Automated Certification of Logic Program Groundness Analysis

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Abstract. In this paper, we are interested in the combination of abstract interpretation and interactive theorem proving, which stand at the opposite ends of the program verification automation spectrum. Our idea is to take advantage of the respective strengths of these two techniques. As a first case study, we focus on groundness analysis of logic programs. Using the proof assistant LPTP (Logic Program Theorem Prover), we automate the formal certification of groundness invariants generated by abstract interpretation. We present an experimental evaluation of our approach by applying it to a set of logic programs. Our experiments are twofold. On the one hand, to certify groundness invariants we use automated theorem provers drawing on the theoretical framework of LPTP. On the other hand, we generate and certify natural deduction proofs of groundness invariants with the proof checker of LPTP.

Keywords: Abstract interpretation \cdot Certification \cdot Groundness analysis

1 Introduction

Abstract interpretation [8] is a tool of choice for the static analysis of programming languages. In practice, abstract interpreters are complex programs and potentially contain defects, which raises the question of the validity of the computed information [5]. This article describes two possible answers in the context of groundness analysis of logic programs. Our goal is to automatically certify groundness properties inferred by bottom-up abstract interpretation. We rely on the theoretical framework of LPTP (Logic Program Theorem Prover) [17] and its implementation. On the one hand, we use automated demonstration to prove our target conjectures expressed in the specification language of LPTP axiomatized in first order logic. On the other hand, we first construct derivations of the groundness properties by running an implemented completeness theorem for propositional natural deduction, as natural deduction is the proof format of LPTP. Then we certify these derivations by using the proof checker integrated in LPTP.

This article is organized as follow. In Section 2, we introduce some preliminary notions. Section 3 highlights analysis techniques based on abstract interpretation applied to logic programs to infer inter-arguments relations as boolean

relations. In Section 4, we leverage automated theorem proving to generate proofs of groundness properties expressed in FOF (First Order Form), a well-known logic language from TPTP (Thousands of Problems for Theorem Provers) [18] for expressing first-order logic axioms and conjectures. Section 5 describes how we formulate groundness properties in LPTP syntax directly from the invariants inferred by abstract interpretation. We present an algorithm to construct a derivation in natural deduction for these properties in the theoretical framework of LPTP. To do so, we explicit elements based on the proof by induction of a propositional formula. Finally, in Section 6, we present an experimental evaluation of the two approaches on several logic programs.

2 Preliminaries

We refer to [1,13] for the basics of logic programming including SLD resolution for the operational semantics. We only consider positive logic programs and our reference semantics is the s-semantics [3], a non-ground semantics of logic programs. Let P be a positive logic program. Elements of the least fixpoint of the immediate consequences operator T_P are approximated by abstract compilation, for instance using a boolean bottom-up implementation of T_P .

We will prove that these elements belong to the non-ground representation of the least term model M_P of P with LPTP. According to [3], as $M_P = lfp(T_P)$, these proofs certify that these elements belong to the least fixpoint of T_P for the s-semantics.

3 Groundness Analysis

Abstract interpretation [8] is a formal method applied to approximate program semantics by collecting information about data flow for concrete domains, which can be unbounded when the program is executed. The result of this static analysis is an abstraction of the program behaviour [7]. Abstract interpretation was extended to the analysis of logic programs [4,9].

In the context of cTI (constraint-based Termination Inference) [15], an abstract interpretation technique named abstract compilation provides approximations of the analysed program. These approximations are expressed as interarguments relations in the form of boolean relations. We use them to formulate groundness properties. Indeed, dependencies between variables groundness can be represented by boolean constraints [2]. For instance, a relation such as "if the variable Y is instantiated to a ground term, then the variable X is ground" can be denoted by the boolean constraint $y \Rightarrow x$. The boolean variable y (resp. x) represents the instantiation state (ground or possibly not ground) of the variable Y (resp. X).

Let us consider the logic program P defining the predicate append/3:

```
append([], Xs, Xs).
append([X|Xs], Ys, [X|Zs]) :-
   append(Xs, Ys, Zs).
```

The analysis of P by abstract interpretation provides the inter-argument dependency relation $(x \wedge y) \Leftrightarrow z$. This formula expresses the fact that if the call $\operatorname{append}(x,y,z)$ succeeds, then, after its proof (via SLD-resolution or bottom-up computation) the third argument z is ground if and only if the first argument x and the second argument y are ground.

4 Automatic proofs by Automated Theorem Proving

In the mid-90s, Robert F. Stärk showed that for any logic programs P, if gr(t) is provable, (gr/1) is a predefined predicate of IND(P), the theoretical framework of LPTP), then t is ground [17]. So gr(t) actually expresses the groundness of a term t. IND(P) consists of first-order logic axioms associated to P. This theory includes Clark's completion [6] and induction along the definition of the predicates. This guarantee allows us to formulate groundness properties about P in the specification language of LPTP, whose semantics is the first-order calculus of classical logic [17].

