reasoning tools, such as *constraint solvers* [10] and *Constraint Logic Programming* (CLP) systems [17]. However, a strong limitation of these techniques is that they cannot be used to prove partial correctness of programs whenever either the preconditions or the postconditions are *not* linear arithmetic constraints.

One approach that has been followed to overcome the linearity limitation is to devise methods for generating polynomial invariants and proving specifications with polynomial arithmetic constraints (see, for instance [30, 31]). This approach also requires the development of solvers for polynomial constraints, which is a very complex task on its own, as the satisfiability of these constraints on the integers is undecidable for polynomials of degree greater than 1 [24].

In this paper we propose an approach to proving specifications of the form $\{\varphi\} prog \{\psi\}$ where the assertions φ and ψ are predicates defined by a set *Spec* of Horn clauses with linear arithmetic constraints, that is, by a CLP program. Thus, *Spec* can specify any computable function. Then, we translate the problem of proving the validity of $\{\varphi\} prog \{\psi\}$ into the problem of answering suitable queries to a CLP program, and in order to answer those queries, we apply some transformation strategies making use of the well-known *unfold/fold rules* for CLP programs [12]. Clearly, by the incompleteness limitations mentioned above, we do not have, in general, any guarantee of success for our transformation strategies.

The main contributions of this paper are the following.

(1) We consider partial correctness specifications of the form $\{\varphi\} prog \{\psi\}$, where φ and ψ are predicates defined by a CLP program, and prog is a program written in a C-like imperative language. We show how to construct a CLP program PC and a query p, starting from the assertions φ and ψ and the definition of the operational semantics of the imperative language, such that, if $M(PC) \not\models p$, then $\{\varphi\} prog \{\psi\}$ is valid. We also present a similar construction of a CLP program when we are given a total correctness specification.

(2) We define a proof technique that can be applied to prove that $M(PC) \not\models p$, hence proving the partial correctness of *prog* with respect to φ and ψ . Our proof technique is based on suitable transformations of the CLP program *PC*. In particular, our technique makes use of the unfold/fold rules to derive a *linear recursive* definition of *p*, and then applies the specialization strategies presented in [8], which work on linear recursive CLP programs.

(3) We have implemented our proof technique on the VeriMAP transformation-based verifier [9] and we show that the verifier proves partial correctness of some programs whose specifications are given in terms of predicates defined by a CLP program, but not expressible by linear arithmetic constraints only.

2 Transformation of Constraint Logic Programs

In this section we recall the basic notions of Constraint Logic Programming and program transformation that will be used in this paper.

A CLP program is a finite set of clauses of the form $A \leftarrow c, G$, where A is an atom, c is a constraint

(that is, a possibly empty conjunction of linear equalities and inequalities over the integers), and G is a goal (that is, a possibly empty conjunction of atoms). A clause of the form $A \leftarrow c$ is called a *constrained fact*. The semantics of constraints is defined by the usual interpretation based on linear integer arithmetic. The semantics of a CLP program P is defined as its *least model*, denoted M(P). For other notions of CLP with which the reader might not be familiar, we refer to [17].

Given a first order formula φ , we denote by $\exists(\varphi)$ its *existential closure* and by $\forall(\varphi)$ its *universal closure*.

Our verification method is based on an encoding of the verification problem by using CLP programs, and on the application of transformation rules that preserve the least model of CLP programs [12]. In particular, we apply the following *transformation rules*, collectively called *unfold/fold rules*: (i) *definition*, (ii) *unfolding*, (iii) *clause removal*, and (iv) *folding*.

Let P be a CLP program and *Defs* be a set of *definition clauses*, that is, clauses of the form $p(X) \leftarrow c, G$ such that p has a single occurrence in $P \cup Defs$.

Definition Rule. By this rule we introduce a new definition clause of the form $newp(X) \leftarrow c, G$, where *newp* is a new predicate symbol, X is a tuple of variables occurring in (c, G), c is a constraint, and G is a non-empty conjunction of atoms.

Unfolding Rule. Given a clause C of the form $H \leftarrow c, L, A, R$, where H and A are atoms, c is a constraint, and L and R are (possibly empty) conjunctions of atoms, let us consider the set $\{K_i \leftarrow c_i, B_i \mid i = 1, ..., m\}$ made out of the (renamed apart) clauses of P such that, for i = 1, ..., m, A is unifiable with K_i via the most general unifier ϑ_i and $(c, c_i) \vartheta_i$ is satisfiable. By unfolding C w.r.t. A using P, we derive the set $\{(H \leftarrow c, c_i, L, B_i, R) \vartheta_i \mid i = 1, ..., m\}$ of clauses.

Folding Rule. Given a clause *E* of the form: $H \leftarrow e, L, Q, R$ and a clause *D* in *Defs* of the form $K \leftarrow d, D$ such that: (i) for some substitution ϑ , $Q = D \vartheta$, and (ii) $\forall (e \rightarrow d \vartheta)$ holds, then by folding *E* using *D* we derive $H \leftarrow e, L, K\vartheta, R$.

Removal of Useless Clauses. The set of useless predicates in a given program Q is the largest set U of predicates occurring in Q such that p is in U iff every clause with head predicate p is of the form $p(X) \leftarrow c, G_1, q(Y), G_2$, for some q in U. A clause in a program Q is useless if the predicate of its head is useless in Q.

The transformation rules are applied according to the *Transform* strategy outlined in Figure 1 below.

The *Transform* strategy is executed in a fully automatic way if we first provide a procedure for the UNFOLDING steps and a procedure for the DEFINITION & FOLDING steps. Both the termination of the *Transform* strategy and its output program depend on these two procedures. There is a vast literature on the problems of: (i) controlling the unfolding steps, and (ii) determining the new predicates to be introduced for performing the subsequent folding steps (see, for instance, [11, 14, 21, 26]). In Section 5 we will return to this point and we will consider suitable UNFOLDING and DEFINITION & FOLDING procedures that will be used in this paper.

By an *instance* of the *Transform* strategy we mean the *Transform* strategy that uses some fixed UN-FOLDING and DEFINITION & FOLDING procedures. The correctness of the strategy is independent of the specific UNFOLDING and DEFINITION & FOLDING procedures, and directly follows from the fact that the application of the transformation rules complies with suitable conditions that guarantee the preservation of the least model [12].

Theorem 1 (Correctness of the Transform strategy) Suppose that an instance of the Transform strategy terminates for a given input program P and input clause $p(X) \leftarrow B$ belonging to P. Let TransfP be the program that is the output of the strategy. Then, for all ground terms t, $p(t) \in M(P)$ iff $p(t) \in M(TransfP)$.

Input: (i) Program P, and (ii) clause C in P of the form: $p(X) \leftarrow B$, where p does not occur in $(P - \{C\}) \cup \{B\}$.

Output: Program *TransfP* such that, for all ground terms t, $p(t) \in M(P)$ iff $p(t) \in M(TransfP)$.

