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# Data Abstraction: A General Framework to Handle Program Verification of Data Structures

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## Abstract:

Proving properties on programs accessing data structures such as arrays often requires universally quantified invariants, e.g., “all elements below index  $i$  are nonzero”. In this research report, we propose a general data abstraction scheme operating on Horn formulas, into which we recast previously published abstractions. We show our instantiation scheme is relatively complete: the generated purely scalar Horn clauses have a solution (inductive invariants) if and only if the original problem has one expressible by the abstraction.

**Key-words:** Program Analysis, Data Structures, Abstractions, Horn Clauses

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# Data Abstraction: A General Framework to Handle Program Verification of Data Structures

**Résumé :** Pour prouver des propriétés de programmes qui manipulent des structures de données comme des tableaux, nous avons besoin de savoir résoudre des formules comportant des quantificateurs universels: par exemple, “tous les éléments d’index inférieur à  $i$  sont différents de 0”. Dans ce rapport de recherche, nous proposons une technique générale d’abstraction opérant sur des Clauses de Horn, qui permet de reformuler un certain nombre d’abstractions déjà publiées. Nous montrons que notre schéma d’abstraction est relativement complet: le système de clauses purement scalaires a une solution (sous forme d’invariants inductifs) si et seulement si le problème initial a une solution exprimable dans la logique de l’abstraction.

**Mots-clés :** Analyse de Programmes, Structures de données, Abstractions, Clauses de Horn

# 1 Introduction

Static analysis of programs containing unbounded data structures is challenging, as most interesting properties require quantifiers. Even stating that all elements of an array are equal to 0 requires them ( $\forall i, a[i] = 0$ ), let alone more complex cases such as Example 1. In general, the satisfiability of arbitrary quantified properties on unbounded data structures is undecidable [BMS06], thus there is no algorithm for checking that such properties are inductive, nor inferring them.

The first step is to select an abstract domain to search for invariants, e.g., properties of the form  $\forall i, P(a[i])$  for some predicate  $P$  and array  $a$ . In this paper, we describe a transformation from and to Horn clauses such that these properties may be expressed in the transformed Horn clauses without using quantifiers. For the array datastructure, our scheme can optionally completely remove arrays from the transformed Horn clauses. This transformation is *sound* and *relatively complete*: the resulting problem, to be fed to a solver for Horn clauses, such as Eldarica or Z3, has a solution if and only if the original one has one within the chosen abstract domain. In short, we reduce problems involving quantifiers and arrays to problems that do not, with no loss of precision with respect to the abstract domain.

**Example 1** (Running example). *The following program initializes an array to even values, then increases all values by one and checks that all values are odd. We wish to prove that the assertion is verified.*

```
for(k=0; k<N; k++) /*Program point For1*/ a[k] = rand()*2;
for(k=0; k<N; k++) /*Program point For2*/ a[k] = a[k]+1;
for(k=0; k<N; k++) /*Program point For3*/ assert(a[k] % 2 == 1);
```

**Contributions** (i) an abstraction framework for Horn clauses using unbounded data structures, that we call *data abstraction*; (ii) the analysis of a property we call *relative completeness* in this framework (iii) and the use of that framework to handle programs with arrays and its experimental evaluation.

**Contents** Section 2 introduces Horn Clauses' concepts and notations. Sections 3 and 4 expose our data abstraction framework and its *relative completeness analysis*. Section 5 considers a data abstraction for arrays. Finally, Section 6 proposes a full algorithm to analyze programs with arrays and its experimental evaluation. The appendix contains the proofs of theorems.

## 2 Preliminaries: Horn clauses

### 2.1 Solving Programs with assertions using Horn Clauses

Programs with assertions can be transformed into Horn clauses using tools such as SeaHorn [GKKN15] or JayHorn [KRS19]. The syntax of Horn clauses is recalled in Def. 2. A basic transformation consists in associating a predicate to each point of the control flow graph; program start is a clause, control edges are inductive relations (clauses), and assertions  $A$  are clauses  $\neg A \rightarrow \text{false}$ .<sup>1</sup>

**Example 2** (Example 1 transformed into Horn clauses). *Running example where all predicates  $For_i$  have arity 3 (1 array and 2 integer parameters). Clause (4) in bold, will be used throughout the paper.*

$$For1(a, N, k) \wedge k < N \rightarrow For1(a[k \leftarrow r * 2], N, k + 1) \quad (1)$$

$$For1(a, N, k) \wedge k \geq N \rightarrow For2(a, N, 0) \quad (2)$$

$$\mathbf{For2(a, N, k) \wedge k < N \rightarrow For2(a[k \leftarrow a[k] + 1], N, k + 1)} \quad (3)$$

$$For2(a, N, k) \wedge k \geq N \rightarrow For3(a, N, 0) \quad (4)$$

$$For3(a, N, k) \wedge k < N \wedge a[k] \% 2 \neq 1 \rightarrow \text{false} \quad (5)$$

$$For3(a, N, k) \wedge k < N \rightarrow For3(a, N, k + 1) \quad (6)$$

*Variables are local: the  $a$  of Clause 1 is not formally related to the  $a$  of Clause 4.*

<sup>1</sup>Tools such as SeaHorn [GKKN15] handle richer languages such as llvm bytecode, but the generated clauses are more complex and further removed from their initial semantics. Such clauses fall within our data abstraction framework, but not within the scope of the experimental evaluation of this paper.

A solution to such a system of Horn clauses is a set of inductive invariants suitable for proving the desired properties. Horn clause systems can be solved by tools such as Z3, Eldarica, ... A “Sat” answer means that the inductive invariants exist and thus the program is correct.<sup>2</sup> “Unsat” means that a counterexample was found, leading to an assertion violation. “Unknown” means the tool fails to converge on a possible invariant. Finally, the tool may also timeout.

## 2.2 Horn Clauses and Horn problems

In our setting, a Horn clause is a boolean expression over free variables and predicates with at most one positive predicate.

**Definition 1** (Expressions  $expr$ , positive and negative predicates  $P$ , models  $\mathcal{M}$  and semantics  $expr(vars)$ ,  $\llbracket expr \rrbracket_{\mathcal{M}}$ ). *In this paper we do not constrain the theory on which expressions are written, the only constraint being that the backend solver must handle it. An expression may contain quantifiers, free variables and predicates. A predicate is a typed name which will be a set when interpreted in a model.*

**Expression evaluation** : There are two evaluation contexts for expressions:

1. **Models**, written  $\mathcal{M}$ : map each predicate to a set of the corresponding type
2. **Environments**, written  $vars$ , that to each free variable of the expression associates a value of the corresponding type

$\llbracket expr \rrbracket_{\mathcal{M}}$  denotes the evaluation of an expression  $expr$  in a model  $\mathcal{M}$  is written,  $expr(vars)$  denotes its the evaluation in the environment  $vars$ ,  $\llbracket expr(vars) \rrbracket_{\mathcal{M}}$  denotes joint evaluation. Furthermore, if an expression value is independent of the model or environment, we may use it directly as its evaluation.

**Positive and negative predicates** : A predicate instance in a boolean expression  $expr$  is deemed negative (resp. positive) if and only if there is a negation (resp. no negation) in front of it when  $expr$  is in negative normal form.

**Definition 2** (Horn Clauses, extended, normalized, satisfiability). *A Horn clause is simply any expression without quantifiers (but with free variables) containing at most one positive predicate.*

**Extended Horn clause** : a Horn clause which may use quantifiers.

**Normalized Horn clause** : Normalized Horn clauses are in the form  $P_1(e_1) \wedge \dots \wedge P_n(e_n) \wedge \phi \rightarrow P'(e')$  where:

- $e_1, \dots, e_n, \phi, e'$  are expressions without predicates but with free variables.
- $P_1, \dots, P_n$  are the “negative” predicates
- $P'$  is the positive predicate or some expression

**Satisfiability**: A set of Horn clauses  $\mathfrak{C}$  is said to be satisfiable if and only if  $\exists \mathcal{M}, \forall C \in \mathfrak{C}, \llbracket \forall vars, C(vars) \rrbracket_{\mathcal{M}}$ . In this paper, we will denote clauses in capital letters:  $C$ , sets of clauses in Fraktur:  $\mathfrak{C}$ , and models in calligraphic:  $\mathcal{M}$ .

**Definition 3** (Notations  $ite, f[a \leftarrow b]$ ). *For a boolean expression  $b$  and expressions  $e_1, e_2$ , we define the expression “if-then-else”, written  $ite(b, e_1, e_2)$ , evaluating to  $e_1$  when  $b$  and to  $e_2$  when  $\neg b$ .*

*For a function  $f$  (i.e. an environment) or an array, we define  $f[a \leftarrow b]$  as  $f[a \leftarrow b](x) = ite(x = a, b, f(x))$*

**Example 3** (Satisfiability of Example 2). *The following model satisfies Example 2*

1.  $\mathcal{M}(For1) = \{(a, N, k) | k < N \wedge \forall i < k, a[i]\%2 = 0\}$
2.  $\mathcal{M}(For2) = \{(a, N, k) | k < N \wedge \forall i < k, a[i]\%2 = 1 \wedge \forall k \leq i < N, a[i]\%2 = 0\}$
3.  $\mathcal{M}(For3) = \{(a, N, k) | k < N \wedge \forall i < N, a[i]\%2 = 1\}$

Horn clauses constrain models in two ways: those with a positive predicate force the model to be a post-fixpoint of an induction relation; those without are assertions that force the model to not contain elements violating the assertion.

Horn clauses are the syntactic objects we use to write *Horn problems*. Theorem 2 formalizes the link between Horn problems and Horn clauses.

<sup>2</sup>Z3 is both a SMT solver and a tool for solving Horn clauses. In SMT, a “Sat” answer often means a counterexample trace invalidating a safety property. In contrast, in Horn solving, “Sat” means a safety property is proved.

**Definition 4** (Horn Problem  $H$ , defines  $f_H, \mathcal{U}_H$ ). A Horn problem  $H$  is a pair  $(f_H, \mathcal{U}_H)$  where (i)  $f_H$  is a monotone function over models with order  $\mathcal{M}_1 \leq \mathcal{M}_2 \equiv \forall P, \mathcal{M}_1(P) \subseteq \mathcal{M}_2(P)$ . (ii)  $\mathcal{U}_H$  is a model. It is said to be satisfiable if and only if  $\text{lfp } f_H \leq \mathcal{U}_H$  (where  $\text{lfp}$  is the least fixpoint operator).

**Theorem 1** (Horn problems as a condition on models, defines  $H(\mathcal{M})$ ). A Horn problem  $H$  is satisfiable if and only if  $\exists \mathcal{M}, f_H(\mathcal{M}) \leq \mathcal{M} \wedge \mathcal{M} \leq \mathcal{U}_H$ , also written  $\exists \mathcal{M}, H(\mathcal{M})$  with  $H(\mathcal{M}) =_{\text{def}} f_H(\mathcal{M}) \leq \mathcal{M} \wedge \mathcal{M} \leq \mathcal{U}_H$ .

**Theorem 2** (Horn clauses as Horn problems, defines  $H_{\mathfrak{C}}$ ). Let  $\mathfrak{C}$  be a set of Horn clauses. There exists a Horn problem  $H_{\mathfrak{C}}$ , such that for any model  $\mathcal{M}$ ,  $H_{\mathfrak{C}}(\mathcal{M}) = \forall C \in \mathfrak{C}, \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}}$ . Thus,  $\text{satisfiable}(\mathfrak{C}) \equiv \text{satisfiable}(H_{\mathfrak{C}})$ .

## 2.3 Horn problem induced by an abstraction

Static analysis by abstract interpretation amounts to searching for invariants (i.e., models of Horn clauses in our setting) within a subset of all possible invariants called an *abstract domain*; elements of that subset are said to be *expressible by the abstraction*. We formalize abstraction as a Galois connection [CC77], that is, a pair  $(\alpha, \gamma)$  where  $\alpha$  denotes abstraction (i.e. simplification) and  $\gamma$  denotes the semantics (i.e. what the abstraction corresponds to) of abstract elements.

**Definition 5** (Models expressible by the abstraction  $\mathcal{G}$ ). We say that a model  $\mathcal{M}$  is expressible by an abstraction  $\mathcal{G}$  if and only if  $\mathcal{M} = \gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}}(\mathcal{M})$  or equivalently  $\exists \mathcal{M}^{\#}, \mathcal{M} = \gamma_{\mathcal{G}}(\mathcal{M}^{\#})$ .

**Example 4** (Models expressible by an abstraction). Consider the model  $\mathcal{M}$  from Example 3. This model is expressible by the abstraction  $\mathcal{G}$  such that  $\forall P \in \{\text{For1}, \text{For2}, \text{For3}\}$ :

1.  $\alpha_{\mathcal{G}}(\mathcal{M})(P) = \{(i, a[i].N, k) \mid (a, N, k) \in \mathcal{M}(P)\}$
  2.  $\gamma_{\mathcal{G}}(\mathcal{M}^{\#})(P) = \{(a, N, k) \mid \forall i, (i, a[i], N, k) \in \mathcal{M}^{\#}(P)\}$
- but not by the abstraction  $\mathcal{G}'$  such that  $\forall P \in \{\text{For1}, \text{For2}, \text{For3}\}$ :

1.  $\alpha_{\mathcal{G}'}(\mathcal{M})(P) = \{(a[i], N, k) \mid (a, N, k) \in \mathcal{M}(P)\}$
2.  $\gamma_{\mathcal{G}'}(\mathcal{M}^{\#})(P) = \{(a, N, k) \mid \forall i, (a[i], N, k) \in \mathcal{M}^{\#}(P)\}$

The idea is that the abstraction  $\mathcal{G}$  keeps the relationships between indices and values  $(i, a[i])$ , which is all that is needed for our invariants, whereas  $\mathcal{G}'$  forgets the indices and only keeps information about the values, which is insufficient. Section 5 details what each abstraction expresses on arrays.