We follow the methodology introduced in [14] to prove groundness properties inferred by abstract interpretation. The requirements for proving a property are the corresponding logic program P (append in our running example) and the invariant to be certified. We compile P into the FOF version of IND(P). Moreover, the groundness property to prove and its induction axiom are compiled as a FOF conjecture. Both this conjecture and IND(P) are stored in a single file. For instance, for our running example, the conjecture is

```
fof('lemma-append3', conjecture,
  ! [Xx1,Xx2,Xx3] : ( append_succeeds(Xx1,Xx2,Xx3)
  => ( ( ( ( gr(Xx3) & gr(Xx2) ) & gr(Xx1) ) |
      (( ~ ( gr(Xx3) ) & gr(Xx2) ) & ~ ( gr(Xx1) ) ) |
      (( ~ ( gr(Xx3) ) & ~ ( gr(Xx2) ) ) & gr(Xx1) ) ) |
      (( ~ ( gr(Xx3) ) & ~ ( gr(Xx2) ) ) & ~ ( gr(Xx1) ) ) )).
```

Then we apply both *Vampire* [12] and *E Theorem Prover* [16] to the FOF file to try to prove the conjecture within a time limit. So we get either a positive answer or a "don't know" answer. We also have a trace of the positive answer. This trace is not expressed as a LPTP derivation but in a FOF format. The results of our experiments on several logic programs are reported in Sect. 6.

5 Automatic Generation of LPTP Proofs

We consider a groundness property formula provided by cTI for a pure logic program P. In [14], we showed IND(P) (see [17]) allows us the generate an induction axiom for a directly recursive predicate and a formula to prove. For example, let us prove Lemma $append3_gr$ below that is inferred by abstract interpretation, where the expression \mathbf{S} append(x_1, x_2, x_3) expresses success of the goal

 $append(x_1, x_2, x_3)$ and the unary predicate gr of LPTP expresses groundness of its argument.

Lemma [$append3_gr$] $\forall x_1, x_2, x_3$ (**S** append $(x_1, x_2, x_3) \rightarrow (gr(x_3) \land gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land gr(x_2) \land \neg gr(x_1)) \lor (\neg gr(x_3) \land \neg gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land \neg gr(x_2) \land \neg gr(x_1))$.

Axiom II of IND(P), whose application is hard-coded in LPTP, allows one to introduce equivalences involving gr applied to compound terms:

Axiom II of IND(P) for gr [17]

```
4. gr(c) [if c is a constant]
5. gr(x_1) \wedge \ldots \wedge gr(x_m) \leftrightarrow gr(f(x_1, \ldots, x_m)) [f is m-ary]
```

The automatic translation by LPTP of the code of ${\tt append/3}$ into an inductive definition results in the formula:

$$\forall x,y,z \Big(\mathbf{S} \, \mathsf{append}(x,y,z) \leftrightarrow (x = [] \land z = y) \lor \\ \exists v_0,xs,zs (x = [v_0|xs] \land z = [v_0|zs] \land \mathbf{S} \, \mathsf{append}(xs,y,zs)) \Big)$$

The general form of the groundness property to prove is an implication whose conclusion is in clausal disjunctive normal form. It is derived from the groundness formula inferred by cTI:

$$\forall x_1, \dots, x_n \ \mathbf{S} \ R(x_1, \dots, x_n) \to \bigvee \bigwedge gr_ngr(x_j)$$

where R is a n-ary user-defined predicate and $gr_ngr(x_j)$ denotes either $gr(x_j)$ or $\neg gr(x_j)$.

We implement an algorithm inspired by the proof of the next proposition, which is used in [11] to show the completeness of natural deduction for propositional logic.

Proposition 1 (Prop. 1.38 of [11]). Let ϕ be a formula such that p_1, \ldots, p_n are its only propositional atoms. Let l be any line number in ϕ 's truth table. For all $1 \le i \le n$, let \hat{p}_i be p_i if the entry in line l of p_i is True, otherwise \hat{p}_i is $\neg p_i$. Then we have

- 1. $\hat{p}_1, \ldots, \hat{p}_n \vdash \phi$ is provable if the entry for ϕ in line l is True.
- 2. $\hat{p}_1, \ldots, \hat{p}_n \vdash \neg \phi$ is provable if the entry for ϕ in line l is False.

This result is proved by structural induction on ϕ . Taking our inspiration from it, we replace the propositional variables in the groundness formula to prove by calls to gr. As LPTP is implemented in Prolog, we reuse its syntax, its declarative operator **S** for predicate success and its tactics to mechanize the generation of a complete proof term.