INITIALIZATION: *TransfP* := \emptyset ; *InDefs* := { $p(X) \leftarrow B$ }; *Defs* := *InDefs*;

while in InDefs there is a clause C do

UNFOLDING: Apply the unfolding rule at least once, thereby deriving from C a set U(C) of clauses;

DEFINITION & FOLDING: Introduce a (possibly empty) set *NewDefs* of new predicate definitions and add them to *Defs* and to *InDefs*;

Fold the clauses in U(C) that are different from constrained facts by using the clauses in *Defs*, thereby deriving a set F(C) of clauses;

 $InDefs := InDefs - \{C\};$ $TransfP := TransfP \cup F(C);$

end-while;

REMOVAL OF USELESS CLAUSES:

Remove from *TransfP* all clauses whose head predicate is useless.

Figure 1: The Transform strategy.

3 Translating Imperative Programs and Specifications into CLP

We consider a C-like imperative programming language with integer variables, assignments (=), conditionals (if else), while loops (while), and jumps (goto). A program is a sequence of labeled commands, and in each program there is a unique halt command that, when executed, causes program termination.

The semantics of our language is defined by a *transition relation*, denoted \implies , between *configurations*. Each configuration is a pair $\langle\!\langle \ell : c, \delta \rangle\!\rangle$ of a labeled command $\ell : c$ and an *environment* δ . An environment δ is a function that maps every integer variable identifier x to its value v in the integers \mathbb{Z} . The definition of the relation \implies is similar to the 'small step' operational semantics given in [29], and is omitted. Given a program *prog* we denote by $\ell_0: c_0$ its first labeled command.

We assume that all program executions are *deterministic* in the sense that, for every environment δ_0 , there exists a unique, maximal (possibly infinite) sequence of configurations, called *computation sequence*, of the form: $\langle\!\langle \ell_0 : c_0, \delta_0 \rangle\!\rangle \Longrightarrow \langle\!\langle \ell_1 : c_1, \delta_1 \rangle\!\rangle \Longrightarrow \cdots$. We assume that every *finite* computation sequence ends in the configuration $\langle\!\langle \ell_h : halt, \delta_h \rangle\!\rangle$, for some environment δ_h . We say that a program prog terminates for δ_0 iff the computation sequence starting from the configuration $\langle\!\langle \ell_0 : c_0, \delta_0 \rangle\!\rangle$ is a finite sequence.

3.1 Specifying Program Correctness

We address the problem of verifying the partial or the total correctness of an imperative program *prog* with respect to a *precondition* φ and a *postcondition* ψ [16]. A partial correctness specification is a triple $\{\varphi\}$ prog $\{\psi\}$ (often called a *Hoare triple*), and a total correctness specification is a triple $[\varphi]$ prog $[\psi]$ (see, for instance, [29] for this notation). On partial and total correctness specifications we make the assumptions listed in the following definition.

Definition 1 (Functional Horn Specification) A partial correctness triple $\{\varphi\}$ prog $\{\psi\}$, or a total correctness triple $[\varphi]$ prog $[\psi]$, is said to be a *functional Horn specification* if the following assumptions hold.

- (1) The predicates occurring in the formulas φ and ψ are defined by a CLP program *Spec*;
- (2) φ is a formula of the form $z_1 = p_1 \land ... \land z_s = p_s \land pre(p_1,...,p_s)$, where $z_1,...,z_s$ are the variables occurring in *prog*, the symbols $p_1,...,p_s$ are variables (distinct from the z_i 's), called *parameters*, and *pre*($p_1,...,p_s$) is a predicate defined by *Spec* (informally, the predicate *pre* determines the initial values of the z_i 's);
- (3) ψ is a formula of the form $f(p_1, \dots, p_s, z_k)$, where z_k is a variable in $\{z_1, \dots, z_s\}$, and f is a predicate defined by *Spec* (informally, z_k is the variable whose final value is the result of the computation of *prog*);
- (4) *f* is a *functional relation* which is *total on* the predicate *pre*, in the sense that the following two satisfiability relations hold:

$$(4.1) M(Spec) \models \forall p_1, \dots, p_s, y_1, y_2, f(p_1, \dots, p_s, y_1) \land f(p_1, \dots, p_s, y_2) \rightarrow y_1 = y_2$$
(functionality)
$$(4.2) M(Spec) \models \forall p_1, \dots, p_s, pre(p_1, \dots, p_s) \rightarrow \exists y, f(p_1, \dots, p_s, y)$$
(totality on *pre*)

Note that Condition (4) is not restrictive, as every program, being deterministic, computes a functional relation, that is, a function from the inputs of the program to the output of the program. Note also that our definition of a functional Horn specification can easily be extended to the case of postconditions of the more general form: $f(p_1, \ldots, p_s, y_1, \ldots, y_q)$ with $\{y_1, \ldots, y_q\} \subseteq \{z_1, \ldots, z_s\}$.

Now let us introduce the notions of partial and total correctness. These notions are instances of the standard ones.

We say that a functional Horn specification $\{\varphi\} prog \{\psi\}$ satisfying Conditions (1–4) of Definition 1 is *valid*, or *prog* is *partially correct* with respect to φ and ψ , iff for all environments δ_0 ,

 $if M(Spec) \models pre(\delta_0(z_1), \dots, \delta_0(z_s)) \text{ holds (in words, } \delta_0 \text{ satisfies } pre) \text{ and } \langle\!\langle \ell_0 : c_0, \delta_0 \rangle\!\rangle \Longrightarrow^* \langle\!\langle \ell_h : \texttt{halt}, \delta_h \rangle\!\rangle$ (in words, prog terminates for δ_0) holds, then $M(Spec) \models f(\delta_0(z_1), \dots, \delta_0(z_s), \delta_h(z_k))$ holds.

We say that a functional Horn specification $[\varphi] prog [\psi]$ is valid, or prog is totally correct with respect to φ and ψ , iff for all environments δ_0 ,

 $if M(Spec) \models pre(\delta_0(z_1), \dots, \delta_0(z_s)) \text{ holds, then both } \langle\!\langle \ell_0 : c_0, \delta_0 \rangle\!\rangle \Longrightarrow^* \langle\!\langle \ell_h : \texttt{halt, } \delta_h \rangle\!\rangle \text{ and } M(Spec) \models f(\delta_0(z_1), \dots, \delta_0(z_s), \delta_h(z_k)) \text{ hold.}$

The relation computed by *prog* according to the operational semantics of our imperative language, is denoted by the predicate r_{prog} defined by a CLP program *OpSem* as follows (as usual, we use upper-case letters to denote variables of CLP programs):

R.
$$r_{prog}(P_1, \ldots, P_s, Z_k) \leftarrow initConf(Cf_0, P_1, \ldots, P_s), reach(Cf_0, Cf_h), finalConf(Cf_h, Z_k)$$

where:

- (1) *initConf* (Cf_0, P_1, \ldots, P_s) represents the initial configuration Cf_0 , where the variables z_1, \ldots, z_s are bound to the values P_1, \ldots, P_s , respectively, and P_1, \ldots, P_s satisfy the property $pre(P_1, \ldots, P_s)$;
- (2) $reach(Cf_0, Cf_h)$ represents the transitive closure \implies^* of the transition relation \implies , which in turn is represented by a predicate $tr(C_1, C_2)$ that encodes the operational semantics of our imperative language, that is, the interpreter of the language in which *prog* is written, by relating an old configuration C_1 to a new configuration C_2 ;
- (3) final Conf (Cf_h, Z_k) represents a final configuration Cf_h , where the variable z_k is bound to the value Z_k .