**Definition 6** (Abstraction of a Horn problem  $\text{abs}(\mathcal{G}, H)$ ). The abstraction of Horn problem  $H$  by a Galois connection  $\mathcal{G}$  noted  $\text{abs}(\mathcal{G}, H)$ , is defined by (i)  $f_{\text{abs}(\mathcal{G}, H)} = \alpha_{\mathcal{G}} \circ f_H \circ \gamma_{\mathcal{G}}$  (ii)  $\mathcal{U}_{\text{abs}(\mathcal{G}, H)} = \alpha_{\mathcal{G}}(\mathcal{U}_H)$ .

**Theorem 3** (Definition  $\text{abs}(\mathcal{G}, H)$  is correct). For all  $\mathcal{M}^{\#}$ , the following statements are equivalent (with the notation  $H(\mathcal{M})$ , where  $H$  is a Horn problem and  $\mathcal{M}$  a possible model, from Theorem 1): (i)  $\text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#})$  (ii)  $H(\gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$  (iii)  $\text{abs}(\mathcal{G}, H)(\alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$ .

**Remark 1.** From this theorem, it follows that:

1.  $\text{abs}(\mathcal{G}, H)$  corresponds to the desired abstraction as:  $H$  is satisfiable by a model expressible by the abstraction  $(\gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$  iff  $\text{abs}(\mathcal{G}, H)$  is satisfiable.
2.  $\text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#})$  is constructible from  $H$  and  $\gamma_{\mathcal{G}}$ . This will be used in Th. 5.

## 2.4 Horn clauses transformations

A transformation is *sound* if it never transforms unsatisfiable Horn clauses (incorrect programs) into satisfiable ones (correct programs), *complete* if it never transforms satisfiable Horn clauses into unsatisfiable ones. A transformation is *complete relative to an abstraction* if it never transforms Horn clauses satisfiable in the abstract domain into unsatisfiable ones. **Together, soundness and relative completeness state that the transformation implements exactly the abstraction.**

**Definition 7** (Soundness, Completeness, Relative completeness). A transformation  $\text{alg}$  from Horn clauses to Horn clauses is said to be:

- sound if and only if  $\forall \mathfrak{C}, H_{\text{alg}(\mathfrak{C})} \text{ satisfiable} \Rightarrow H_{\mathfrak{C}} \text{ satisfiable}$ .
- complete if and only if  $\forall \mathfrak{C}, H_{\mathfrak{C}} \text{ satisfiable} \Rightarrow H_{\text{alg}(\mathfrak{C})} \text{ satisfiable}$ .



- complete relative to  $\mathcal{G}$  iff  $\forall \mathcal{C}, \text{abs}(\mathcal{G}, H_{\mathcal{C}}) \text{ satisfiable} \Rightarrow H_{\text{alg}(\mathcal{C})} \text{ satisfiable}$ .

**Theorem 4** (Soundness with relative completeness is *abs*). *If a transformation  $\text{alg}$  is sound and complete relative to  $\mathcal{G}$ , then  $\forall \mathcal{C}, H_{\text{alg}(\mathcal{C})} \text{ satisfiable} \equiv \text{abs}(\mathcal{G}, H_{\mathcal{C}}) \text{ satisfiable}$ .*

Relative completeness is rarely ensured in abstract interpretation; examples include some forms of policy iteration, which compute the least inductive invariant in the abstract domain. Widening operators, very widely used, break relative completeness. Previous works on arrays do not analyze relative completeness.

In this paper, we present a framework to define abstractions on data such that the relative completeness of transformations is analyzed, and proved when possible. To do so, our abstraction scheme is divided into two algorithms: (i) one that computes  $\text{abs}(\mathcal{G}, H_{\mathcal{C}})$  and thus is sound and complete relative to  $\mathcal{G}$  but uses extended Horn clauses (*i.e.* Horn clauses with additional quantifiers); (ii) another which transforms these extended Horn clauses back into Horn clauses and ensures soundness and strives to ensure completeness—and is shown to ensure it in the setting of our tool. When the second algorithm ensures completeness, the framework provides an abstraction algorithm from Horn clauses to Horn clauses which is both sound and complete relative to the abstraction.

### 3 Data Abstraction: Abstracting Horn Clauses

#### 3.1 Implementing Horn Clauses Abstraction

The abstraction on the syntax of Horn clauses is done by choosing a predicate to abstract. This approach can then be successively used on several predicates.

In this paper, we consider a subset of abstractions we call *data abstractions*. The semantics of a predicate is a set of unknown values and an abstraction is simply a relation in the form of a Galois connection between that set of unknown values to a “simpler” set of unknown values. The key particularity of data abstractions is that the abstraction of this set of unknown values is defined by the abstraction of its individual elements, the “data”. This allows us to take advantage of the syntax of Horn clauses because the “data” is simply the expressions passed as parameters to a predicate. Furthermore, as our goal is to syntactically modify the Horn clauses, we require that the abstraction can be encoded by an explicit formula that will be used syntactically during the transformation.

**Definition 8** (Data abstraction  $\sigma$ , defines  $F_{\sigma}, \alpha_{\sigma}, \gamma_{\sigma}, \mathcal{G}_{\sigma}^P$ ). *Let  $\mathcal{C}$  and  $\mathcal{A}$  be sets. A data abstraction  $\sigma$  is a function from  $\mathcal{C}$  to  $\mathcal{P}(\mathcal{A})$  and we write  $F_{\sigma}$  its formula encoding its inclusion relation :  $F_{\sigma}(a^{\#}, a) \equiv a^{\#} \in \sigma(a)^3$ .*

*It defines a Galois connection from  $\mathcal{P}(\mathcal{C})$  to  $\mathcal{P}(\mathcal{A})$  as follows: for  $S \subseteq \mathcal{C}$ ,  $S^{\#} \subseteq \mathcal{A}$ ,  $\alpha_{\sigma}(S) = \bigcup_{a \in S} \sigma(a)$  and  $\gamma_{\sigma}(S^{\#}) = \{a \in \mathcal{C} \mid \sigma(a) \subseteq S^{\#}\}$ .*

*This Galois connection can be applied to a predicate  $P$ , thus yielding the Galois connection  $\mathcal{G}_{\sigma}^P$  defined by  $\alpha_{\mathcal{G}_{\sigma}^P}(\mathcal{M})(P') = \text{ite}(P' = P, \alpha_{\sigma}(\mathcal{M}(P)), \mathcal{M}(P'))$  and  $\gamma_{\mathcal{G}_{\sigma}^P}(\mathcal{M})(P') = \text{ite}(P' = P, \gamma_{\sigma}(\mathcal{M}(P)), \mathcal{M}(P'))$ .*

**Example 5** ( $\text{Cell}_1$  abstraction of an array).  $\text{Cell}_1$  abstracts an array by the set of its cells (*i.e.* pairs of index and value).

$$\sigma_{\text{Cell}_1}(a) = \{(i, a[i])\}$$

$$F_{\sigma_{\text{Cell}_1}}((i, v), a) \equiv v = a[i]$$

**Remark 2.** *This data abstraction  $\sigma_{\text{Cell}_1}$  essentially abstracts a function  $a$  from an arbitrary index type  $I$  to an arbitrary value type by its graph  $\{(i, a(i)) \mid i \in I\}$ . As such, it does not lose information on individual arrays: two functions are identical if and only if they have the same graph (functional extensionality).*

*However, the associated  $\alpha_{\sigma_{\text{Cell}_1}}$  is not injective and loses information. This is essentially because when one takes the superposition of the graphs of two or more functions, there is no way to recover which part of the graph corresponds to which function. Consider for example  $a_0 : 0 \mapsto 0, 1 \mapsto 1$  and  $a_1 : 0 \mapsto 1, 1 \mapsto 0$ . Then,  $\alpha_{\sigma_{\text{Cell}_1}}(\{a_0, a_1\}) = \{0, 1\} \times \{0, 1\}$ ; and thus  $\alpha_{\sigma_{\text{Cell}_1}}(\{a_0, a_1\})$  contains not only  $a_0$  and  $a_1$ , but also the constant arrays 0 and 1.*

<sup>3</sup>Classically, we denote abstract elements ( $\in \mathcal{A}$ ) with sharps ( $\#$ ).

We now give the syntactic transformation on Horn clauses, so that the Horn problem induced by the transformed clauses corresponds to the abstraction of the desired predicate by the given data abstraction. We rely on Theorem 3, which states how the abstract Horn problem must be constructed and find its syntactical counterpart. Thus, if  $P$  is the predicate to be abstracted by  $\sigma$ ,  $\mathcal{M}(P)$  must be replaced by  $(\gamma_\sigma(\mathcal{M}(P^\#)))(\text{expr})$ , where  $\mathcal{M}(P^\#)$  is the abstracted set and  $P^\#$  the “abstract predicate”. Syntactically, this amounts to replacing any instance of  $P(\text{expr})$  by  $\forall a^\#, F_\sigma(a^\#, \text{expr}) \rightarrow P^\#(a^\#)$ .

**Algorithm 1** ( $\text{dataabs}(\mathfrak{C}, P, P^\#, F_\sigma)$ ).

**Input** :  $\mathfrak{C}$ : Horn clauses;  $P$ : predicate to abstract;  $P^\#$ : unused predicate;  $F_\sigma$ .

**Computation** : for each clause  $C \in \mathfrak{C}$ , for each  $P(\text{expr})$  in  $C$ , replace  $P(\text{expr})$  by  $\forall a^\#, F_\sigma(a^\#, \text{expr}) \rightarrow P^\#(a^\#)$ , where  $a^\#$  is a new unused variable.

**Example 6** (Using Algorithm 1 to abstract array  $a$  of Example 2 with  $\text{Cell}_1$ ). Let us define the data abstraction  $F_{\sigma_{\text{Cell}_1} \cdot \sigma_{id}^2}$  (discussed in Section 3.2) by :

$F_{\sigma_{\text{Cell}_1} \cdot \sigma_{id}^2}((i, v, N^\#, k^\#), (a, N, k)) \equiv v = a[i] \wedge N^\# = N \wedge k^\# = k$ . And let us execute **dataabs**(Clauses of Example 2, **For2**,  $P^\#$ ).

The result for Clause 4: **For2**( $a, N, k$ )  $\wedge k < N \rightarrow \text{For2}(a[k \leftarrow a[k] + 1], N, k + 1)$  is

$$\begin{aligned} (\forall(i^\#, v^\#, N^\#, k^\#), v^\# = a[i^\#] \wedge N^\# = N \wedge k^\# = k \rightarrow \text{For2}^\#(i^\#, v^\#, N^\#, k^\#)) \wedge k < N \\ \rightarrow (\forall(i'^\#, v'^\#, N'^\#, k'^\#), v'^\# = a[k \leftarrow a[k] + 1][i'^\#] \wedge N'^\# = N \wedge k'^\# = k + 1 \\ \rightarrow \text{For2}^\#(i'^\#, v'^\#, N'^\#, k'^\#)) \end{aligned} \quad (8)$$

where  $a^\#$  from Algorithm 1 is named  $(i^\#, v^\#, N^\#, k^\#)$  in the **first replacement** and  $(i'^\#, v'^\#, N'^\#, k'^\#)$  in the **second**.

**Theorem 5** (Algorithm 1 is correct). If  $P^\#$  unused in  $\mathfrak{C}$ ,

$\forall \mathcal{M}^\#, H_{\text{dataabs}(\mathfrak{C}, P, P^\#, F_\sigma)}(\mathcal{M}^\#[P^\# \leftarrow P]) = \text{abs}(\mathcal{G}_\sigma^P, H_\mathfrak{C})(\mathcal{M}^\#)$ . Thus, the *dataabs* algorithm is complete relative to  $\mathcal{G}_\sigma^P$ .

When given a set of Horn clauses, one can abstract several predicates (*i.e.* several program points), perhaps all of them, by applying the abstraction algorithm to them, not necessarily with the same abstraction.

## 3.2 Combining data abstractions

In Example 6, we had to manually adapt the abstraction  $\text{Cell}_1$  to the predicate **For2** which contained three variables. We define combinators for abstractions such that those adapted abstractions can be easily defined, and later, analyzed.

**Definition 9** ( $\sigma_{id}, \sigma_\perp, \sigma_1 \cdot \sigma_2, \sigma_1 \circ \sigma_2$ ). These abstractions and combinators are defined by

1.  $\sigma_{id}(x) = \{x\}$ ;  $F_{\sigma_{id}}(x^\#, x) \equiv x^\# = x$ .
2.  $\sigma_\perp(x) = \{\perp\}$ ;  $F_{\sigma_\perp}(x^\#, x) \equiv x^\# = \perp$ .
3.  $\sigma_1 \cdot \sigma_2(x_1, x_2) = \sigma_1(x_1) \times \sigma_2(x_2)$ ;  $F_{\sigma_1 \cdot \sigma_2}((x_1^\#, x_2^\#), (x_1, x_2)) \equiv F_{\sigma_1}(x_1^\#, x_1) \wedge F_{\sigma_2}(x_2^\#, x_2)$ .
4.  $\sigma_1 \circ \sigma_2(x) = \bigcup_{x_2^\# \in \sigma_2(x_2)} \sigma_1(x_2^\#)$ ;  $F_{\sigma_1 \circ \sigma_2}(x^\#, x) \equiv \exists x_2^\# : F_{\sigma_1}(x^\#, x_2^\#) \wedge F_{\sigma_2}(x_2^\#, x)$ .

where  $\sigma_{id}$  is the “no abstraction” abstraction,  $\sigma_\perp$  abstracts into the unit type (singleton  $\perp$ ) and is used with the  $\cdot$  combinator to project a variable out,  $\sigma_1 \cdot \sigma_2$  abstracts pairs by the cartesian product of their abstractions, and  $\sigma_1 \circ \sigma_2$  emulates applying  $\sigma_1$  after  $\sigma_2$ .

We have given in this section a general scheme for abstracting Horn clauses using *data abstraction* and shown its correctness. This scheme transforms Horn clauses into extended Horn clauses: new quantifiers ( $\forall a^\#$ ) are introduced which makes current solvers [dMB08, HR18] struggle. We shall now see how to get rid of these quantifiers while retaining relative completeness.