First of all, we enumerate the variables of the target groundness formula ϕ . The idea is to generate a proof matching the lines of the truth table of ϕ . We note

```
prove_with_premises(Phi, TruthValue, Premises)
  switch Phi
    case gr(Form) :
      Deriv := assemble_derivation(gr(Form), TruthValue, Premises)
    case ~ Form :
      Deriv := prove_with_premises(Form, ~ TruthValue, Premises)
    case Phi1 & Phi2 :
      D1 := prove_with_premises(Phi1, TruthValue, Premises)
      D2 := prove_with_premises(Phi2, TruthValue, Premises)
      Deriv := concat(D1, D2)
    case Phi1 \/ Phi2 :
      D1 := prove_with_premises(
        Phi1, TruthValue, concat(~ Phi2, Premises)
      D2 := prove_with_premises(
        Phi2, TruthValue, concat(~ Phi1, Premises)
      Deriv := concat(D1, D2)
    case Phi1 => Phi2 :
      Deriv := prove_with_premises(
        Phi2, TruthValue, concat(Phi1, Premises)
  return Deriv
```

We apply the disjunction elimination rule in a systematic way from the 2^n cases we get. This can be translated directly in LPTP by the recursive application of the *cases* tactic for disjunctions expressing that a variable is ground or free. The target groundness formula ϕ is reduced by syntactic decomposition to produce a derivation. Hence, the sequents we get depend solely on the premises originating from the successive application of the law of excluded middle for each variable. As a result, we cover all 2^n groundness cases for all variables at stake by grouping these sequents altogether.

Back to our running example, the induction axiom schema for append/3 and the groundness formula provided by abstract interpretation allow us to generate a proof of Lemma append3 gr with two gaps (**GAP**), one in the base case and

one in the induction step. We apply the algorithm described above to fill these gaps. In both cases, we aim at proving a tautology (for all possible variables groundness) in disjunctive normal form. Beginning with the base case (between the two horizontal lines below), we observe that gr([]) is true by application of Axiom II.4 of IND(P). Moreover, we find the unique variable x_4 , so two cases must be considered depending on its groundness. The algorithm previously described provides the following excerpt after filling the gap in the base case.

```
Lemma [append3 gr] \forall x_1, x_2, x_3 (S append(x_1, x_2, x_3) \rightarrow
(gr(x_3) \land gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land gr(x_2) \land \neg gr(x_1)) \lor
(\neg gr(x_3) \land \neg gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land \neg gr(x_2) \land \neg gr(x_1))).
Proof.
Induction<sub>0</sub>: \forall x_1, x_2, x_3 (\mathbf{S} \text{ append}(x_1, x_2, x_3) \rightarrow
    (gr(x_3) \land gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land gr(x_2) \land \neg gr(x_1)) \lor
    (\neg gr(x_3) \land \neg gr(x_2) \land gr(x_1)) \lor (\neg gr(x_3) \land \neg gr(x_2) \land \neg gr(x_1))).
   Hypothesis_1: none.
        Case<sub>3</sub>: gr(x_4). gr(x_4) \wedge gr(x_4). gr(x_4) \wedge gr(x_4) \wedge gr([]).
            (g\overline{r}(x_4) \wedge gr(x_4) \wedge gr([])) \vee (\neg gr(x_4) \wedge gr(x_4) \wedge \neg gr([])).
            (gr(x_4) \land gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor
            (\neg gr(x_4) \land \neg gr(x_4) \land gr([])).
            (gr(x_4) \land gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor
            (\neg gr(x_4) \land \neg gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land \neg gr(x_4) \land \neg gr([])).
        Case<sub>2</sub>: \neg gr(x_4). \neg gr(x_4) \land \neg gr(x_4).
            \neg gr(x_4) \wedge \neg gr(x_4) \wedge gr([]). (gr(x_4) \wedge gr(x_4) \wedge gr([])) \vee
            (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor (\neg gr(x_4) \land \neg gr(x_4) \land gr([])).
            (gr(x_4) \land gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor
            (\neg gr(x_4) \land \neg gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land \neg gr(x_4) \land \neg gr([])).
        Hence, in all cases: (gr(x_4) \land gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor
        (\neg gr(\bar{x_4}) \land \neg gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land \neg gr(x_4) \land \neg gr([])).
    Conclusion<sub>1</sub>: (gr(x_4) \land gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land gr(x_4) \land \neg gr([])) \lor
    (\neg gr(x_4) \land \neg gr(x_4) \land gr([])) \lor (\neg gr(x_4) \land \neg gr(x_4) \land \neg gr([])).
   Hypothesis<sub>1</sub>: \forall x_5, x_6, x_7, x_8 (gr(x_8) \land gr(x_7) \land gr(x_6) \lor
        \neg gr(x_8) \land gr(x_7) \land \neg gr(x_6) \lor \neg gr(x_8) \land \neg gr(x_7) \land gr(x_6) \lor
        \neg gr(x_8) \wedge \neg gr(x_7) \wedge \neg gr(x_6) and S append(x_6, x_7, x_8)). \bot by GAP.
   Conclusion<sub>1</sub>: (gr([x_5|x_8]) \land gr(x_7) \land gr([x_5|x_6])) \lor (\neg gr([x_5|x_8]) \land gr(x_7) \land gr(x_7))
\neg gr([x_5|x_6])) \lor (\neg gr([x_5|x_8]) \land \neg gr(x_7) \land gr([x_5|x_6])) \lor (\neg gr([x_5|x_8]) \land \neg gr(x_7) \land gr(x_7)) \lor (\neg gr([x_5|x_8]) \land \neg gr(x_7) \land gr(x_7) \land gr(x_7) \lor (\neg gr([x_5|x_8]) \land \neg gr(x_7) \land gr(x_7)))
\neg gr([x_5|x_6])). \square
```