(Obviously, also the clauses defining the predicates $pre(P_1, \ldots, P_s)$ and $tr(C_1, C_2)$ are included in *OpSem*.) The clauses defining the predicate $tr(C_1, C_2)$ for our imperative language can be found in [8]. As an example, here we now show only the clause for *tr* in the case of an assignment command with label ℓ of the form ℓ : x = a, where *a* is a side effect free expression:

The term cf(LC, E) encodes the configuration consisting of a labeled command LC and an environment E. The term cmd(L, C) encodes the command C with label L. The term asgn(X, expr(A)) encodes the assignment of the value of the expression A to the variable X. The predicate eval(A, E, V) computes the value V of the expression A in the environment E. The predicate update(E, X, V, E1) updates the environment E by binding the variable X to the value V, thereby deriving a new environment E1. The predicate nextlab(L, L1) states that L1 is the label of the command that immediately follows the command with label L in *prog*. The predicate at(L, C) states that C is the command with label L.

Due to the fact that, by definition, the execution of the program *prog* is deterministic, the predicate r_{prog} defined by *OpSem* is a functional relation (which is not necessarily a total relation on *pre*).

Moreover, a program *prog*, with variables z_1, \ldots, z_s , terminates for an environment δ_0 such that: (i) $\delta_0(z_1) = p_1, \ldots, \delta_0(z_s) = p_s$, and (ii) δ_0 satisfies *pre*, iff $r_{prog}(p_1, \ldots, p_s, y)$ holds for some integer y.

Thus, we have the following lemma.

Lemma 1 (i) The predicate r_{prog} defined by OpSem is a functional relation, that is, the following holds: $M(OpSem) \models \forall p_1, \dots, p_s, y_1, y_2. r_{prog}(p_1, \dots, p_s, y_1) \land r_{prog}(p_1, \dots, p_s, y_2) \rightarrow y_1 = y_2.$

(*ii*) Moreover, a program prog terminates for any environment δ_0 such that $\delta_0(z_1) = p_1, \ldots, \delta_0(z_s) = p_s$, *if and only if the following holds*:

$$M(OpSem) \models pre(p_1, \ldots, p_s) \rightarrow \exists y. r_{prog}(p_1, \ldots, p_s, y).$$

Example 1 (Fibonacci Numbers) Let us consider the following program *fibonacci* which assigns to the variable u the n-th Fibonacci number, for any $n \ge 0$, having initialized u to 1 and v to 0.

| 0: | while (n>0) { t=u; u=u+v; v=t; n=n-1 } | fibonacci | |
|----|--|-----------|--|
| h: | halt | | |

The partial correctness of *fibonacci* is specified by the following Hoare triple:

 $\{n=\mathbb{N}, \mathbb{N} \geq 0, u=1, v=0, t=0\} \quad fibonacci \quad \{fib(\mathbb{N}, u)\}$ (\$\$)

where N is a parameter and the predicate fib is defined by the following set $Spec_{fibonacci}$ of clauses:

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S1. fib(0,1).
S2. fib(1,1).
S3. fib(N3,F3) :- N1>=0, N2=N1+1, N3=N2+1, F3=F1+F2, fib(N1,F1), fib(N2,F2).
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For reasons of conciseness, in the above specification (\ddagger) we have slightly deviated from Definition 1, and in the precondition and postcondition we did not introduce the parameters which have constant values. In particular, instead of writing 'u=U, U=1' and considering U as one of the arguments of fib, we have simply written 'u=1'. Analogously, for the variables v and t.

The relation $r_fibonacci$ computed by the program *fibonacci* according to the operational semantics, is defined by the following set $OpSem_{fibonacci}$ of clauses:

where:

- (i) reach(Cf1, Cf2) holds iff the configuration Cf2 is reachable from the configuration Cf1 by a computation sequence of program *fibonacci*,
- (ii) firstComm(LC) holds iff LC is the labeled command with label 0 of the program fibonacci,
- (iii) haltComm(LC) holds iff LC is the labeled command h:halt, and
- (iv) env((x, X), E) holds iff in the environment E the variable x is bound to the value X.

3.2 Proving Partial Correctness via CLP

In this section we show how the problem of proving the validity of a functional Horn specification $\{\varphi\} prog \{\psi\}$ of partial correctness, as defined in Section 3.1 (see in particular Definition 1), can be encoded by using CLP programs. Thus, we assume that we are given a CLP program *Spec* and the functional relation *f* defined by *Spec*.

For reasons of simplicity, we also assume that no predicate depends on f in Spec, that is, Spec can be partitioned into two sets of clauses, F and Aux, where F is the set of clauses with head predicate f and f does not occur in Aux.

We have the following two theorems whose proofs are given in the Appendix.

Theorem 2 (Partial Correctness) Let F_{pc} be the set of clauses derived from F as follows:

for each clause $C \in F$ of the form $f(X_1, \ldots, X_s, Y) \leftarrow B$,

- (1) the formula $Q: Y \neq Z \land f(X_1, \ldots, X_s, Z) \land B$, where Z is a new variable, is derived from C,
- (2) every occurrence of f in Q is replaced by r_{prog} , hence deriving a formula E of the form: $Y \neq Z \land r_{prog}(X_1, \ldots, X_s, Z) \land B'$, and
- (3) the following two clauses are derived from E:

$$p_1 \leftarrow Y > Z, r_{prog}(X_1, \ldots, X_s, Z), B$$

 $p_2 \leftarrow Y < Z, r_{prog}(X_1, \ldots, X_s, Z), B'$

where p_1 and p_2 are two new predicate symbols.

Suppose that, for all clauses D in F_{pc} , $M(OpSem \cup Aux \cup \{D\}) \not\models p$, where p is the head of D. Then $\{\varphi\} prog \{\Psi\}$ is valid.

3.3 Proving Total Correctness via CLP

Also the problem of proving the validity of a functional Horn specification $[\varphi] prog[\psi]$ of *total* correctness, as defined in Section 3.1, can be encoded by using CLP programs. For this task we consider the class of the *stratified* CLP programs which is an extension of the class of CLP programs introduced in Section 2. In this extended class we allow negative literals to occur in the body of a clause. For a stratified program *P*, we denote by M(P) its unique *perfect model* [3].

Theorem 3 (Total Correctness) Let F_{tc} be the set of clauses derived from F as follows:

for each clause $C \in F$ of the form $f(X_1, \ldots, X_s, Y) \leftarrow B$,

- (1) the formula $N : \neg f(X_1, \ldots, X_s, Y) \land B$ is derived from C,
- (2) every occurrence of f in N is replaced by r_{prog} , hence deriving a formula G of the form: $\neg r_{prog}(X_1, \ldots, X_s, Y) \land B'$
- (3) the following clause is derived from G:

$$p \leftarrow \neg r_{prog}(X_1, \ldots, X_s, Z), B'$$

where *p* is a new predicate.