## 4 Data Abstraction: Quantifier Removal

### 4.1 A Quantifier Elimination Technique Parametrized by *insts*

Contrarily to other approaches that use general-purpose heuristics [BMR13], we design our quantifier elimination from the abstraction itself, which allows us to analyze the completeness property of the quantifier elimination algorithm.

The quantifiers introduced by the abstraction scheme are created either by :

1. The  $\forall a^\#$  of Algorithm 1, which is handled in this paper.
2. Quantifiers within  $F_\sigma$  (i.e. when abstraction composition is used). In this paper, we only handle existential quantifiers in prenex position of  $F_\sigma$  which is sufficient for the abstractions of this paper<sup>4</sup>.

Quantifiers are generated for each instance of the abstracted predicate, and to remove the quantifiers, we separate these instances into two classes :

1. The case when the predicate instance is positive. This case is handled by replacing the quantified variables by free variables, possibly renaming them to avoid name clashes. This is correct as these quantifiers would be universal quantifiers when moved to prenex position and thus have same semantics as free variables when considering the satisfiability of the clauses.
2. The case when the predicate instance is negative. In this case, when moved to prenex position, the quantifiers would be existential and thus can not be easily simplified. We use a technique called *quantifier instantiation* [BMR13], which replaces a quantifier by that quantifier restricted to some finite set of expressions  $I$  called *instantiation set* (i.e.  $\forall a^\#, expr$  is replaced by  $\forall a^\# \in I, expr$ ), which, as  $I$  is finite, can be unrolled to remove that quantifier.

Therefore, our quantifier elimination algorithm takes a parameter *insts* which returns the instantiation set for each abstracted negative predicate instance; and eliminates quantifiers according to their types (negative or positive).

**Definition 10** (Instantiation set heuristic  $insts(F_\sigma, a, ctx)$ ). *insts* is said to be an instantiation set heuristic if and only if:

1. *insts* takes three parameters :  $F_\sigma$ , the abstraction ;  $a$ , the variable that was abstracted ;  $ctx$ , the context in which the quantifiers are removed.
2.  $insts(F_\sigma, a, ctx)$  returns an instantiation set for the pair of quantifiers  $a^\#$  (the quantified variable corresponding to the abstraction of  $a$ ) and  $q$  (the prenex existential quantifiers of  $F_\sigma$ ).

Thus its type is a set of pairs of expressions where the first expression is for  $a^\#$  and the second for the prenex existential quantifiers of  $F_\sigma$ .

To ease the writing of the algorithm, we assume that the input clauses to the quantifier elimination algorithm have been created using the abstraction scheme at most once for each predicate (one may use abstraction composition to emulate applying it twice) on Horn clauses that were initially normalized. Furthermore, as we will be manipulating existential quantifiers within  $F_\sigma$ , we will define  $F_\sigma[q]$  such that  $F_\sigma(a^\#, a) = \exists q, F_\sigma[q](a^\#, a)$ . In other words,  $F_\sigma[q]$  is  $F_\sigma$  where the prenex existential quantifiers have been replaced by the value  $q$ . We will use  $()$  as value for  $q$  when  $F_\sigma$  has no prenex existential quantifiers.

**Algorithm 2** (Quantifier elimination algorithm *eliminate*).

**Input:**

- $C$ , an (extended) clause of the form  $e_1 \wedge \dots \wedge e_n \rightarrow e'$
- *insts* an instantiation heuristic as in Definition 10

**Computation:**

1. //We transform quantifiers from the positive instance  $e'$  into free variables  
 $e'_{res} := \text{free\_var\_of\_positive\_quantifiers}(e')$
2. For  $i$  from 1 to  $n$ 
  - (a) //We look if  $e_i$  is the abstraction of a predicate, if it is not,  $e_{res_i} = e_i$   
Let  $(F_{\sigma_i}, a_i, P_i^\#)$  such that  $e_i = \forall a^\#, F_{\sigma_i}(a^\#, a_i) \rightarrow P_i^\#(a^\#)$   
If impossible,  $e_{res_i} = e_i$  and go to next loop iteration.
  - (b) //We compute the context for that instance  
Let  $ctx_i = e_{res_1} \wedge \dots \wedge e_{res_{i-1}} \wedge e_{i+1} \wedge \dots \wedge e_n \rightarrow e'_{res}$
  - (c) //We compute the instantiation set for that abstraction.  
Let  $I_i = insts(F_{\sigma_i}, a_i, ctx_i)$
  - (d) //We finally compute  $e_i$  after instantiation  
Let  $e_{res_i} = \bigwedge_{(a^\#, q) \in I_i} F_{\sigma_i}[q](a^\#, a_i) \rightarrow P_i^\#(a^\#)$
3. Return  $e_{res_1} \wedge \dots \wedge e_{res_n} \rightarrow e'_{res}$

<sup>4</sup>In practice this can be expanded by analyzing what the quantifiers within  $F_\sigma$  would give when moved to prenex position.

**Example 7** (Eliminating quantifiers of Clause 8 of Example 6). *Let us apply eliminate on:*

$$\begin{aligned} \forall i^\#, v^\#, N^\#, k^\#, v^\# = a[i^\#] \wedge N^\# = N \wedge k^\# = k \rightarrow \text{For2}^\#(i^\#, v^\#, N^\#, k^\#) \wedge k < N \\ \rightarrow \forall i'^\#, v'^\#, N'^\#, k'^\#, v'^\# = a[k \leftarrow a[k] + 1][i'^\#] \wedge N'^\# = N \wedge k'^\# = k + 1 \\ \rightarrow \text{For2}^\#(i'^\#, v'^\#, N'^\#, k'^\#) \end{aligned}$$

In this extended clause,  $n = 2$  can be decomposed into  $e_1$ ,  $e_2$  and  $e'$ .

The instantiation algorithm then follows the following steps:

1. Step 1, computes  $e'_{res}$  as given in Clause 9
2. We enter Step 2 with  $i = 1$  and it matches the pattern.
3. We compute the context and call *insts* (call of Equation 11). Let us assume it returns  $\{(k, a[k], N, k), (i'^\#, a[i'^\#], N, k + 1)\}$  (which is the value returned by the instantiation set heuristic we construct later in this paper).
4. We get  $e_{res_1}$  as given in Clause 9
5. We enter Step 2 with  $i = 2$  and it does not match the pattern. Thus,  $e_{res_2} = e_2$

**The final clause is thus**

$$\begin{aligned} (a[k] = a[k] \wedge N = N \wedge k = k \rightarrow \text{For2}^\#(k, a[k], N, k) \wedge \\ a[i'^\#] = a[i'^\#] \wedge N = N \wedge k = k \rightarrow \text{For2}^\#(i'^\#, a[i'^\#], N, k)) \wedge k < N \\ \rightarrow v'^\# = a[k \leftarrow a[k] + 1][i'^\#] \wedge N'^\# = N \wedge k'^\# = k + 1 \rightarrow \text{For2}^\#(i'^\#, v'^\#, N'^\#, k'^\#) \end{aligned} \quad (9)$$

where  $v'^\#, i'^\#, N'^\#, k'^\#$  are new free variables of the clause.

**Simplifying this clause for readability yields:**

$$\begin{aligned} \text{For2}^\#(k, a[k], N, k) \wedge \text{For2}^\#(i'^\#, a[i'^\#], N, k) \wedge k < N \\ \rightarrow \text{For2}^\#(i'^\#, a[k \leftarrow a[k] + 1][i'^\#], N, k + 1) \end{aligned} \quad (10)$$

**The call to *insts*, which will be studied in Examples 8 and 10, was:**

$$\begin{aligned} \text{insts}(F_{\sigma_{Cell_1} \cdot \sigma_{id}^2}, (a, (N, k)), e_2 \rightarrow e'_{res}) \\ = \text{insts}(F_{\sigma_{Cell_1} \cdot \sigma_{id}^2}, (a, (N, k)), k < N \rightarrow v'^\# = a[k \leftarrow a[k] + 1][i'^\#] \\ \wedge N'^\# = N \wedge k'^\# = k + 1 \rightarrow \text{For2}^\#((i'^\#, v'^\#), (N'^\#, k'^\#))) \end{aligned} \quad (11)$$

**Theorem 6** (eliminate sound).  $\forall C, \text{insts}, \mathcal{M}, \llbracket \text{eliminate}(C, \text{insts}) \rrbracket_{\mathcal{M}} \Rightarrow \llbracket C \rrbracket_{\mathcal{M}}$

## 4.2 Constructing a good heuristic *insts*

To ensure relative completeness, and thus the predictability, of our overall abstraction (multiple calls to *dataabs* with different predicates followed by a call to *eliminate*), we need *eliminate* to be complete. The completeness of *eliminate* is highly tied to each call to *insts*, and we therefore define *completeness of a call to insts* such that whenever all calls are complete, *eliminate* is complete.

**Definition 11** (Completeness of a call to *insts*). *We say that a call  $\text{insts}(F_\sigma, a, ctx)$  is complete if and only if, for any  $\mathcal{M}$ , and any set  $E$  of elements of the types of  $a$ , 12 implies 13.*

$$\forall \text{vars}, (\forall (a^\#, q), F_\sigma[q](a^\#, a(\text{vars})) \Rightarrow a^\# \in \alpha_\sigma(E)) \Rightarrow \llbracket ctx(\text{vars}) \rrbracket_{\mathcal{M}} \quad (12)$$

$$\forall \text{vars}, (\forall ((a^\#, q)) \in \text{insts}(F_\sigma, a, ctx)(\text{vars}),$$

$$F_\sigma[q](a^\#, a(\text{vars})) \Rightarrow a^\# \in \alpha_\sigma(E)) \Rightarrow \llbracket ctx(\text{vars}) \rrbracket_{\mathcal{M}} \quad (13)$$

**Remark 3.** We always have 13 implies 12; soundness is based on this.

**Remark 4.** 12 should be understood as the clause before  $(a^\#, q)$  is instantiated:  $\alpha_\sigma(E)$  represents  $\alpha(\mathcal{M})(P)$ . Therefore, 12 is similar to  $e_i \rightarrow ctx$  (of algorithm *eliminate*) which is the curried current state of the clause in the loop. 13 should be understood as  $e_{res_i} \rightarrow ctx$

**Theorem 7** (Completeness of *insts* implies that of *eliminate*). *For any  $C, \text{insts}, \mathcal{M}$ , if during execution of  $\text{eliminate}(C, \text{insts})$  all calls to *insts* are complete, then  $\llbracket C \rrbracket_{\alpha_{\mathcal{G}}(\mathcal{M})} = \llbracket \text{eliminate}(C, \text{insts}) \rrbracket_{\alpha_{\mathcal{G}}(\mathcal{M})}$  where  $\mathcal{G}$  is such that  $\forall i, \gamma_{\mathcal{G}}(\mathcal{M}(P_i^\#)) = \gamma_{\sigma_i}(P_i^\#)$ , with  $i, P_i^\#, \sigma_i$  as defined in *eliminate*.*

**Remark 5.** We only consider abstract models, that is,  $\alpha_{\mathcal{G}}(\mathcal{M})$  where  $\mathcal{G}$  represents the galois connection after multiple calls to `dataabs`. The result is then a consequence of Remark 4.

Although our previous completeness definition of *insts* correctly captures the necessary properties for our instantiation algorithm to keep equisatisfiability, it is too weak to reason on when using combinators (see Section 3.2). The desired property of the instantiation heuristic is what we call *strong completeness*.

**Strong Completeness** The definition of *completeness* only applies in the context of boolean types, as required by the Algorithm *eliminate*. However, when handling the impact of the instantiation of a quantifier, one wishes to handle that impact with respect to an arbitrarily typed expression. For example, in the case of combinator  $\sigma_1 \cdot \sigma_2$ , the instantiation of the quantifiers generated by the abstraction  $\sigma_1$  must be aware of its impact on the variables to be abstracted by  $\sigma_2$ . This leads to a definition of *strong completeness* that allows any expression type as context parameter of *insts*, and replaces the satisfiability requirement of the context by an equality requirement.

**Definition 12** (Strong completeness of  $\text{insts}(F_{\sigma}, a, \text{ctx})$ ). *insts*( $F_{\sigma}, a, \text{ctx}$ ) is said strongly complete if and only if, for any  $E, \text{vars}, \mathcal{M}$ ,

$$\begin{aligned} \forall ((a^{\#}, q)) \in \text{insts}(F_{\sigma}, a, \text{ctx})(\text{vars}), F_{\sigma}[q](a^{\#}, a(\text{vars})) \Rightarrow a^{\#} \in \alpha_{\sigma}(E) \\ \Rightarrow \exists \text{vars}', (\forall (a^{\#}, q), F_{\sigma}[q](a^{\#}, a(\text{vars}')) \Rightarrow a^{\#} \in \alpha_{\sigma}(E)) \\ \wedge \llbracket \text{ctx}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{ctx}(\text{vars}') \rrbracket_{\mathcal{M}} \end{aligned}$$

**Remark 6.** This definition is constructed by contraposing that of completeness.

**Theorem 8** (Strong completeness implies completeness). If *ctx* is of boolean type,  $\text{insts}(F_{\sigma}, a, \text{ctx})$  strongly complete  $\Rightarrow$   $\text{insts}(F_{\sigma}, a, \text{ctx})$  complete

We give now some results that enable to modularly design instantiation heuristics while remaining (strongly) complete.