We apply the same technique to the induction step after enumerating its variables (x_5, x_6, x_7, x_8) . The complete derivations are publicly available online¹. Finally, we check the generated proof term with LPTP to certify the derivations that we have built.

 $^{^1\} github.com/atp-lptp/automated-certification-of-logic-program-groundness-analysis$

6 Experimentation

We experimented our methodology using programs from the LPTP library, to which other programs were added, see Table 1, sorted in ascending order of number of lines of code in LPTP format (column LOC).

Inf. V/E FOF Deriv. Cert. LOC Prog. Prop. Vars (ms)(ms)LOC (ms) (ms) member.pl for.pl addmul.pl ackermann.pl fib.pl nat.pl int.pl split.pl suffix.pl list.pl derivDLS.pl reverse.pl average1.pl permutation.pl transitiveclosure.pl sort.pl 867612 319 12187 71067

Table 1. Experimental results

We used SWI-Prolog version 9.2.2 and an Apple MacBook Pro M2 running macOS Sonoma 14.6.1. For each program (column Prog.), we measured the number of groundness properties inferred by cTI (column Prop.), the total number of variables that these properties contain (column Vars) and the time it takes for cTI to compute them (column Inf.). Using the methodology described in Sect. 4 (without proof reconstruction in LPTP format), we successfully certified all these properties automatically using Vampire (version 4.9) and E Theorem Prover (version 3.1), with a time limit of 1 min. The shortest certification time performed by either Vampire or E Theorem Prover has been reported in column V/E. The number of lines of the proofs in FOF format is provided in column FOF LOC. We also applied the technique presented in Sect. 5. We measured the time required to construct the groundness properties proof (column Deriv.) and the time to certify their derivations with LPTP (column Cert.).

We didn't find any wrong invariant from this limited experiment. Such a case would result in a timeout in the V/E column and a failure to construct the LPTP derivation for the wrong invariant.

We observe that the number of lines in the FOF format proofs (column FOF LOC) ranges from comparable to up to an order of magnitude greater than the number of lines of code in LPTP format (column LOC). Moreover, the space

complexity to generate the derivation cases is exponential in the number of variables occurring in each groundness property. This complexity is one of the main limitations of our implementation. It originates from the choice of Huth and Ryan's algorithm to construct a tautology in natural deduction.

7 Conclusion

Proof assistants like Isabelle with Sledgehammer use tools like $cvc5^2$ without abstract interpretation. Using such tools participates in saving time when proving facts by suggesting lemmas and tactics. In order to keep the possibility for users to check entire proofs, a proof reconstruction mechanism based on certificates has been introduced [10].

This article illustrated this idea in the context of logic programming. We combine the advantage of invariants algorithmic generation by abstract interpretation and formal verification offered by an interactive proof assistant. We have considered two techniques to certify groundness properties. First, we leveraged automated theorem provers without guaranteed termination and no proof in LPTP format. Second, we have used the proof checker integrated within LPTP by automatically constructing proofs for each groundness property by applying Huth and Ryan's algorithm, which always terminates, with a complexity exponential in the number of propositional variables.

More in-depth work is needed to better compare these two techniques. We would like to take into account negation by failure as well. We aim at reducing computing time complexity exposed above. Other inter-arguments relations types, matching other abstract domains and proof procedures, belong to paths yet to be explored to show the genericity of our approach.

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 $^{^2}$ https://cvc5.github.io/blog/2024/03/15/isabelle-reconstruction.html

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