Suppose that, for all clauses D in F_{tc} , $M(OpSem \cup Aux \cup \{D\}) \not\models p$, where p is the head of D. Then $[\varphi] prog [\Psi]$ is valid.

4 Proving Partial Correctness by Transforming CLP Programs

In this section we outline a method for performing correctness proofs based on the transformation rules and the *Transform* strategy presented in Section 2. For reasons of simplicity, we only deal with the problem of proving partial correctness, which by using Theorem 2 can be encoded in CLP without using negation. We leave it for future study the extension of our method to the problem of proving total correctness.

Suppose that, as required by Theorem 2, we want to prove that $M(OpSem \cup Aux \cup \{D\}) \not\models p$. Our method consists in applying various instances of the *Transform* strategy starting from the program $OpSem \cup Aux \cup \{D\}$ with the objective of deriving a new program T such that *either* (i) in T predicate p is defined by the empty set of clauses, *or* (ii) in T there is a fact $p \leftarrow$.

In case (i) we have that $M(T) \not\models p$ and hence, by Theorem 1, $M(OpSem \cup Aux \cup \{D\}) \not\models p$. In case (ii) we have that $M(T) \models p$ and hence, by Theorem 1, $M(OpSem \cup Aux \cup \{D\}) \models p$. Clearly, due to the undecidability of partial correctness, our method is incomplete, and we might derive a program *T* where neither case (i) nor case (ii) holds.

In the rest of this section we illustrate our method of proving partial correctness of programs on the particular example presented in Section 1 where we have considered a program for computing the Fibonacci numbers. In the next section we will indicate how to automatize our proof method in the general case.

In the Fibonacci example the set of clauses F is the whole $Spec_{fibonacci}$ and Aux is the empty set. By following Points (1), (2), and (3) of Theorem 2, from the set $Spec_{fibonacci}$ of clauses (see Example 1) we generate the following six clauses:

In order to prove the partial correctness of program *fibonacci* it is enough to show that $M(OpSem_{fibonacci} \cup \{DN\}) \not\models pN$, for N = 1, ..., 6. The proofs for N = 1, ..., 4 are very simple, as the queries p1, ..., p4 finitely fail after a few resolution steps. Below we will present the proofs for N = 5. The proof for N = 6 is similar to that for N = 5 and we will omit it.

A preliminary step of our proof method consists in specializing the clauses for the predicate $r_fibonacci$ to the specific definitions of: (i) initConf, (ii) finalConf, and (iii) the predicates on which reach depends. These definitions express, respectively, (i) the precondition of the program *fibonacci* (that is, n=N, N>=0, u=1, v=0, t=0), (ii) the final configuration computed by *fibonacci*, and (iii) the states reached by the computation of *fibonacci*. The specialization of $r_fibonacci$ is performed by applying the *Transform* strategy with *OpSem_{fibonacci}* as its input program and clause R1 (see Example 1) as its input clause. For UNFOLDING and DEFINITION & FOLDING we use the procedures presented in [8]. This specialization step produces the following three clauses:

E1. r_fibonacci(N,F) :- N>=0, U=1, V=0, T=0, r(N,U,V,T, N1,F,V1,T1). E2. r(N,U,V,T, N,U,V,T) :- N=<0.</pre> E3. r(N,U,V,T, N2,U2,V2,T2) :- N>=1, N1=N-1, U1=U+V, V1=U, T1=U, r(N1,U1,V1,T1, N2,U2,V2,T2).

where \mathbf{r} is a new predicate symbol introduced by the *Transform* strategy. Since the effect of specialization is to compile away all references to both the commands of program *fibonacci* and the interpreter of the language (that is, the predicate $t\mathbf{r}$), sometimes this first application of the *Transform* strategy is referred to as the *Removal of the Interpreter* [27]. Note that in the clauses E1, E2, and E3, the predicate \mathbf{r} corresponds to the while loop of program *fibonacci*. The first four arguments of \mathbf{r} are the initial values of the variables n, u, v, t, and the last four arguments are the final values of those variables.

By Theorem 1, $M(OpSem_{fibonacci} \cup \{D5\}) \not\models p5$ if and only if $M(\{E1, E2, E3, D5\}) \not\models p5$. Now we prove that $M(\{E1, E2, E3, D5\}) \not\models p5$ by applying again the *Transform* strategy with input program $\{E1, E2, E3, D5\}$ and input clause D5.

Initially *InDefs* consists of clause D5 only. The *Transform* strategy performs two iterations of its while loop.

First Iteration.

UNFOLDING. We begin by unfolding clause D5 with respect to the three r_fibonacci atoms in its body, and we get the clause:

DEFINITION & FOLDING. Then we introduce a new predicate gen defined by the following clause which is a generalization of clause 1 (below we will discuss on the introduction of this definition clause and the generalization we have performed):

2. gen(N1,U,V,T) :- N1>=0, U>=1, V>=0, T>=0, N2=N1+1, N3=N2+1, F3>F1+F2, r(N1,U,V,T, Na,F1,Va,Ta), r(N2,U,V,T,Nb,F2,Vb,Tb), r(N3,U,V,T, Nc,F3,Vc,Tc).

Clause 2 is added to *InDefs*. Next we fold clause 1 by using clause 2 and we get:

1.f p5 :- N1>=0, U>=1, V=0, T=0, gen(N1,U,V,T).

Clause D5 is removed from the set InDefs. After this removal InDefs consists of clause 2 only.

Second Iteration.

UNFOLDING. We unfold clause 2 which defines the newly introduced predicate gen, with respect to the leftmost r atom in its body, and we get:

After unfolding a few times clause 3, we get a clause with an unsatisfiable body, and thus we delete clause 3. Then, we unfold clause 4 with respect to the second r atom of its body and we get:

Next we unfold clause 5 with respect to the third r atom of its body and we get:

6. gen(N1,U,V,T) :- N1>=1, U>=1, V>=0, T>=0, F3>F1+F2, N=N1-1, N2=N1+1, U1=U+V, r(N,U1,U,U, Na,F1,Va,Ta), r(N1,U1,U,U, Nb,F2,Vb,Tb), r(N2,U1,U,U, Nc,F3,Vc,Tc).

DEFINITION & FOLDING. No new predicate has to be introduced for folding clause 6. Indeed, clause 6 can be folded using clause 2 (note that this folding is allowed because the constraint of the body of clause 2 is implied by the constraint in the body of clause 6, modulo a suitable variable renaming). By this folding step, we get:

6.f gen(N1,U,V,T) :- N1>=1, U>=1, V>=0, T>=0, N=N1-1, U1=U+V, gen(N,U1,U,U).

Then clause 2 is removed from the set *InDefs*, and since no new predicate has been introduced, we have that the set *InDefs* of clauses becomes empty. Thus the *Transform* strategy exits its while loop. The program *TransfP* derived so far consists of the two clauses 1.f and 6.f.

REMOVAL OF USELESS CLAUSES. No constrained fact belongs to *TransfP*. Hence, all predicates in *TransfP* are useless and all clauses in *TransfP* are removed.

The *Transform* strategy terminates with the empty output program, that is, $TransfP = \emptyset$. Thus, $M(TransfP) \not\models p5$ and, by Theorem 1, $M(\{E1, E2, E3, D5\}) \not\models p5$.