**Algorithm 3** (*insts* for finite abstractions). When  $\sigma(a)$  finite and  $F_{\sigma}$  has no existential quantifiers  $\text{insts}(F_{\sigma}, a, \text{ctx}) = \{(a^{\#}, ()), a^{\#} \in \sigma(a)\}$

Thus  $\text{insts}(F_{\sigma_{\text{id}}}, a, \text{ctx}) = \{(a, ())\}$  and  $\text{insts}(F_{\sigma_{\perp}}, a, \text{ctx}) = \{(\perp, ())\}$

**Algorithm 4** (*insts* for combinators). We will use @ for tuple concatenation.

```

insts( $F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx}$ ) =
  let  $I_1 = \text{insts}(F_{\sigma_1}, a_1, (\text{ctx}, a_2))$  in // We want  $I_2$  to keep the values of  $I_1$  unchanged
  let  $I_2 = \text{insts}(F_{\sigma_2}, a_2, (\text{ctx}, a_1, I_1))$  in // We return  $I_1 \times I_2$  with the right ordering
  // and the abstracted value at the top of the list.
   $\{((a_1^{\#}, a_2^{\#}), q_1 @ q_2) \mid (a_1^{\#}, q_1) \in I_1 \wedge (a_2^{\#}, q_2) \in I_2\}$ 

insts( $F_{\sigma_1 \circ \sigma_2}, a, \text{ctx}$ ) =
  // We first instantiate  $\sigma_2$ 
  let  $I_2 = \text{insts}(F_{\sigma_2}, a, \text{ctx})$  in  $I_{\text{tmp}} := I_2$ ;  $I_f := \emptyset$ 
  // For each instantiation of  $\sigma_2$  we instantiate with  $\sigma_1$ 
  while  $I_{\text{tmp}} \neq \emptyset$ 
    // All orders for picking  $(q_0, q_2)$  are valid
    let  $(q_0, q_2) \in I_{\text{tmp}}$  in  $I_{\text{tmp}} := I_{\text{tmp}} - \{(q_0, q_2)\}$ 
    // We keep the other instantiation sets unchanged
    // We also keep " $q_0$  is an abstraction of  $a$ " and the global context unchanged
    let  $I_{(q_0, q_2)} = \text{insts}(F_{\sigma_1}, q_0, (I_2 - \{(q_0, q_2)\}, I_f, F_{\sigma_2}[q_2](q_0, a, \text{ctx})))$  in
    // We combine  $I_{(q_0, q_2)}$  with  $(q_0, q_2)$ 
     $I_f := I_f \cup \{(a^{\#}, (q_0 @ q_1 @ q_2)) \mid (a^{\#}, q_1) \in I_{(q_0, q_2)}\}$ 
  return  $I_f$ 

```

//Note :  $(a^\#, (q_0 @ q_1 @ q_2)) \in I_f \equiv (q_0, q_2) \in I_2 \wedge (a^\#, q_1) \in I_{(q_0, q_2)}$   
 //Note :  $I_{(q_0, q_2)}$  depends on  $I_f$  and thus on the picked order

**Theorem 9** (Strong Completeness of *insts* of Algorithms 3 and 4). *If  $\sigma$  is finite,  $\text{insts}(F_\sigma, a, \text{ctx})$  is strongly complete. If its recursive calls are strongly complete,  $\text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})$  is strongly complete. If  $\sigma_1, \sigma_2$  are compatible:  $\forall E \neq \emptyset, \alpha_{\sigma_2} \circ \gamma_{\sigma_2} \circ \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E) = \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$  and its recursive calls are strongly complete, then  $\text{insts}(F_{\sigma_1 \circ \sigma_2}, a, \text{ctx})$  is strongly complete.*

**Remark 7.** *The compatibility condition is true for our abstractions (Theorem 10).*

**Example 8** (Using combinator instantiation). *In Example 7, we assumed the result of Call 11:*

$$\begin{aligned} \text{insts}(F_{\sigma_{\text{Cell}_1} \cdot \sigma_{id}^2}, (a, (N, k)), k < N \rightarrow v^\# = a[k \leftarrow a[k] + 1][i^\#] \\ \wedge N^\# = N \wedge k^\# = k + 1 \rightarrow \text{For2}^\#((i^\#, v^\#), (N^\#, k^\#))) \end{aligned}$$

Let us now expand this call further using our combinator construction for *insts*.

1. We enter the call  $\text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})$  with  $\sigma_1 = \sigma_{\text{Cell}_1}, \sigma_2 = \sigma_{id}^2, a_1 = a, a_2 = (N, k)$  and  $\text{ctx} = k < N \rightarrow v^\# = a[k \leftarrow a[k] + 1][i^\#] \wedge N^\# = N \wedge k^\# = k + 1 \rightarrow \text{For2}^\#((i^\#, v^\#), (N^\#, k^\#))$
2. We compute  $I_1 = \text{insts}(F_{\sigma_1}, a_1, (\text{ctx}, a_2))$ . As we do not have yet an instantiation heuristic for  $\sigma_{\text{Cell}_1}$ , let us assume this call returns  $I_1 = \{(k, a[k]), (i^\#, a[i^\#])\}$ . This call is further expanded in Example 10.
3. We now compute  $I_2 = \text{insts}(F_{\sigma_2}, a_2, (\text{ctx}, a_1, I_1))$ . But  $\sigma_2 = \sigma_{id}^2$  thus yielding an embedded call to the combinator
  - (a) We enter the call  $\text{insts}(F_{\sigma_{id} \cdot \sigma_{id}}, (N, k), (\text{ctx}, a_1, I_1))$
  - (b) We call  $\text{insts}(F_{\sigma_{id}}, N, ((\text{ctx}, a_1, I_1), k))$ , yielding  $\{N\}$
  - (c) We call  $\text{insts}(F_{\sigma_{id}}, k, ((\text{ctx}, a_1, I_1), N, \{N\}))$ , yielding  $\{k\}$
  - (d) We return  $\{N, k\}$
4. We return the final result:  $\{((k, a[k]), (N, k)), ((i^\#, a[i^\#]), (N, k + 1))\}$

Note that if the call to the instantiation using  $\text{Cell}_1$  is strongly complete, then our final instantiation set is as well. The following call to the instantiation of  $\text{Cell}_1$  is studied in Example 10.

$$\begin{aligned} \text{insts}(F_{\sigma_1}, a, (\text{ctx}, a_2)) = (\text{insts}(F_{\sigma_{\text{Cell}_1}}, a, (k < N \rightarrow v^\# = a[k \leftarrow a[k] + 1][i^\#] \\ \wedge N^\# = N \wedge k^\# = k + 1 \rightarrow \text{For2}^\#((i^\#, v^\#), (N^\#, k^\#)), (N, k)))) \quad (14) \end{aligned}$$

## 5 Cell Abstraction: a complete Data Abstraction

To illustrate our *data abstraction* technique, we show how to handle the cell abstractions of Monniaux and Gonnord [MG16].

### 5.1 Cell Abstractions

Cell abstractions consist in viewing arrays (maps from an index type to a value type) by a finite number of their cells. However, instead of using cells at specific fixed indices, such as the first or the last, we use parametric cells (*i.e.* cells with a non fixed index).  $\text{Cell}_1$  of Example 5 corresponds to one parametric cell. In Definition 13, we extend  $\text{Cell}_1$  to  $\text{Cell}_n$ .

**Definition 13.** *Cell abstractions  $\text{Cell}_n$ .*

$$\begin{aligned} \sigma_{\text{Cell}_n}(a) = \{(i_1, a[i_1]), \dots, (i_n, a[i_n])\} \text{ and} \\ F_{\sigma_{\text{Cell}_n}}(((i_1, v_1), \dots, (i_n, v_n)), a) \equiv v_1 = a[i_1] \wedge \dots \wedge v_n = a[i_n]. \end{aligned}$$

Many interesting properties can be defined by cell abstractions (Tab. 1). Furthermore, our data abstraction framework allows formalizing other existing array abstractions by compositions of cell abstractions (Example 9).

**Example 9.** *Array abstractions from cell abstractions.*

Table 1: Properties specified by cell abstractions

| Concrete                    | Abs      | Abstract property                                |
|-----------------------------|----------|--|
| $a[0] = 0$                  | $Cell_1$ | $i_1 = 0 \Rightarrow v_1 = 0$                    |
| $a[n] = 0$                  | $Cell_1$ | $i_1 = n \Rightarrow v_1 = 0$                    |
| $a[0] = a[n]$               | $Cell_2$ | $(i_1 = 0 \wedge i_2 = n) \Rightarrow v_1 = v_2$ |
| $\forall i, a[i] = 0$       | $Cell_1$ | $v_1 = 0$  |
| $\forall i, a[i] = i^2$     | $Cell_1$ | $v_1 = i_1^2$                                    |
| $\forall i, a[n] \geq a[i]$ | $Cell_2$ | $i_2 = n \Rightarrow v_2 \geq v_1$               |

Array smashing:  $\sigma_{smash}(a) = \{a[i]\}$ . This abstraction keeps the set of values reached but loses all information linking indices and values. It can be constructed using  $Cell_1$  abstraction in the following way :  $\sigma_{smash} \equiv (\sigma_{\perp} \cdot \sigma_{id}) \circ \sigma_{Cell_1}$ <sup>5</sup>

Array slicing: [CCL11, GRS05, HP08] There are several variations, and for readability we present the one that corresponds to “smashing each slice” and picking the slices  $]-\infty, i[, [i, i], ]i, \infty[$ :  $\sigma_{slice}(a) = \{(a[j_1], a[i], a[j_3]), j_1 < i \wedge j_3 > i\}$ . It can be constructed using  $Cell_1$  abstraction in the following way :  $\sigma_{slice} \equiv (\sigma_{slice_1} \cdot \sigma_{slice_2} \cdot \sigma_{slice_3}) \circ \sigma_{Cell_3}$ <sup>6</sup> with  $\sigma_{sk}(j, v) = ite(j \in slice_k, v, \perp)$

**Theorem 10.** The abstractions of Example 9 have strongly complete instantiation heuristics when  $Cell_n$  has.

**Remark 8.** These abstractions are of the form  $\sigma \circ \sigma_{Cell_n}$ . Their strong completeness is proven because  $\sigma$  is finite and  $\sigma_{Cell_n}$  always verifies the compatibility condition of Theorem 9 when left-side composed.

## 5.2 Instantiating Cell Abstractions

The data abstraction framework requires an instantiation heuristic *insts* for  $Cell_n$ . To achieve the strong completeness property, we first compute all “relevant” indices of the abstracted array, that is, indices which when left unchanged ensure that *ctx* keeps its value.

**Algorithm 5** (*relevant(a, expr)*). We compute the set of relevant indices of the array *a* for *expr*. This set may contain  $\top$  which signifies that there are relevant indices that the algorithm does not handle (and thus the final algorithm does not ensure strong completeness).

In this algorithm *arrayStoreChain(b, I, V)* denotes an array expression equal to  $b[i_1 \leftarrow v_1][\dots][i_n \leftarrow v_n]$  with  $i_1, \dots, i_n \in I$  and  $v_1, \dots, v_n \in V$ . *n* may be 0.

```

relevant(a, expr) =
  //For a a variable avar, return the indices that are “read”
  let read avar expr = match expr with
    |arrayStoreChain(avar, I, V)[i] → {i} ∪ ⋃_{(j,v) ∈ (I,V)} read(avar, j) ∪ read(avar, v)
    |avar → {⊤}      |Cons(exprs) → ⋃_{expr ∈ exprs} read(avar, exprs)
                                                                    //with Cons an expression constructor or predicate
    |∀q, e|∃q, e → map (fun x → ite(q ∈ x, ⊤, x)) read(avar, e)
  //Reducing a to a variable avar
  match a with |_ → {⊤}
                                                                    |arrayStoreChain(avar, I, V) when is_var(avar) → I ∪ read(avar, expr)

```

**Remark 9.** For readability, the algorithm is kept short, but may be improved to return  $\top$  in fewer cases using techniques from [BMS06]

**Theorem 11** (*relevant(a, expr)* is correct). If  $\top \notin \text{relevant}(a, \text{expr})$  then

$$\forall \mathcal{M}, \text{vars}, a', (\forall i \in \text{relevant}(a, \text{expr}), a'[i] = a(\text{vars})[i]) \Rightarrow \exists \text{vars}', \llbracket \text{expr}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{expr}(\text{vars}') \rrbracket_{\mathcal{M}} \wedge a(\text{vars}') = a'$$

<sup>5</sup>This is a semantic equivalence, not a strict equality : formally  $(\sigma_{\perp} \cdot \sigma_{id}) \circ \sigma_{Cell_1}(a)$  returns  $\{(\perp, a[i])\}$  instead of  $\{a[i]\}$

<sup>6</sup>As for smashing, this is a semantic equivalence



We use our relevant indices to construct an instantiation heuristic for  $Cell_n$ .

**Algorithm 6** (Instantiation heuristic for  $Cell_n$ ).

```

insts( $F_{\sigma_{Cell_n}}, a, ctx$ ) =
  let  $R = \text{relevant}(a, ctx)$  in //Compute relevant set
  let  $Ind = \text{ite}(R = \emptyset, \perp, R - \{\top\})$  in //Make it non empty and remove  $\top$ 
  //_- can be chosen as any value of the index type
  let  $I = \{(i, a[i]) \mid i \in Ind\}$  in  $(I^n, ())$  // make it a pair index value, make n copies

```

**Theorem 12** (Strong Completeness for cell Abstraction). *Any call to  $\text{insts}(F_{\sigma_{Cell_n}}, a, ctx)$  is strongly complete whenever  $\top \notin \text{relevant}(a, ctx)$ .*

**Example 10** (Instantiation of  $Cell_1$ ). *In Example 8, we assumed the result of the Call 14:*

$$\begin{aligned}
&\text{insts}(F_{\sigma_1}, a, (ctx, a_2)) \\
&= \text{insts}(F_{\sigma_{Cell_1}}, a, (k < N \rightarrow v'^{\#} = a[k \leftarrow a[k] + 1][i'^{\#}] \\
&\quad \wedge N'^{\#} = N \wedge k'^{\#} = k + 1 \rightarrow \text{For2}^{\#}((i'^{\#}, v'^{\#}), (N'^{\#}, k'^{\#})), (N, k)))
\end{aligned}$$

Let us use our instantiation heuristic for  $Cell_1$  to compute the result of that call.

1. We first compute the relevant set, we obtain  $R = \{k, i'^{\#}\}$
2. It is already non empty and does not contain  $\top$ , so  $Ind = R = \{k, i'^{\#}\}$
3. We add the value part, yielding  $I = \{(k, a[k]), (i'^{\#}, a[i'^{\#}])\}$
4.  $n = 1$ , therefore the result is  $I^1 = I = \{(k, a[k]), (i'^{\#}, a[i'^{\#}])\}$

And the call is complete as the relevant set did not contain  $\top$ .