As mentioned above, we can also prove $M(\{E1, E2, E3, DN\}) \not\models pN$ for N = 1, 2, 3, 4, 6. Thus, by Theorem 2, the partial correctness specification $\{n = N, N \ge 0, u = 1, v = 0, t = 0\}$ *fibonacci* $\{fib(N, u)\}$ is valid.

5 Automating the Correctness Proofs

The proof of partial correctness of the Fibonacci program presented in the previous section has been constructed in a semi-automatic way. Indeed, although the sequence of UNFOLDING and DEFINI-TION & FOLDING transformations is constructed according to the *Transform* strategy, the various steps within each UNFOLDING and DEFINITION & FOLDING transformation have been performed by hand without following a specific algorithm.

In this section we propose a technique for constructing partial correctness proofs of programs in a fully automatic way. In particular, we provide procedures for performing the UNFOLDING and DEFINI-TION & FOLDING transformations during the various applications of the *Transform* strategy.

We will illustrate our automatic proof technique by using again the Fibonacci example. As we will see, the correctness proof constructed by our fully automatic technique is different from the correctness proof constructed by semi-automatic technique. In particular, the automatic proof technique generates many more new predicate definitions than the semi-automatic one, where the ingenious introduction of predicate gen has been made.

Suppose that, in order to prove a specification $\{\varphi\} prog\{\psi\}$, we use Theorem 2 and, in particular, we want to show that:

 $M(OpSem \cup Aux \cup \{D\}) \not\models p$

where *D* is a clause which defines the predicate *p*, of the form:

D. $p \leftarrow Y > Z$, $r_{prog}(X_1, \ldots, X_s, Z)$, B'

(or a similar clause with Y > Z replaced by Y < Z). Our proof technique is made out of the following three transformation steps: (A) *Removal of the Interpreter*, (B) *Linearization*, and (C) *Iterated Specialization*, each of which is an instance of the *Transform* strategy with different UNFOLDING and DEFINITION & FOLDING procedures.

5.1 Removal of the Interpreter

This step is a variant of the *Removal of the Interpreter* strategy presented in [8].

In this step a specialized definition for r_{prog} is derived by transforming the CLP program *OpSem* into a new CLP program *OpSem_{RI}* where there will be no occurrences of the predicates *initConf*, *finalConf*, *reach*, and *tr*.

The derivation of the specialized definition for r_{prog} is performed by applying the *Transform* strategy starting from clause *R* of program *OpSem*. The UNFOLDING and DEFINITION & FOLDING procedures used in *Transform* are those defined in [8].

For instance, in the Fibonacci program, the inputs of the *Transform* strategy are $OpSem_{fibonacci}$ and clause R1 of Example 1. The output is the set {E1,E2,E3} of clauses shown in Section 4.

5.2 Linearization

The body of clause *D* may have several atoms. For instance, in our Fibonacci example the body of clause D5 defining predicate p5 contains three atoms with predicate r_fibonacci. In order to prove that p5 does not hold, it may be useful to exploit the interactions among these three atoms, instead of dealing with them individually in separate proofs. More in general, in order to exploit the interactions among the various atoms occurring in the body of clause *D*, we apply a transformation step, called *linearization*, which consists in transforming $OpSem_{RI} \cup Aux \cup \{D\}$ into a set $OpSem_{LN}$ of *linear recursive* clauses, that is, clauses whose body contains, besides the constraints, *at most one atom*, which corresponds to a conjunction of (one or more) atoms defined in $OpSem_{RI} \cup Aux \cup \{D\}$.

From a syntactic point of view, the *Linearization* transformation is also needed to prepare for the last step of our proof technique that consists in applying the *Iterated Specialization* strategy proposed in [8] (see Section 5.3). Indeed, this strategy requires as input a linear recursive CLP program, that is, a set of linear recursive clauses.

The *Linearization* strategy is a particular instance of the *Transform* strategy where: (i) the inputs are program $OpSem_{RI} \cup Aux \cup \{D\}$ and clause D itself, and (ii) the procedures UNFOLDING and DEFINI-TION & FOLDING are defined as follows.

UNFOLDING: From clause C derive a set U(C) of clauses by unfolding C with respect to every atom in its body;

DEFINITION & FOLDING:

- F(C) := U(C);
- for every clause E in F(C) of the form $H \leftarrow c$, $p_1(t_1), \ldots, p_k(t_k)$, where t_1, \ldots, t_k are tuples of terms, do if a clause of the form $newp(X_1, \ldots, X_k) \leftarrow p_1(X_1), \ldots, p_k(X_k)$ does not belong to *Defs* then add $newp(X_1, \ldots, X_k) \leftarrow p_1(X_1), \ldots, p_k(X_k)$ to *Defs* and to *InDefs*;

$$F(C) := (F(C) - \{E\}) \cup \{H \leftarrow c, newp(t_1, \dots, t_k)\}$$

od

By *Linearization* we indicate the *Transform* strategy using the two procedures UNFOLDING and DEFI-NITION & FOLDING we have defined above. It is easy to see that if *Aux* is a linear recursive program, then only a finite number of new predicates can be generated by the *Linearization* strategy, and hence the following theorem holds.

Theorem 4 (Termination of the Linearization Strategy) Suppose that Aux is a set of linear recursive clauses. Then the Linearization strategy terminates for the input program $OpSem_{RI} \cup Aux \cup \{D\}$, and the output $OpSem_{IN}$ is a linear recursive program.

In the Fibonacci example, by applying the *Linearization* strategy to the program made out of clauses {E1,E2,E3,D5} and clause D5 we get the following linear recursive program:

- p5 :- A=B+2, C=B+1, D=1, E=O, F=O, G=1, H=O, I=O, J=1, K=O, L=O, B>=O, M>N+N1, lin1(B,G,H,I,P,N1,Q,R,C,D,E,F,S,N,T,U,A,J,K,L,V,M,W,X).
- lin1(A,B,C,D,A,B,C,D,E,F,G,H,E,F,G,H,I,J,K,L,M,N,N1,P) :- I=Q+1, K=R-J, A=<0, E=<0, Q>=0, lin2(Q,R,J,J,M,N,N1,P).
- lin1(A,B,C,D,A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P,M,N,N1,P) :- Q=E-1, R=F+G, M=<0, A=<0, E>=1, lin2(Q,R,F,F,I,J,K,L).

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lin1(A,B,C,D,A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P,Q,R,S,T) :- M=U+1, N1=V-N, W=E-1,
X=F+G, A=<0, E>=1, U>=0, lin3(W,X,F,F,I,J,K,L,U,V,N,N,Q,R,S,T).
```

- lin1(A,B,C,D,E,F,G,H,I,J,K,L,I,J,K,L,M,N,N1,P,M,N,N1,P) :- Q=A-1, R=B+C, M=<0, I=<0, A>=1, lin2(Q,R,B,B,E,F,G,H).
- lin1(A,B,C,D,E,F,G,H,I,J,K,L,I,J,K,L,M,N,N1,P,Q,R,S,T) :- M=U+1, N1=V-N, W=A-1, X=B+C, I=<0, A>=1, U>=0, lin3(W,X,B,B,E,F,G,H,U,V,N,N,Q,R,S,T).
- lin1(A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P,Q,R,S,T,Q,R,S,T) :- U=I-1, V=J+K, W=A-1, X=B+C, Q=<0, A>=1, I>=1, lin3(W,X,B,B,E,F,G,H,U,V,J,J,M,N,N1,P).

lin1(A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P,Q,R,S,T,U,V,W,X) :- Q=Y+1, S=Z-R, A1=I-1, B1=J+K, C1=A-1, D1=B+C, A>=1, I>=1, Y>=0,

lin1(C1,D1,B,B,E,F,G,H,A1,B1,J,J,M,N,N1,P,Y,Z,R,R,U,V,W,X).

lin1(A,B,C,D,A,B,C,D,E,F,G,H,E,F,G,H,I,J,K,L,I,J,K,L) :- I=<O, A=<O, E=<O.

lin2(A,B,C,D,A,B,C,D) := A = < 0.

lin2(A,B,C,D,E,F,G,H) :- A=I+1, C=J-B, I>=0, lin2(I,J,B,B,E,F,G,H).

- lin3(A,B,C,D,A,B,C,D,E,F,G,H,E,F,G,H) := E < 0, A = < 0.
- lin3(A,B,C,D,A,B,C,D,E,F,G,H,I,J,K,L) :- E=M+1, G=N-F, A=<0, M>=0, lin2(M,N,F,F,I,J,K,L).
- lin3(A,B,C,D,E,F,G,H,I,J,K,L,I,J,K,L) :- M=A-1, N=B+C, I=<0, A>=1, lin2(M,N,B,B,E,F,G,H).

lin3(A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P) :- I=Q+1, K=R-J, S=A-1, T=B+C, A>=1, Q>=0, lin3(S,T,B,B,E,F,G,H,Q,R,J,J,M,N,N1,P).

where the predicates lin1, lin2, and lin3 are introduced during the *Linearization* strategy by the following definitions.

lin1(A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P,Q,R,S,T,U,V,W,X) :- r(A,B,C,D,E,F,G,H), r(I,J,K,L,M,N,N1,P), r(Q,R,S,T,U,V,W,X).

lin2(A,B,C,D,E,F,G,H) := r(A,B,C,D,E,F,G,H).

lin3(A,B,C,D,E,F,G,H,I,J,K,L,M,N,N1,P):-r(A,B,C,D,E,F,G,H), r(I,J,K,L,M,N,N1,P).

5.3 Iterated Specialization

In this third step, called the *Iterated Specialization* strategy, we perform a sequence of specialization steps that take advantage of the constraints occurring in the program $OpSem_{LN}$ derived at the end of the *Linearization* steps. (Note that so far, that is, during the *Removal of Interpreter* and the *Linearization* steps, the constraints did not play any significant role.)

Each specialization step of the sequence of specializations of the *Iterated Specialization* strategy produces a new CLP program with a specialized definition of the predicate p. Let $OpSem_{IS}$ be the last program of the sequence constructed so far. Two cases of particular interest may occur for $OpSem_{IS}$: *either* (i) the set of clauses defining p contains the fact $p \leftarrow$, or (ii) the set of clauses defining p is empty.

In case (i), $M(OpSem_{IS}) \models p$ and hence, by Theorem 1, $M(OpSem \cup Aux \cup \{D\}) \models p$. In case (ii), $M(OpSem_{IS}) \not\models p$ and hence, by Theorem 1, $M(OpSem \cup Aux \cup \{D\}) \not\models p$.

In the case where neither (i) nor (ii) holds, that is, in $OpSem_{IS}$ the predicate p is defined by a nonempty set of clauses not containing the fact $p \leftarrow$, we cannot establish by a syntactic check whether or not $M(OpSem_{IS}) \models p$ holds. Then, similarly to what has been proposed in [8], we proceed by iterating the specialization process, that is, we extend the sequence of programs constructed so far, by deriving one more program with a more specialized definition of p, in the hope that in this new program either case (i) or case (ii) holds. Obviously, due to undecidability limitations, it may be the case that, no matter how much we extend the sequence of programs generated by specialization, we never get a derived CLP program where either case (i) or case (ii) holds. However, as we have shown in [8], the *Iterated Specialization* strategy works well in many practical cases.

In our Fibonacci example, we apply the *Iterated Specialization* strategy, which at the end of the while loop derives the following CLP program (in this case the *Iterated Specialization* consists of one specialization step only):

p5 :- A=B+2, C=B+1, D=1, E=0, F=0, G=1, H=0, I=0, J=1, K=0, L=0, B>=0, M>N+Z, new1(B,G,H,I,P,Z,Q,R,C,D,E,F,S,N,T,U,A,J,K,L,V,M,W,X). new1(A,B,C,C,D,E,F,G,H,B,C,C,I,J,K,L,M,B,C,C,N,Z,P,Q) :- A=M-2, H=M-1, Z>E+J, B>=1, M>=2, M=R+1, S=B+C, T=H-1, U=B+C, V=A-1, W=B+C, A>=1, H>=1, R>=0, new1(V,W,B,B,D,E,F,G,T,U,B,B,I,J,K,L,R,S,B,B,N,Z,P,Q).

Since in the above program there is no constrained fact, all predicates are useless and they are removed by the final REMOVAL OF USELESS CLAUSES step. Hence *Iterated Specialization* terminates deriving the empty program. Thus, we have proved that $M(OpSem_{fibonacci} \cup \{D5\}) \not\models p5$. Similarly, as mentioned above, we can prove $M(OpSem_{fibonacci} \cup \{DN\}) \not\models pN$ for N = 1, 2, 3, 4, 6, and hence the specification (‡) of Example 1 in Section 3.1 is a valid.

We conclude this section by comparing the following two definitions: (i) the definition of the predicate new1 introduced in an automatic way by the *Iterated Specialization* strategy in the above correctness proof:

new1(A,B1,C1,C2,D,E,F,G,H,B2,C3,C4,I,J,K,L,M,B3,C5,C6,N,P,Q,R) :- A>=0, H=A+1, M=H+1, P>E+J, B1>=1, B1=B2, B2=B3, C1>=0, C1=C2, C2=C3, C3=C4, C4=C5, C5=C6, lin1(A,B1,C1,C2,D,E,F,G,H,B2,C3,C4,I,J,K,L,M,B3,C5,C6,N,P,Q,R).

and (ii) the definition of the predicate gen introduced in our semi-automatic proof presented in Section 4. These definitions of new1 and gen both allow the correctness proof to go through, but they have a significant difference in that the number of arguments of new1 is much larger than the number of arguments of gen. This difference is due to the fact that, when applying the *Linearization* strategy, the automatic procedure for DEFINITION & FOLDING collects all the variables occurring in the various calls to the predicate r and keeps them distinct with the goal of performing the subsequent folding steps.

5.4 Experimental Results