## 6 Implementation and Experiments

In Sections 3 and 4, we constructed the building blocks to verify programs using an abstraction technique that strives to ensure relative completeness and in Section 5, we gave a powerful abstraction for arrays. We now combine these sections to create a tool for the verification of programs with arrays. We benchmark this tool and compare it to other tools and then analyze the results.

### 6.1 The full algorithm

Our tool uses Algorithm 7 which has for only parameter  $n$ . The abstraction used consists in abstracting each array of each predicate by  $Cell_n$ .

**Algorithm 7** (Full  $n$ -Cell Abstraction Algorithm  $\text{trs}(\mathfrak{C}, n)$ ).

**Input:** A set of Horn clauses  $\mathfrak{C}$ ,  $n$  the number of cells

**Computation:**

1. *Abstraction* : For each predicate  $P$  of  $C$  over types  $t_1, \dots, t_k$ 
  - (a) Let  $\sigma^P = \prod_{1 \leq i \leq k} \text{ite}(\text{isArray}(t_k), \sigma_{Cell_n}, \sigma_{id})$
  - (b) Let  $P^{\#}$  be an unused predicate.
  - (c)  $\mathfrak{C} := \text{dataabs}(\mathfrak{C}, F_{\sigma}^P, P, P^{\#})$
2. *Quantifier elimination* : For each clause  $C \in \mathfrak{C}$ 

$$C := \text{eliminate}(C, \text{insts})$$
*//insts is the heuristic discussed in this article*
3. *Simplification (optional)*: For each clause  $C \in \mathfrak{C}$ 
  - (a)  $C := \text{simplify}(C, \text{insts})$  *//we simplify as in Clause 10*
  - (b)  $C := \text{Ackermannize}(C)$  */\*This step removes possible array writes by applying read over write axioms. Then if an array  $a$  is only used in read expressions, we eliminate it at quadratic cost [KS08, §3.3.1]. Note that this is not possible before abstraction because  $a$  is a parameter of predicates.\*/*



Table 2: Experimental results

|           | #prg | $n$ | Noabs |      |     |          | VapHor |    |   |          | Dataabs |      |      |          | Dataabs acker |       |      |           |
|-----------|------|-----|-------|------|-----|----------|--------|----|---|----------|---------|------|------|----------|---------------|-------|------|-----------|
|           |      |     | ✔     | ⦿    | ?   | $\geq 1$ | ✔      | ⦿  | ? | $\geq 1$ | ✔       | ⦿    | ?    | $\geq 1$ | ✔             | ⦿     | ?    | $\geq 1$  |
| Buggy     | 4    | 1   | 4     | 0    | 0   | 4        | 4      | 0  | 0 | 4        | 4       | 0    | 0    | 4        | 4             | 0     | 0    | 4         |
| Buggy     | 4    | 2   | –     | –    | –   | –        | 4      | 0  | 0 | 4        | 0       | 4    | 0    | 0        | 3             | 1     | 0    | 3         |
| NotHinted | 12   | 1   | 0     | 11.5 | 0.5 | 0        | 1      | 11 | 0 | 1        | 0       | 12   | 0    | 12       | 0             | 11.83 | 0.17 | 0         |
| NotHinted | 12   | 2   | –     | –    | –   | –        | 0      | 12 | 0 | 0        | 4       | 12   | 0    | 12       | 0             | 12    | 0    | 0         |
| Hinted    | 12   | 1   | –     | –    | –   | –        | 4      | 8  | 0 | 7        | 8.99    | 2.84 | 0.17 | 11       | 8.83          | 3.17  | 0    | <b>12</b> |
| Hinted    | 12   | 2   | –     | –    | –   | –        | 0      | 12 | 0 | 0        | 0       | 12   | 0    | 0        | 5.83          | 6.17  | 0    | 6         |

*Columns:* corresponds to the abstraction tool. 1. Noabs corresponds to no abstraction 2. VapHor is the tool by Monniaux & Gonnord 3. Dataabs and Dataabs acker represent our implementation, with and without Ackermannisation.

*Lines:* files grouped by category and number of cells

*Values:*✔(respectively ⦿, ?) correspond to the number of files that were correct (respectively timeout, unknown), averaged over the 3 naming options and the 2 random seeds).  $\geq 1$  represents the number of files for which at least one of the naming options and random seeds returned the correct result.

We implemented this algorithm, and used it on clauses generated by the VapHor converter from mini-Java programs to Horn Clauses. The implementation is publicly available <sup>7</sup>. Overall the toolchain ensures soundness and relative completeness due to the strong completeness of our building blocks. To ensure that within the computation of  $insts(F_{\sigma_{Cell_n}}, a, ctx)$ ,  $relevant(a, ctx)$  does not contain  $\top$ , we rely on the form of clauses generated by the VapHor converter, among which: 1. There are no array equalities. 2. There is at most one negative predicate per clause. Theorem 14 available in the appendix states the exact requirements on the form of the clauses to ensure relative completeness.

## 6.2 Experimental setting and results

We modified the converter to take into account optional additional invariant information given by the programmer, in the form of “hints”. These hints are additional assertion clauses so that the solver may converge more easily to the desired model. These additional clauses are also abstracted by our abstraction.

Our initial Horn clauses are generated by the converter from programs in three categories: 1. incorrect programs. 2. correct programs without hints. 3. correct programs with hints. We then compare our implementation of Algorithm 7 with no abstraction and the abstraction tool of VapHor on the modified benchmarks of [MG16]. Note that the latter tool implements a variant of  $Cell_n$  that always Ackermannizes in the process. We modified the benchmarks of [MG16] such that properties are checked using a loop instead of a random access, e.g., they take  $i$  random and assert  $t[i] = 0$  to verify  $\forall i \ t[i] = 0$ , thus enforcing the use of quantified invariants. This is why VapHor behaves much more poorly on our examples than in [MG16].

We use as backend the state of the art solver Z3 version 4.8.8 - 64 bit with timeout 40s on a laptop computer. Because of issue <https://github.com/Z3Prover/z3/issues/909> that we have witnessed, we launch each benchmark with 3 different naming conventions for predicates in addition to using 2 random seeds. The results are presented in Table 2. We did not show columns for incorrect results or errors as there are none.

## 6.3 Analysis

*Abstraction & Solving timings* Our abstraction is fast: most of it is search & replace; most of the time is spent in the hand-written simplification algorithm, which is not the purpose of this paper. The solving time in Z3 is much higher. It seems that, for correct examples, Z3 either converges quickly ( $< 5$ sec) or fails to converge regardless of timeout—only in 18 cases out of 1176 does it solve the problem between 5s and the timeout.

*Soundness and relative completeness* There are no incorrect results, confirming that all implementations are sound. There are cases where Z3 cannot conclude “correct” on its own but with enough help (*i.e.* hints and Ackermannization, different predicate names, and random seeds) all files are solved as shown by

<sup>7</sup>Link removed for double-blind review.

the hinted,  $Cell_1$  line, column  $\geq 1$  of Dataabs acker. This confirms that our implementation is relatively complete, as proved in theory.

*Tool comparison* Z3 without abstraction is unable to solve any correct example, even with hints. We mostly behave better than Vaphor for  $Cell_1$  on hinted examples, perhaps because we create smaller instantiation sets: Vaphor handles complex clauses greedily, using all indices read as instantiation set.

*Cell<sub>1</sub> versus Cell<sub>2</sub>* All our correct examples have invariants expressible by  $Cell_1$ , and thus also by  $Cell_2$ . However, the clauses generated using  $Cell_2$  are bigger and the instantiation set sizes are squared, thus complexifying the clauses and probably stopping Z3 from converging easily on an invariant. Vaphor, in contrast, generates fewer instantiations for  $Cell_2$  by using  $\sigma_{Cell_2}(a) = \{(i, a[i], j, a[j]), i < j\}$ , which explains its better performance on  $Cell_2$  buggy examples.

*Ackermannizing or not* Ackermannization completely removes arrays from the clauses, but changes neither the invariants nor the space in which invariants are sought. Z3 is supposed to handle the theory of arrays natively and should thus be more efficient than our eager Ackermannization; yet the latter improves results on non buggy examples.

*Overall results and Z3* Our tool transforms a Horn problem with arrays requiring quantified invariants which lie within the  $Cell_n$  abstraction into an equivalently satisfiable Horn problem which needs neither quantifiers nor arrays. The non-hinted examples show that this is insufficient to make automatic proofs of programs with arrays practical, mainly because Z3 struggles to handle these array free Horn problems. In addition, Z3 sometimes succeeds or not, or even returns unknown, depending on details in the input (e.g., predicate naming, random, Ackermannisation). Further work is needed on integer Horn solvers for better performance and reduced brittleness.

*Benchmarks and future work* The current benchmarks are generated from a toy Java language and have invariants expressible in  $Cell_1$ . Future work includes (i) adding new challenging examples which require  $Cell_2$  such as sortedness or even more complex invariants such as “the array content is preserved as a multiset” [MG16]; (ii) tackling challenging literature examples [Bey19] in real languages, perhaps using a front end such as SeaHorn [GKKN15].

## 7 Related Work

Numerous abstractions for arrays have been proposed in the literature, among which array slicing [CCL11, GRS05, HP08]. In Example 9 we showed how they are expressible in our framework. Similarly to Monniaux and Alberti [MA15] we think that disconnecting the array abstraction from other abstractions and from solving enables using back-end solvers better. Like Monniaux and Gonnord [MG16] we use Horn Clauses to encode our program under verification, but we go a step further by using Horn Clauses as an intermediate representation to chain abstractions. Furthermore, our formalization is cleaner for multiple arrays and proves relative completeness.

Our instantiation method is inspired from previous work on solving quantified formulae [BMR13, BMS06, GSV18]. [BMS06] does not consider Horn clauses, that is, expressions with unknown predicates, but only expressions with quantifiers. [BMR13] has an approach very similar to ours, but without casting it within the framework of *data abstractions*; they use trigger-based instantiation. Both instantiation methods of [BMR13, BMS06] lead to bigger instantiation sets than the one we suggest, yet, contrary to us, they do not prove completeness. Finally, the technique used in [GSV18] creates instantiation sets not as pre-processing, but during analysis. Although more general, it is highly likely that the technique suffers from the same unpredictability that Horn solvers have. In our case, we believe that we can tailor the instantiation set to the abstraction and analyze its precision.

Finally, other recent approaches focus on more powerful invariants through proofs by induction [ISIRS20]. However, as stated by their authors, their approach is complementary to ours: theirs is less specialized, and thus has trouble where our approach may easily succeed, but enables other invariants: our data abstraction framework may allow abstracting within their induction proofs.

## 8 Conclusion

We have proposed an approach for the definition, combination and solving of data abstractions for Horn Clauses. The framework also provides sufficient conditions for (relative) completeness, and prove the result for a large class of array abstractions. We propose an implementation and experimental evaluation on classical examples of the literature. Future work include extending the applicability of the framework for other datastructures such that trees.

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## A Appendix: proofs

### A.1 Horn Clauses and Galois connections

**Definition 14** (Galois connection  $\mathcal{G}$ , defines  $\alpha_{\mathcal{G}}, \gamma_{\mathcal{G}}$ ). *A Galois connection  $\mathcal{G}$  between two lattices is defined by*

- $\alpha_{\mathcal{G}} : \mathcal{C} \rightarrow \mathcal{A}$  gives the abstraction of a value.
- $\gamma_{\mathcal{G}} : \mathcal{A} \rightarrow \mathcal{C}$  gives the concrete value of an abstract element.

where: (i)  $\alpha_{\mathcal{G}}, \gamma_{\mathcal{G}}$  are monotone (ii)  $a \leq \alpha_{\mathcal{G}}(c) \equiv \gamma_{\mathcal{G}}(a) \leq c$

**Theorem 13** (Further properties of Galois connections). 3.  $S \leq \gamma_{\mathcal{G}}(\alpha_{\mathcal{G}}(S))$  for soundness.  
 4.  $\forall S^{\#}, \alpha_{\mathcal{G}}(\gamma_{\mathcal{G}}(S^{\#})) \leq S^{\#}$  for minimal precision loss.  
 5.  $\alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}} = \alpha_{\mathcal{G}}$  and  $\gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}} = \gamma_{\mathcal{G}}$  : abstracting an already abstracted element yields that element.

*Proof.* These proofs can be found in [RY20]. □

**Theorem 1** (Horn problems as a condition on models, defines  $H(\mathcal{M})$ ). *A Horn problem  $H$  is satisfiable if and only if  $\exists \mathcal{M}, f_H(\mathcal{M}) \leq \mathcal{M} \wedge \mathcal{M} \leq \mathcal{U}_H$*

*Proof.* Assume  $H(\mathcal{M})$ . Because  $f_H(\mathcal{M}) \leq \mathcal{M}$ ,  $\mathcal{M}$  is a post fixpoint and therefore  $\text{lfp } f_H \leq \mathcal{M}$ . Finally, we have  $\text{lfp } f_H \leq \mathcal{M} \leq \mathcal{U}_H$ .

Assume  $\text{lfp } f_H \leq \mathcal{U}_H$ . We have  $H(\text{lfp } f_H)$ . □

**Theorem 2** (Horn clauses are instances of Horn problems, defines  $H_{\mathfrak{C}}$ ). *Let  $\mathfrak{C}$  be a set of Horn clauses. There exists a Horn problem  $H_{\mathfrak{C}}$ , such that for any model  $\mathcal{M}$ ,  $H_{\mathfrak{C}}(\mathcal{M}) = \bigwedge_{C \in \mathfrak{C}} \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}}$ .*

*Proof.*  $\bigvee$  denotes the join (least upper bound) operator of the lattice of models,  $\bigwedge$  the meet operator (greatest lower bound). Assertion clauses are clauses with no positive predicates. For a set of Horn clauses  $\mathfrak{C}$  denote  $\text{assert}(\mathfrak{C})$  the set of assertion clauses of  $\mathfrak{C}$ .