We have implemented our verification method in the VeriMAP transformation-based software model checker [9]. The verifier consists of a module, based on the C Intermediate Language (CIL) [25], that translates a partial correctness specification into a set of CLP clauses, and a module for CLP program transformation that performs the three applications of the *Transform* strategy, according to the method presented in Sections 5.1, 5.2, and 5.3, respectively.

We have performed an experimental evaluation of our method on a set of programs taken from the literature. Table 1 summarize the results of our experiments that have been performed on an Intel Core i5-2467M 1.60GHz processor with 4GB of memory under GNU/Linux OS.

| Program | Specified Function | Proof Time | | | |
|-------------------------------------|--|------------|----|--------|--------|
| 1 Togram | | RI | LN | IS | Total |
| fibonacci | <pre>fib(0,1). fib(1,1). fib(N3,F3):- N1>=0, N2=N1+1, N3=N2+1, F3=F1+F2,</pre> | 50 | 40 | 340 | 430 |
| remainder of integer division | <pre>rem(X,Y,X) :- X<y. :-="" rem(x,y,0)="" rem(x,y,z)="" x="">Y, X1=X-Y, rem(X1,Y,Z).</y.></pre> | 20 | 10 | 20 | 50 |
| greatest common divisor | gcd(X,Y,Z):-X <y,y1=y-x,gcd(x,y1,z). gcd(X,Y,X):-X=Y. gcd(X,Y,Z):-X>Y,X1=X-Y,gcd(X1,Y,Z).</y,y1=y-x,gcd(x,y1,z). | 30 | 20 | 80 | 130 |
| McCarthy's 91 function | mc91(X,Z):-X=<100,Z=91. mc91(X,Z):-X>=101,Z=X-10. | 40 | - | 40 | 80 |
| McCarthy's 91 function | <pre>mc91r(X,Z) :- X>=101, Z=X-10. mc91r(X,Z) :- X =< 100, X1=X+11, mc91r(X1,K), mc91r(K,Z).</pre> | 40 | 40 | 142611 | 142691 |
| integer division | idiv(M,K,O):-M+1= <k. idiv(M,K,Q1):-M>=K,M1=M-K,Q1=Q+1,idiv(M1,K,Q).</k. | 30 | 10 | 120 | 160 |
| even-odd multiplication | <pre>mult(J,0,0). mult(J,N1,Y1):-N1=N+1,Y1=Y+J,N>0,mult(J,N,Y).</pre> | 50 | 60 | 880 | 990 |

Table 1: Experimental results. The columns named *RI*, *LN*, *IS*, and *Total* show the times in milliseconds taken for the Removal of the Interpreter, the Linearization, the Iterated Specialization, and the total proof time (that is, RI + LN + IS), respectively. '-' means that the Linearization step for the program *McCarthy's 91 function* was not needed.

6 Conclusions

We have presented a method for proving partial correctness specifications of programs, given as Hoare triples of the form: $\{\varphi\} prog \{\psi\}$, where the assertions φ and ψ are predicates defined by a set of *possibly recursive* Constraint Logic Programming (CLP) clauses. Our method is based on a transformation strategy that uses unfold/fold rules, can be automated, and allows us to derive, starting from the given correctness problem, a set of *linear recursive* CLP clauses. Then, this derived set of linear recursive clauses can be processed by verifiers based on solvers for linear arithmetic constraints.

By using a preliminary implementation on our VeriMAP verification system [9], we have shown that our method works well on some verification problems. Although the verification problems we have considered refer to quite simple specifications, to the best of our knowledge they cannot be solved by state-of-the-art verifiers based on solvers for linear arithmetic (such as, among others, [1, 5, 8, 18, 15,

27, 28, 32]), as the postconditions are recursively defined predicates, and not linear constraints. We also believe that the *fibonacci* example cannot be proved either by using techniques based on polynomial invariants [30, 31] as the postconditions, being exponential, cannot be expressed as integer polynomials.

It should be mentioned that an alternative to fully automatic verification techniques is the use of tools that construct correctness proofs based on assertions provided at various program points (see, for instance, Dafny [20] and Why3 [13]). However, these tools leave to the user the task of introducing suitable invariant assertions, which very often are hard to find and require ingenuity.

Our paper is a contribution to the field of program verification based on the transformation approach. This approach has recently gained some popularity and several papers have been published (see, for instance, [2, 8, 14, 19, 22, 23, 27]). In particular, we have demonstrated the power of CLP program transformations as a means for: (i) translating correctness specifications into CLP programs, (ii) reducing the difficulty of the verification problems from non-linear recursive CLP programs to linear recursive CLP programs, and finally, (iii) solving the verification problem starting from linear recursive CLP programs.

As future work, we think of refining the transformation strategies we have proposed in this paper. In particular, more work can be done for enhancing the automation of the *Linearization* strategy (see Section 5) as the structure of the CLP program resulting from this transformation affects the rest of the verification process. Moreover, the results presented for total correctness in Section 3.3 show the need for a transformation strategy that deals with CLP programs with *negative* literals. Having that strategy at our disposal, we can then extend our method to perform in an automatic way also total correctness proofs.

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Appendix

Proof of Theorem 2 (Partial Correctness).

Let $dom_r(X_1, \ldots, X_s)$ be a predicate that represents the *domain* of the functional relation r_{prog} . We assume that $dom_r(X_1, \ldots, X_s)$ is defined by a set *Dom* of clauses, using predicate symbols not in *OpSem* \cup *Spec*, such that

 $M(OpSem \cup Dom) \models \forall X_1, \dots, X_s. ((\exists Y.r_{prog}(X_1, \dots, X_s, Y) \leftrightarrow dom_r(X_1, \dots, X_s))$ (1) Let us denote by $Spec^{\sharp}$ the set of clauses obtained from Spec by replacing every clause $f(X_1, \dots, X_s, Y) \leftarrow B$ by the clause $f(X_1, \dots, X_s, Y) \leftarrow dom_r(X_1, \dots, X_s), B$. Then, for all integers p_1, \dots, p_s, y ,

$$M(Spec^{\sharp} \cup Dom) \models f(p_1, \dots, p_s, y) \text{ implies } M(Spec) \models f(p_1, \dots, p_s, y)$$
(2)

Moreover, let us denote by *Spec'* the set of clauses obtained from $Spec^{\sharp}$ by replacing all occurrences of f by r_{prog} . We show that $M(OpSem \cup Aux \cup Dom) \models Spec'$.