Let  $f_{H_{\mathfrak{C}}}(\mathcal{M}) = \bigwedge \{ \mathcal{M}' \mid \forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=\mathcal{M}', \text{neg}=\mathcal{M}} \}$   
 where  $\llbracket X \rrbracket_{\text{pos}=\mathcal{M}', \text{neg}=\mathcal{M}}$  interprets the positive predicate of  $X$  by  $\mathcal{M}'$  and the negative predicates by  $\mathcal{M}$ .  
 Let  $\mathcal{U}_{H_{\mathfrak{C}}} = \bigvee \{ \mathcal{M} \mid \forall C \in \text{assert}(\mathfrak{C}), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}} \}$ .

1.  $f_{H_{\mathfrak{C}}}$  monotonic: consider  $\mathcal{M}_1 \leq \mathcal{M}_2$ .

$$\{ \mathcal{M}' \mid \forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=\mathcal{M}', \text{neg}=\mathcal{M}_2} \} \subseteq \{ \mathcal{M}' \mid \forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=\mathcal{M}', \text{neg}=\mathcal{M}_1} \}$$

Thus,  $f_{H_{\mathfrak{C}}}(\mathcal{M}_1) \leq f_{H_{\mathfrak{C}}}(\mathcal{M}_2)$ .

2.  $H_{\mathfrak{C}}(\mathcal{M}) = \forall C \in \mathfrak{C}, \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}}$ :

- (a) Assume  $H_{\mathfrak{C}}(\mathcal{M})$ .

We have  $\forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=f_{H_{\mathfrak{C}}}(\mathcal{M}), \text{neg}=\mathcal{M}}$ . Thus, because  $f_{H_{\mathfrak{C}}}(\mathcal{M}) \leq \mathcal{M}$ , we have

$$\forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=\mathcal{M}, \text{neg}=\mathcal{M}}$$

$= \forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}}$ . The assertion clauses are simply proven by  $\mathcal{M} \leq \mathcal{U}_{H_{\mathfrak{C}}}$

- (b) Assume  $\forall C \in \mathfrak{C}, \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\mathcal{M}}$ . First  $\mathcal{M} \leq \mathcal{U}_{H_{\mathfrak{C}}}$  by definition of  $\mathcal{U}_{H_{\mathfrak{C}}}$ . Secondly,  $\mathcal{M} \in \{ \mathcal{M}' \mid \forall C \in (\mathfrak{C} - \text{assert}(\mathfrak{C})), \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\text{pos}=\mathcal{M}', \text{neg}=\mathcal{M}} \}$ , thus  $f_{H_{\mathfrak{C}}}(\mathcal{M}) \leq \mathcal{M}$ .

□

**Theorem 3** (Definition  $\text{abs}(\mathcal{G}, H)$  is correct). *For all  $\mathcal{M}^{\#}$ , the following statements are equivalent (with the notation  $H(\mathcal{M})$ , where  $H$  is a Horn problem and  $\mathcal{M}$  a possible model, from Theorem 1):*

1.  $\text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#})$
2.  $H(\gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$
3.  $\text{abs}(\mathcal{G}, H)(\alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$

**Remark 10.** *From this theorem, it follows that:*

1. The definition of  $\text{abs}(\mathcal{G}, H)$  corresponds to the desired abstraction as :  $H$  satisfiable by a model expressible by the abstraction  $(\gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$  is equivalent to  $\text{abs}(\mathcal{G}, H)$  satisfiable.
2.  $\text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#})$  is constructible from  $H$  and  $\gamma_{\mathcal{G}}$ . This will be used in Theorem 5.

*Proof.* Introduce  $\mathcal{M}^{\#}$ . Proof that i is equivalent to ii

$$\begin{aligned}
 & \text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#}) \\
 & \equiv \alpha_{\mathcal{G}} \circ f_H \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \mathcal{M}^{\#} \wedge \mathcal{M}^{\#} \leq \alpha_{\mathcal{G}}(\mathcal{U}_H) \\
 & \text{We use the item ii of 14} \\
 & \equiv f_H \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \wedge \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \mathcal{U}_H \\
 & \equiv H(\gamma_{\mathcal{G}}(\mathcal{M}^{\#}))
 \end{aligned}$$

Proof that i is equivalent to iii

$$\begin{aligned}
 & \text{abs}(\mathcal{G}, H)(\mathcal{M}^{\#}) \\
 & \equiv \alpha_{\mathcal{G}} \circ f_H \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \mathcal{M}^{\#} \wedge \mathcal{M}^{\#} \leq \alpha_{\mathcal{G}}(\mathcal{U}_H)
 \end{aligned}$$

We use the item ii of 14

$$\equiv f_H \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \wedge \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \mathcal{U}_H$$

We use the item 5 of Theorem 13

$$\begin{aligned}
 & \equiv f_H \circ \gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \\
 & \qquad \qquad \qquad \wedge \gamma_{\mathcal{G}} \circ \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \mathcal{U}_H
 \end{aligned}$$

We use the item ii of 14

$$\begin{aligned}
 & \equiv \alpha_{\mathcal{G}} \circ f_H \circ \gamma_{\mathcal{G}}(\alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#})) \leq \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \wedge \\
 & \qquad \qquad \qquad \alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}) \leq \alpha_{\mathcal{G}}(\mathcal{U}_H)
 \end{aligned}$$

$$\equiv \text{abs}(\mathcal{G}, H)(\alpha_{\mathcal{G}} \circ \gamma_{\mathcal{G}}(\mathcal{M}^{\#}))$$

□

**Theorem 4** (Soundness with relative completeness is *abs*). *If a transformation alg is sound and complete relative to  $\mathcal{G}$ , then*

$$\forall \mathfrak{C}, H_{\text{alg}(\mathfrak{C})} \text{ satisfiable} \equiv \text{abs}(\mathcal{G}, H_{\mathfrak{C}}) \text{ satisfiable}$$

*In other words, when a transformation is sound and complete relative to an abstraction, it exactly does the abstraction.*

*Proof.*

$$H_{\mathfrak{C}} \text{ satisfiable} \Rightarrow \text{abs}(\mathcal{G}, H_{\mathfrak{C}}) \text{ satisfiable}$$

using Theorem 3, which combined with soundness yields

$$H_{\text{alg}(\mathfrak{C})} \text{ satisfiable} \Rightarrow H_{\mathfrak{C}} \text{ satisfiable}$$

which used with relative completeness gives the equivalence. □

**Theorem 5** (Algorithm 1 is correct). *If  $P^{\#}$  is not used in  $\mathfrak{C}$ , then for any  $\mathcal{M}^{\#}$ ,*

$$H_{\text{dataabs}(\mathfrak{C}, P, P^{\#}, F_{\sigma})}(\mathcal{M}^{\#}[P^{\#} \leftarrow P]) = \text{abs}(\mathcal{G}_{\sigma}^P, H_{\mathfrak{C}})(\mathcal{M}^{\#})$$

$$\begin{aligned}
& \text{Proof. } H_{\text{dataabs}(\mathfrak{C}, P, P^\#, F_\sigma)}(\mathcal{M}^\#[P^\# \leftarrow P]) \\
&=_1 \bigwedge_{C^\# \in \text{dataabs}(\mathfrak{C}, P, P^\#, F_\sigma)} \llbracket \forall \text{vars}, C^\#(\text{vars}) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} \\
&=_2 \bigwedge_{C \in \mathfrak{C}} \llbracket \forall \text{vars}, C(\text{vars}) \rrbracket_{\gamma_{\mathcal{G}_P}(\mathcal{M}^\#)} \\
&=_3 H_{\mathfrak{C}} \circ \gamma_{\mathcal{G}_P}(\mathcal{M}^\#) \\
&=_4 \text{abs}(\mathcal{G}_\sigma^P, H_{\mathfrak{C}})(\mathcal{M}^\#)
\end{aligned}$$

The first and third equalities correspond to unrolling the definition of  $H(\mathcal{M})$ . The fourth equality is proved by Theorem 3, now let us prove the second equality.

Let  $\text{replaced}(e) =_{\text{def}} e$  where each instance of  $P(\text{expr})$  has been replaced by  $\forall a^\#, F_\sigma(a^\#, \text{expr}) \rightarrow P^\#(a^\#)$ . Let us prove the second equality.

$$\begin{aligned}
& \bigwedge_{C^\# \in \text{dataabs}(\mathfrak{C}, P, P^\#, F_\sigma)} \llbracket \forall \text{vars}, C^\#(\text{vars}) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} \\
&= \bigwedge_{C \in \mathfrak{C}} \llbracket \forall \text{vars}, \text{replaced}(C)(\text{vars}) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} \text{ by the definition of } \text{replaced}.
\end{aligned}$$

We now prove equality 2 by proving that  $\forall C \in \mathfrak{C}, \forall \text{vars}$ ,  $\llbracket \text{replaced}(C)(\text{vars}) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} = \llbracket C(\text{vars}) \rrbracket_{\gamma_{\mathcal{G}_P}(\mathcal{M}^\#)}$ .

We show it by showing, by structural induction on the expression  $e$ , the property  $\text{Ind}(e)$ :  $\llbracket \text{replaced}(e) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} = \llbracket e \rrbracket_{\gamma_{\mathcal{G}_P}(\mathcal{M}^\#)}$ .

Assume  $e$  is built as  $\text{Cons}(\text{exprs})$  using the  $\text{Cons}$  term constructor at the root.

1. if  $\text{Cons}$  is not a predicate (a boolean operator, for instance) then by the induction hypothesis, the evaluation of  $\text{exprs}$  is unchanged, thus  $\text{Ind}(e)$
2. if  $\text{Cons}$  is a predicate  $P'$  different from  $P$ , then  $\gamma_{\mathcal{G}_P}$  does not affect  $P'$  and, by the induction hypothesis, the evaluation of  $\text{exprs}$  is unchanged, thus  $\text{Ind}(e)$
3. if  $\text{Cons}$  is  $P$ , then  $\llbracket \text{replaced}(e) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]}$ 

$$\begin{aligned}
&= \llbracket \forall a^\#, F_\sigma(a^\#, \text{exprs}) \rightarrow P^\#(a^\#) \rrbracket_{\mathcal{M}^\#[P^\# \leftarrow P]} \\
&= \forall a^\#, F_\sigma(a^\#, \text{exprs}) \rightarrow \mathcal{M}^\#[P^\# \leftarrow P](P^\#)(a^\#) \\
&= \forall a^\#, F_\sigma(a^\#, \text{exprs}) \rightarrow \mathcal{M}^\#(P)(a^\#) \\
&= \text{exprs} \in \{c \mid \sigma(c) \subseteq \mathcal{M}^\#(P)\} \\
&= \text{exprs} \in \gamma_\sigma(\mathcal{M}^\#(P)) \\
&= \text{exprs} \in \gamma_{\mathcal{G}_P}(\mathcal{M}^\#)(P) \\
&= \llbracket P(\text{exprs}) \rrbracket_{\gamma_{\mathcal{G}_P}(\mathcal{M}^\#)}
\end{aligned}$$

Thus,  $\text{Ind}(e)$  holds in all cases. □

**Theorem 6** (Soundness of *eliminate*).  $\forall C, \text{insts}, \mathcal{M}, \llbracket \text{eliminate}(C, \text{insts}) \rrbracket_{\mathcal{M}} \Rightarrow \llbracket C \rrbracket_{\mathcal{M}}$

*Proof.* Fix  $C, \text{insts}, \mathcal{M}$ . We have  $\forall i, \llbracket e_i \rrbracket_{\mathcal{M}} \Rightarrow \llbracket e_{\text{res}_i} \rrbracket_{\mathcal{M}}$  as the finite conjunction over  $I_i$  in  $e_i$  is contained in the infinite conjunction of  $e_i$ . Then  $\llbracket e_1 \wedge \dots \wedge e_n \rrbracket_{\mathcal{M}} \Rightarrow \llbracket e_{\text{res}_1} \wedge \dots \wedge e_{\text{res}_n} \rrbracket_{\mathcal{M}}$ . Finally, as  $\llbracket e' \rrbracket_{\mathcal{M}} \equiv \llbracket e'_{\text{res}} \rrbracket_{\mathcal{M}}$ , we have  $\llbracket \text{eliminate}(C, \text{insts}) \rrbracket_{\mathcal{M}} \Rightarrow \llbracket C \rrbracket_{\mathcal{M}}$ . □

## A.2 Completeness and strong completeness

**Theorem 7** (Completeness of calls to *insts* implies completeness of *eliminate*). *For any  $C, \text{insts}, \mathcal{M}$ , if during execution of  $\text{eliminate}(C, \text{insts})$  all calls to *insts* are complete, then*

$$\llbracket C \rrbracket_{\alpha_{\mathcal{G}}(\mathcal{M})} = \llbracket \text{eliminate}(C, \text{insts}) \rrbracket_{\alpha_{\mathcal{G}}(\mathcal{M})}$$

where  $\mathcal{G}$  is such that  $\forall i, \gamma_{\mathcal{G}}(\mathcal{M}(P_i^\#)) = \gamma_{\sigma_i}(P_i^\#)$ , with  $i, P_i^\#, \sigma_i$  as defined in *eliminate*.

*Proof.* Let  $C_i = e_{\text{res}_1} \wedge \dots \wedge e_{\text{res}_{i-1}} \wedge e_{\text{res}_i} \wedge e_{i+1} \wedge \dots \wedge e_n \rightarrow e'_{\text{res}}$ . and let  $\mathcal{M}' = \alpha_{\mathcal{G}}(\mathcal{M})$ . Our algorithm *eliminate* takes as input a clause equivalent to  $C_0$  as step 1 does not change the semantics, and outputs  $C_n$ . Let us show by induction on  $i$  that  $\llbracket C_i \rrbracket_{\mathcal{M}'} \equiv \llbracket C_0 \rrbracket_{\mathcal{M}'}$ .

$$\begin{aligned}
& \llbracket C_{i+1} \rrbracket_{\mathcal{M}'} \\
\equiv & \llbracket e_{res_{i+1}} \rightarrow e_{res_1} \wedge \dots \wedge e_{res_{i-1}} \wedge e_{res_i} \wedge e_{i+2} \wedge \dots \wedge e_n \rightarrow e'_{res} \rrbracket_{\mathcal{M}'} \\
& \text{by curriffication} \\
\equiv & \llbracket e_{res_{i+1}} \rightarrow ctx_{i+1} \rrbracket_{\mathcal{M}'} \\
& \text{assuming step 2 matches} \\
\equiv & \forall vars, (\forall((a^\#, q)) \in insts(F_{\sigma_{i+1}}, a_{i+1}, ctx_{i+1})(vars), \\
& F_{\sigma_{i+1}}[q](a^\#, a_{i+1}(vars)) \Rightarrow a^\# \in \mathcal{M}'(P_{i+1}^\#)) \rightarrow \llbracket ctx_{i+1}(vars) \rrbracket_{\mathcal{M}'} \\
& \text{expanding the match pattern} \\
\equiv & \forall vars, (\forall((a^\#, q)), F_{\sigma_{i+1}}[q](a^\#, a_{i+1}(vars)) \\
& \Rightarrow a^\# \in \mathcal{M}'(P_{i+1}^\#)) \rightarrow \llbracket ctx_{i+1}(vars) \rrbracket_{\mathcal{M}'} \\
& \text{using completeness of that call to } insts, \text{ with } \alpha_\sigma(E) = \mathcal{M}'(P_{i+1}^\#) \\
\equiv & \llbracket e_{i+1} \rightarrow e_{res_1} \wedge \dots \wedge e_{res_{i-1}} \wedge e_{res_i} \wedge e_{i+2} \wedge \dots \wedge e_n \rightarrow e'_{res} \rrbracket_{\mathcal{M}'} \\
& \text{using the match pattern} \\
\equiv & \llbracket C_i \rrbracket_{\mathcal{M}'} \text{ decurrying} \\
\equiv & \llbracket C_0 \rrbracket_{\mathcal{M}'} \text{ by induction assumption}
\end{aligned}$$

□

**Theorem 8** (Strong completeness implies completeness). *If  $ctx$  is of boolean type,  $insts(F_\sigma, a, ctx)$  strongly complete  $\Rightarrow insts(F_\sigma, a, ctx)$  complete*

*Proof.* Assume strong completeness of  $insts(F_\sigma, a, ctx)$  and fix  $E, \mathcal{M}$ . By contraposition, completeness of  $insts(F_\sigma, a, ctx)$  is equivalent to :

$$\begin{aligned}
& (\exists vars, \neg \llbracket ctx(vars) \rrbracket_{\mathcal{M}} \wedge (\forall((a^\#, q)) \in insts(F_\sigma, a, ctx)(vars), \\
& F_\sigma[q](a^\#, a(vars)) \Rightarrow a^\# \in \alpha_\sigma(E))) \\
& \Rightarrow \\
& (\exists vars', \neg \llbracket ctx(vars') \rrbracket_{\mathcal{M}} \wedge \\
& (\forall((a^\#, q)), F_\sigma[q](a^\#, a(vars)) \Rightarrow a^\# \in \alpha_\sigma(E)))
\end{aligned}$$

Now introduce  $vars$  and assume the first part of the implication.

Therefore we have,

$\forall((a^\#, q)) \in insts(F_\sigma, a, ctx)(vars), F_\sigma[q](a^\#, a(vars)) \Rightarrow a^\# \in \alpha_\sigma(E)$ , and we obtain using strong completeness

$$\begin{aligned}
& \exists vars', (\forall(a^\#, q), F_\sigma[q](a^\#, a(vars)) \Rightarrow a^\# \in \alpha_\sigma(E)) \wedge \\
& \llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}}.
\end{aligned}$$

But using  $\neg \llbracket ctx(vars) \rrbracket_{\mathcal{M}}$  (assumed in the first part of completeness), and  $\llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}}$  we obtain  $\neg \llbracket ctx(vars') \rrbracket_{\mathcal{M}}$ .

Therefore, we have both elements of our contraposed completeness and our proof is complete. □

Even though most abstractions for unbounded data structures are fairly complex and involve infinitely many abstract values for some concrete values (*i.e.*  $cardinal(\sigma(a))$  is infinite) as is the case for  $Cell_1$ , many “filler” abstractions such as  $\sigma_{id}$ , or simpler abstractions (see Section 5) are finite. For finite abstractions, one can define a very simple heuristic  $insts$  which verifies the strong completeness property : return the set of abstract elements!

**Theorem 9** (Strong Completeness of *insts* of Algorithms 3 and 4). *If  $\sigma$  is finite,  $\text{insts}(F_\sigma, a, \text{ctx})$  is strongly complete. If its recursive calls are strongly complete,  $\text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})$  is strongly complete. If  $\sigma_1, \sigma_2$  are compatible:  $\forall E \neq \emptyset, \alpha_{\sigma_2} \circ \gamma_{\sigma_2} \circ \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E) = \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$  and its recursive calls are strongly complete, then  $\text{insts}(F_{\sigma_1 \circ \sigma_2}, a, \text{ctx})$  is strongly complete.*

*Proof.* • finite case

Assume  $F_\sigma$  does not use nested existential quantifiers and  
 $\forall \text{vars}, \sigma(a(\text{vars})) \subseteq \text{insts}(F_\sigma, a, \text{ctx})(\text{vars})$  and introduce  $E, \text{vars}, \mathcal{M}$ .

$$\begin{aligned} & \forall((a^\#, ())) \in \text{insts}(F_\sigma, a, \text{ctx})(\text{vars}), \\ & \quad F_\sigma[()](a^\#, a(\text{vars})) \Rightarrow a^\# \in \alpha_\sigma(E) \\ & \equiv \forall((a^\#, ())) \in \text{insts}(F_\sigma, a, \text{ctx})(\text{vars}) \cap \sigma(a(\text{vars})), a^\# \in \alpha_\sigma(E) \\ & \equiv \forall((a^\#, ())) \in \sigma(a(\text{vars})), a^\# \in \alpha_\sigma(E) \text{ by assumption} \\ & \quad \equiv (\forall(a^\#, ()), F_\sigma[()](a^\#, a(\text{vars}')) \Rightarrow a^\# \in \alpha_\sigma(E)) \\ & \wedge \llbracket \text{ctx}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{ctx}(\text{vars}') \rrbracket \text{ with } \text{vars}' = \text{vars} \end{aligned}$$

As a consequence, we have:

- $\forall a, \text{ctx}, \text{insts}(F_{\sigma_{id}}, a, \text{ctx})$  as defined in Algorithm 3 is strongly complete.
- $\forall a, \text{ctx}, \text{insts}(F_{\sigma_{bot}}, a, \text{ctx})$  as defined in Algorithm 3 is strongly complete.
- *inductive cases*: for dot and o: see below

□

**Theorem 9.** *Strong completeness for  $\cdot$*

$\forall \sigma_1, \sigma_2, a_1, a_2, \text{ctx}, \text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})$  as defined in Algorithm 4 is strongly complete when its recursive calls to *insts*, that is,  $\text{insts}(F_{\sigma_1}, a_1, (\text{ctx}, a_2))$  and  $\text{insts}(F_{\sigma_2}, a_2, (\text{ctx}, a_1, I_1))$  are.

*Proof.* For  $\text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})$ , the idea consists in first abstracting  $a_2$  (respectively  $a_1$ ) thus yielding a  $\text{vars}_{tmp}$  and then abstracting  $a_1$  yielding a  $\text{vars}'$ . The key thing is that when abstracting  $a_2$ , we must not change anything to the rest of the clause, including the instantiation sets. Now, let us do the full proof of strong completeness by working from the assumption we have in strong completeness:

$$\begin{aligned} & \forall(a^\#, q) \in \text{insts}(F_{\sigma_1 \cdot \sigma_2}, a, \text{ctx})(\text{vars}), \\ & \quad F_{\sigma_1 \cdot \sigma_2}[q](a^\#, a(\text{vars})) \Rightarrow a^\# \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$

1) Let us unpack  $a = (a_1, a_2)$  and  $q = q_1 @ q_2$ . As we know the number of identifiers generated by  $\sigma_1$ , we know where to split the list  $q$

$$\begin{aligned} & \forall((a_1^\#, a_2^\#), q_1 @ q_2) \in \text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx})(\text{vars}), \\ & \quad F_{\sigma_1 \cdot \sigma_2}[q_1 @ q_2]((a_1^\#, a_2^\#), (a_1(\text{vars}), a_2(\text{vars}))) \\ & \quad \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$

2) Using the definition of  $\text{insts}(F_{\sigma_1 \cdot \sigma_2}, (a_1, a_2), \text{ctx}), I_1, I_2$

$$\begin{aligned} & \forall(a_1^\#, q_1) \in I_1(\text{vars}), (a_2^\#, q_2) \in I_2(\text{vars}), \\ & \quad F_{\sigma_1 \cdot \sigma_2}[q_1 @ q_2]((a_1^\#, a_2^\#), (a_1(\text{vars}), a_2(\text{vars}))) \\ & \quad \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$

3) Using the definition of  $F_{\sigma_1 \cdot \sigma_2}$

$$\begin{aligned} & \forall(a_1^\#, q_1) \in I_1(\text{vars}), (a_2^\#, q_2) \in I_2(\text{vars}), F_{\sigma_1}[q_1](a_1^\#, a_1(\text{vars})) \\ & \quad \wedge F_{\sigma_2}[q_2](a_2^\#, a_2(\text{vars})) \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$



4) Now, let us move things around

$$\begin{aligned} \forall(a_2^\#, q_2) \in I_2(vars), F_{\sigma_2}[q_2](a_2^\#, a_2(vars)) \\ \Rightarrow \forall(a_1^\#, q_1) \in I_1(vars), F_{\sigma_1}[q_1](a_1^\#, a_1(vars)) \\ \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$

5) Now, let us prepare to use strong completeness of  $I_2$

$$\begin{aligned} \forall(a_1^\#, q_1) \in I_1(vars), F_{\sigma_1}[q_1](a_1^\#, a_1(vars)) \\ \Rightarrow \forall(a_2^\#, q_2) \in I_2(vars), F_{\sigma_2}[q_2](a_2^\#, a_2(vars)) \\ \Rightarrow a_2^\# \in \{x | (a_1^\#, x) \in \alpha_{\sigma_1 \cdot \sigma_2}(E)\} \end{aligned}$$

6) The set in question is a projection. Using the definition of  $\alpha_{\sigma_1 \cdot \sigma_2}$ , we have :

$$\begin{aligned} \forall(a_1^\#, q_1) \in I_1(vars), F_{\sigma_1}[q_1](a_1^\#, a_1(vars)) \\ \Rightarrow \forall(a_2^\#, q_2) \in I_2(vars), F_{\sigma_2}[q_2](a_2^\#, a_2(vars)) \\ \Rightarrow a_2^\# \in \alpha_{\sigma_2}(\{x | (a_1^\#, x) \in \alpha_{\sigma_1 \cdot \sigma_{id}}(E)\}) \end{aligned}$$

7) Let  $E_t$  be the latter set, yielding

$$\begin{aligned} \forall(a_1^\#, q_1) \in I_1(vars), F_{\sigma_1}[q_1](a_1^\#, a_1(vars)) \\ \Rightarrow \forall(a_2^\#, q_2) \in I_2(vars), F_{\sigma_2}[q_2](a_2^\#, a_2(vars)) \Rightarrow a_2^\# \in \alpha_{\sigma_2}(E_t) \end{aligned}$$

8) Let us move the first implication to the context.

$$\forall(a_2^\#, q_2) \in I_2(vars), F_{\sigma_2}[q_2](a_2^\#, a_2(vars)) \Rightarrow a_2^\# \in \alpha_{\sigma_2}(E_t)$$

9) Let use strong completeness of  $I_2 = \text{insts}(F_{\sigma_2}, a_2, (ctx, a_1, I_1))$  with  $E = E_t$

We retrieve  $vars_t$  such that

$$\begin{aligned} (\forall(a_2^\#, q_2), F_{\sigma_2}[q_2](a_2^\#, a_2(vars_t)) \Rightarrow a_2^\# \in \alpha_{\sigma_2}(E_t)) \\ \wedge \llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}} \\ \wedge \llbracket a_1(vars) \rrbracket_{\mathcal{M}} = \llbracket a_1(vars_t) \rrbracket_{\mathcal{M}} \wedge \llbracket I_1(vars) \rrbracket_{\mathcal{M}} = \llbracket I_1(vars_t) \rrbracket_{\mathcal{M}} \end{aligned}$$

10) Let us unfold  $E_t$  using the equalities and reintroducing the implication of step 8

$$\begin{aligned} (\forall(a_2^\#, q_2), F_{\sigma_2}[q_2](a_2^\#, a_2(vars_t)) \Rightarrow \\ \forall(a_1^\#, q_1) \in I_1(vars_t), F_{\sigma_1}[q_1](a_1^\#, a_1(vars_t)) \\ \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E)) \end{aligned}$$

11) We remember  $\llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}}$

Now that we have removed  $I_2$ , let us repeat steps after 4 for  $I_1$

$$\begin{aligned} \forall(a_2^\#, q_2), F_{\sigma_2}[q_2](a_2^\#, a_2(vars_t)) \\ \Rightarrow \forall(a_1^\#, q_1) \in I_1(vars_t), F_{\sigma_1}[q_1](a_1^\#, a_1(vars_t)) \\ \Rightarrow a_1^\# \in \alpha_{\sigma_1}(\{x | (x, a_2^\#) \in \alpha_{id \cdot \sigma_2}(E)\}) \end{aligned}$$

12) Let us name that set  $E'_t$  and let use strong completeness of  $I_1$  (moving the first implication in context)

We retrieve  $vars'$  such that

$$\begin{aligned} (\forall(a_1^\#, q_1), F_{\sigma_1}[q_1](a_1^\#, a_1(vars')) \Rightarrow a_1^\# \in \alpha_{\sigma_1}(E'_t)) \\ \wedge \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}} \\ \wedge \llbracket a_2(vars_t) \rrbracket_{\mathcal{M}} = \llbracket a_2(vars') \rrbracket_{\mathcal{M}} \end{aligned}$$