Let *S* be any clause in *Spec'*. If *S* belongs to *Aux*, then $M(OpSem \cup Aux) \models S$. Otherwise, *S* is of the form $r_{prog}(X_1, \ldots, X_s, Y) \leftarrow dom_r(X_1, \ldots, X_s), B'$ and, by construction, in F_{pc} there are two clauses

$$D_1: p_1 \leftarrow Y > Z, r_{prog}(X_1, \ldots, X_s, Z), B'$$
, and

$$D_2: p_2 \leftarrow Y < Z, r_{prog}(X_1, \ldots, X_s, Z), B'$$

such that $M(OpSem \cup Aux \cup \{D_1\}) \not\models p_1$ and $M(OpSem \cup Aux \cup \{D_2\}) \not\models p_2$. Then,

 $M(OpSem \cup Aux) \models \neg \exists (Y \neq Z \land r_{prog}(X_1, \ldots, X_s, Z) \land B')$

Since by (1) $M(OpSem \cup Dom) \models r_{prog}(X_1, \dots, X_s, Z) \rightarrow dom_r(P_1, \dots, P_s)$, we also have that

 $M(OpSem \cup Aux \cup Dom) \models \neg \exists (Y \neq Z \land dom_r(X_1, \ldots, X_s) \land r_{prog}(X_1, \ldots, X_s, Z) \land B')$

From the functionality of r_{prog} it follows that

$$M(OpSem \cup Aux \cup Dom) \models$$

$$\neg r_{prog}(X_1,\ldots,X_s,Y) \leftrightarrow (\neg \exists Z.r_{prog}(X_1,\ldots,X_s,Y) \lor (r_{prog}(X_1,\ldots,X_s,Z) \land Y \neq Z))$$

and hence, by using (1),

$$M(OpSem \cup Aux \cup Dom) \models \neg \exists (dom_r(X_1, \ldots, X_s) \land \neg r_{prog}(X_1, \ldots, X_s, Y) \land B')$$

Thus, we have that

 $M(OpSem \cup Aux \cup Dom) \models \forall (dom_r(X_1, \ldots, X_s) \land B' \to r_{prog}(X_1, \ldots, X_s, Y))$

that is, clause *S* is true in $M(OpSem \cup Aux \cup Dom)$.

Thus, we proved that $M(OpSem \cup Aux \cup Dom) \models Spec'$.

We can also conclude that $M(OpSem \cup Aux \cup Dom)$ is a model of $Spec' \cup Dom$, and since by definition $M(Spec' \cup Dom)$ is the *least* model of $Spec' \cup Dom$, we have that

 $M(Spec' \cup Dom) \subseteq M(OpSem \cup Aux \cup Dom)$

(3)

Next we show that, for all integers p_1, \ldots, p_s, y ,

$$M(Spec^{\sharp} \cup Dom) \models f(p_1, \dots, p_s, y) \quad \text{iff} \quad M(OpSem) \models r_{prog}(p_1, \dots, p_s, y) \tag{4}$$

Only If Part of (4). Suppose that $M(Spec^{\sharp} \cup Dom) \models f(p_1, \dots, p_s, y)$. Then, by construction,

 $M(Spec' \cup Dom) \models r_{prog}(p_1, \ldots, p_s, y)$

and hence, by (3),

 $M(OpSem \cup Aux \cup Dom) \models r_{prog}(p_1, \dots, p_s, y)$

Since r_{prog} does not depend on predicates in $Aux \cup Dom$,

 $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, y)$

If Part of (4). Suppose that $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, y)$.

Then, by definition of r_{prog} ,

$$M(Dom) \models dom_r(p_1, \dots, p_s) \tag{5}$$

and

$$M(Spec) \models pre(p_1, \dots, p_s) \tag{6}$$

Thus, by (6) and Condition 4.2 of Definition 1, there exists z such that

$$M(Spec) \models f(p_1, \dots, p_s, z) \tag{7}$$

By (5) and (7),

$$M(Spec^{\sharp} \cup Dom) \models f(p_1, \dots, p_s, z) \tag{8}$$

By the Only If Part of (4),

 $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, z)$

and by the functionality of r_{prog} , z = y. Hence, by (8),

 $M(Spec^{\sharp} \cup Dom) \models f(p_1, \dots, p_s, y)$ Thus, we proved (4).

Now let us prove partial correctness.

Let φ be $z_1 = p_1 \land \ldots \land z_s = p_s \land pre(p_1, \ldots, p_s)$. If $M(Spec) \models pre(p_1, \ldots, p_s)$ and prog terminates, that is, $M(Dom) \models dom_r(p_1, \ldots, p_s)$, then for some integer y, $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, y)$. Thus, by (4), $M(Spec^{\sharp} \cup Dom) \models f(p_1, \ldots, p_s, y)$ and hence, by (2), $M(Spec) \models f(p_1, \ldots, p_s, y)$. Suppose that the postcondition ψ is $f(p_1, \ldots, p_s, z_k)$. Then, by Condition 4.1 of Definition 1, $y = z_k$. Thus, $\{\varphi\} prog \{\psi\}$.

Proof of Theorem 3 (Total Correctness).

Let us denote by *Spec'* the set of clauses obtained from *Spec* by replacing all occurrences of f by r_{prog} . Then, for all integers p_1, \ldots, p_s, y ,

$$M(Spec) \models f(p_1, \dots, p_s, y) \text{ iff } M(Spec') \models r_{prog}(p_1, \dots, p_s, y)$$

$$\tag{9}$$

The hypothesis that, for all clauses D in F_{tc} , $M(OpSem \cup Aux \cup \{D\}) \not\models p$, where p is the head predicate of D, implies that every clause of Spec' is true in $M(OpSem \cup Aux)$, that is, $M(OpSem \cup Aux)$ is a model of Spec'. Since, M(Spec') is the *least* model of Spec', we have that

$$M(Spec') \subseteq M(OpSem \cup Aux) \tag{10}$$

Now we prove that, for all integers p_1, \ldots, p_s, y ,

 $M(Spec) \models f(p_1, \dots, p_s, y) \text{ iff } M(OpSem) \models r_{prog}(p_1, \dots, p_s, y)$ (11)

Only If Part of (11). Suppose that $M(Spec) \models f(p_1, \dots, p_s, y)$. Then, by (9),

 $M(Spec') \models r_{prog}(p_1, \ldots, p_s, y)$

and hence, by (10),

 $M(OpSem \cup Aux) \models r_{prog}(p_1, \dots, p_s, y)$

Since r_{prog} does not depend on predicates in Aux,

 $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, y)$

If Part of (11). Suppose that

 $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, y)$

Then, by definition of r_{prog} ,

 $M(Spec) \models pre(p_1, \ldots, p_s)$

Thus, by Condition 4.2 of Definition 1, there exists *z* such that $M(Spec) \models f(p_1, \ldots, p_s, z)$. By the Only If Part of (11), $M(OpSem) \models r_{prog}(p_1, \ldots, p_s, z)$ and by the functionality of r_{prog} (see Lemma 1 (i)), we have that z = y. Hence,

 $M(Spec) \models f(p_1, \ldots, p_s, y)$

Thus, we have proved (11).

Now let us prove total correctness. By definition of r_{prog} in OpSem, if $M(Spec) \models pre(p_1, ..., p_s)$ holds and *prog* terminates, then, for some integer y, $M(OpSem) \models r_{prog}(p_1, ..., p_s, y)$, and hence, by (11), $M(Spec) \models f(p_1, ..., p_s, y)$. Suppose that the postcondition ψ is $f(p_1, ..., p_s, z_k)$. Then, by Condition 4.1 of Definition 1, $y = z_k$. Thus $\{\varphi\} prog \{\psi\}$.

Moreover, by Condition 4.2 of Definition 1 and (11), we have that, for all integers p_1, \ldots, p_s ,

$$M(OpSem) \models pre(p_1, \ldots, p_s) \rightarrow \exists Y. r_{prog}(p_1, \ldots, p_s, Y)$$

and, by Lemma 1, *prog* terminates. Thus, $[\phi] prog [\psi]$.