13) Let us unfold  $E'_t$  using the equalities and context

$$\begin{aligned} \forall(a_1^\#, q_1), F_{\sigma_1}[q_1](a_1^\#, a_1(vars')) \\ \Rightarrow \forall(a_2^\#, q_2), F_{\sigma_2}[q_2](a_2^\#, a_2(vars')) \Rightarrow (a_1^\#, a_2^\#) \in \alpha_{\sigma_1 \cdot \sigma_2}(E) \end{aligned}$$

14) Reversing the steps before 4

and using  $\llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}}$  (steps 11 and 12)

$$\begin{aligned} (\forall(a^\#, q), F_{\sigma_1 \cdot \sigma_2}[q](a^\#, a(vars')) \Rightarrow a^\# \in \alpha_{\sigma_1 \cdot \sigma_2}(E)) \\ \wedge \llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}} \end{aligned}$$

15) Our desired result ! □

**Theorem 9** (Strong completeness for  $\circ$ ).  $\forall \sigma_1, \sigma_2, a, ctx, insts(F_{\sigma_1 \circ \sigma_2}, a, ctx)$  as defined in Algorithm 4 is strongly complete when

- its recursive calls to *insts*, that is,  $I_2, \{I_{(q_0, q_2)}, (q_0, q_2) \in I_2\}$  are.
- $\sigma_1, \sigma_2$  are compatible, that is :  
 $\forall E \neq \emptyset, \alpha_{\sigma_2} \circ \gamma_{\sigma_2} \circ \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E) = \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$

*Proof.* The case  $E = \emptyset$  is proven by definition of string completeness. Let us continue with  $E \neq \emptyset$ .

$$\begin{aligned} \forall(a^\#, q) \in insts(F_{\sigma_1 \circ \sigma_2}, a, ctx)(vars), \\ F_{\sigma_1 \circ \sigma_2}[q](a^\#, a(vars)) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

16) Unfolding definition of  $insts(F_{\sigma_1 \circ \sigma_2}, a, ctx)$  (using the first note) and  $F_{\sigma_1 \circ \sigma_2}$ . We remind that  $(a^\#, (q_0 @ q_1 @ q_2)) \in insts(F_{\sigma_1 \circ \sigma_2}, a, ctx) \equiv (q_0, q_2) \in I_2 \wedge (a^\#, q_1) \in I_{(q_0, q_2)}$

$$\begin{aligned} \forall(q_0, q_2) \in I_2(vars), \forall(a^\#, q_1) \in I_{(q_0, q_2)}(vars), \\ F_{\sigma_2}[q_2](q_0, a(vars)) \wedge F_{\sigma_1}[q_1](a^\#, q_0) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

17) We first wish to transform the universal quantification restricted to  $I_{(q_0, q_2)}$  into an unrestricted one. As there is an instance of  $I_{(q_0, q_2)}$  for each  $(q_0, q_2) \in I_2$ , we iteratively handle each instance. At each stage of the iteration we have the set of instances that have already been handled  $I_{tmp}$ , and the set that is still to handle  $I_2 - I_{tmp}$ . This yields the following property **Handled**( $I_{tmp}$ ).

$\exists vars'$ ,

$$\begin{aligned} \forall(q_0, q_2) \in I_{tmp}(vars'), \forall(a^\#, q_1), \\ F_{\sigma_2}[q_2](q_0, a(vars')) \wedge F_{\sigma_1}[q_1](a^\#, q_0) \\ \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

$$\begin{aligned} \wedge \forall(q'_0, q'_2) \in (I_2 - I_{tmp})(vars'), \\ \forall(a'^\#, q'_1) \in I_{(q'_0, q'_2)}(vars'), \\ F_{\sigma_2}[q'_2](q'_0, a(vars')) \wedge F_{\sigma_1}[q'_1](a'^\#, q'_0) \\ \Rightarrow a'^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

$$\wedge \llbracket ctx(vars') \rrbracket_{\mathcal{M}} = \llbracket ctx(vars) \rrbracket_{\mathcal{M}}$$

Note that the property is divided in three parts :

- The handled part, where the quantifiers are unrestricted.

- The not yet handled part, where the quantifiers are restricted
- The rest

From Step 16, we have :

*Handled*( $\emptyset$ )

18) The proof that *Handled*( $\emptyset$ )  $\Rightarrow$  *Handled*( $I_2$ ) is done in step 25. Assuming it, we have

*Handled*( $I_2$ )

19) Unfolding the definition of *Handled*( $I_2$ ), thus retrieving a  $\exists vars'$  and introducing it as  $vars_t$ , we get :

$$\forall(q_0, q_2) \in I_2(vars_t), \forall(a^\#, q_1),$$

$$F_{\sigma_2}[q_2](q_0, a(vars_t)) \wedge F_{\sigma_1}[q_1](a^\#, q_0) \\ \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)$$

$$\wedge \llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}}$$

20) Let us prepare to apply strong completeness of  $I_2$  and let us remember  $\llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}}$

$$\forall(q_0, q_2) \in I_2(vars_t), F_{\sigma_2}[q_2](q_0, a(vars_t))$$

$$\Rightarrow q_0 \in \{x | \forall(a^\#, q_1), F_{\sigma_1}[q_1](a^\#, x) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)\}$$

21) Let us name the set

$\{x | \forall(a^\#, q_1), F_{\sigma_1}[q_1](a^\#, x) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)\}$  as  $E_{I_2}$ . To apply strong completeness of  $I_2 = insts(F_{\sigma_2}, a, ctx)$ , we need  $\exists E, E_{I_2} = \alpha_{\sigma_2}(E)$ . We show that  $E_{I_2} = \alpha_{\sigma_2} \circ \gamma_{\sigma_2}(E_{I_2})$  and thus, our need is verified for  $E = \gamma_{\sigma_2}(E_{I_2})$ .

$$E_{I_2} = \{x | \forall(a^\#, q_1), F_{\sigma_1}[q_1](a^\#, x) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)\}$$

$$= \{x | \forall a^\# \in \sigma_1(x), a^\# \in \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)\}$$

$$= \{x | \sigma_1(x) \subseteq \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)\}$$

$$= \bigcup \{z | \alpha_{\sigma_1}(z) \subseteq \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)\}$$

$$= \bigcup \{z | z \subseteq \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)\}$$

$$= \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$$

$$\text{Therefore, } \alpha_{\sigma_2} \circ \gamma_{\sigma_2}(E_{I_2})$$

$$= \alpha_{\sigma_2} \circ \gamma_{\sigma_2} \circ \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$$

$$= \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{\sigma_2}(E)$$

$$= E_{I_2}$$

by compatibility assumption

Let us continue our main proof and let us replace the  $E_{I_2}$  by  $\alpha_{\sigma_2} \circ \gamma_{\sigma_2}(E_{I_2})$

$$\forall(q_0, q_2) \in I_2(vars_t), F_{\sigma_2}[q_2](q_0, a(vars_t))$$

$$\Rightarrow q_0 \in \alpha_{\sigma_2} \circ \gamma_{\sigma_2}(E_{I_2})$$

22) Let use strong completeness of  $I_2 = insts(F_{\sigma_2}, a, ctx)$  with  $E = \gamma_{\sigma_2}(E_{I_2})$ . We retrieve  $vars'$  such that (and reusing  $E_{I_2} = \alpha_{\sigma_2} \circ \gamma_{\sigma_2}(E_{I_2})$  and unfolding the definition of  $E_{I_2}$

$$\forall(q_0, q_2), F_{\sigma_2}[q_2](q_0, a(vars'))$$

$$\forall(a^\#, q_1), F_{\sigma_1}[q_1](a^\#, q_0) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)$$

$$\wedge \llbracket ctx(vars') \rrbracket_{\mathcal{M}} = \llbracket ctx(vars_t) \rrbracket_{\mathcal{M}}$$

23) Applying the definition of  $F_{\sigma_1 \circ \sigma_2}$  in the reverse way as in step 16

$$\forall(a^\#, q),$$

$$F_{\sigma_1 \circ \sigma_2}[q](a^\#, a(vars')) \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)$$

$$\wedge \llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}}$$

24) Our desired result !

25) Let us show *Handled*( $\emptyset$ )  $\Rightarrow$  *Handled*( $I_2$ ) where the property *Handled*( $I_{tmp}$ ) is defined in step 17. To do so, we prove that we have *Handled*( $I$ ) for any set  $I$  reached by the variable  $I_{tmp}$  of Algorithm 4 and prove that *Handled*( $I$ )  $\Rightarrow$  *Handled*( $I \cup \{(q_0, q_2)\}$ ) where  $I$  and  $I \cup \{(q_0, q_2)\}$  are values reached by  $I_{tmp}$  in the while loop. It follows by transitivity and finiteness of  $I_2$  that *Handled*( $\emptyset$ )  $\Rightarrow$  *Handled*( $I_2$ ).

The assumption *Handled*( $I$ ) after introducing  $vars'$  yields :

|  |
|--|
| $\begin{aligned} & \forall (q_{0d}, q_{2d}) \in I(vars'), \forall (a_d^\#, q_{1d}), \\ & F_{\sigma_2}[q_{2d}](q_{0d}, a(vars')) \wedge F_{\sigma_1}[q_{1d}](a_d^\#, q_{0d}) \\ & \Rightarrow a_d^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$   |
| $\begin{aligned} & \wedge \forall (a^\#, q_1) \in I_{(q_0, q_2)}(vars'), \\ & F_{\sigma_2}[q_2(vars')](q_0(vars'), a(vars')) \\ & \wedge F_{\sigma_1}[q_1](a^\#, q_0(vars')) \\ & \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$  |
| $\begin{aligned} & \wedge \forall (q'_0, q'_2) \in (I_2 - I - \{(q_0, q_2)\})(vars'), \\ & \forall (a'^\#, q'_1) \in I_{(q'_0, q'_2)}(vars'), \\ & F_{\sigma_2}[q'_2](q'_0, a(vars')) \wedge F_{\sigma_1}[q'_1](a'^\#, q'_0) \\ & \Rightarrow a'^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$ |
| $\wedge \quad \llbracket ctx(vars') \rrbracket_{\mathcal{M}} \quad = \quad \llbracket ctx(vars) \rrbracket_{\mathcal{M}}$  |

26) Our goal is to “move” the part in gray from within the part in red into the part in blue. Let us work on the part in gray for now.

$$\begin{aligned} & \forall (a^\#, q_1) \in I_{(q_0, q_2)}(vars'), \\ & F_{\sigma_2}[q_2(vars')](q_0(vars'), a(vars')) \wedge F_{\sigma_1}[q_1](a^\#, q_0(vars')) \\ & \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

27) Let us prepare to apply strong completeness of  $I_{(q_0, q_2)}$  which is equal to  $insts(F_{\sigma_1}, q_0, (I_2 - \{(q_0, q_2)\}, I_f, F_{\sigma_2}[q_2](q_0, a), ctx))$

$$\begin{aligned} & F_{\sigma_2}[q_2(vars')](q_0(vars'), a(vars')) \\ & \Rightarrow \forall (a^\#, q_1) \in I_{(q_0, q_2)}(vars'), F_{\sigma_1}[q_1](a^\#, q_0(vars')) \\ & \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

28) Let us put  $F_{\sigma_2}[q_2(vars')](q_0(vars'), a(vars'))$  into context

$$\begin{aligned} & \forall (a^\#, q_1) \in I_{(q_0, q_2)}(vars'), F_{\sigma_1}[q_1](a^\#, q_0(vars')) \\ & \Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \end{aligned}$$

29) Let us use strong completeness of  $I_{(q_0, q_2)}$  with  $E = \alpha_{\sigma_2}(E)$ . We remind that  $I_{(q_0, q_2)} = insts(F_{\sigma_1}, q_0, (I_2 - \{(q_0, q_2)\}, I_f, F_{\sigma_2}[q_2](q_0, a), ctx))$  with  $I_f = (I_2 - I - \{(q_0, q_2)\})$ . We retrieve  $vars'_t$  such that

$$\begin{aligned} & \forall (a^\#, q_1), F_{\sigma_1}[q_1](a^\#, q_0(vars'_t)) \quad \Rightarrow \quad a^\# \quad \in \quad \alpha_{\sigma_1 \circ \sigma_2}(E) \\ & \wedge (I_2 - \{(q_0, q_2)\})(vars') = (I_2 - \{(q_0, q_2)\})(vars'_t) \\ & \wedge \forall (q'_0, q'_2) \in (I_2 - I - \{(q_0, q_2)\})(vars'), \\ & \quad \quad \quad I_{(q'_0, q'_2)}(vars') = I_{(q'_0, q'_2)}(vars'_t) \\ & \wedge F_{\sigma_2}[q_2(vars')](q_0(vars'), a(vars')) = \\ & \quad \quad \quad F_{\sigma_2}[q_2(vars'_t)](q_0(vars'_t), a(vars'_t)) \\ & \wedge \llbracket ctx(vars') \rrbracket_{\mathcal{M}} = \llbracket ctx(vars'_t) \rrbracket_{\mathcal{M}} \end{aligned}$$

30) Let us use the equalities and set ourselves in the context of steps 26 and 28

$$\begin{array}{c}
\forall(q_{0d}, q_{2d}) \in I(vars'_t), \forall(a_d^\#, q_{1d}), \\
F_{\sigma_2}[q_{2d}](q_{0d}, a(vars'_t)) \wedge F_{\sigma_1}[q_{1d}](a_d^\#, q_{0d}) \\
\Rightarrow a_d^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E) \\
\\
\boxed{
\begin{array}{c}
\wedge \forall(a^\#, q_1), \\
F_{\sigma_2}[q_2](vars'_t)(q_0(vars'_t), a(vars'_t)) \\
\wedge F_{\sigma_1}[q_1](a^\#, q_0(vars'_t)) \\
\Rightarrow a^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)
\end{array}
}
\end{array}$$

$$\begin{array}{c}
\wedge \forall(q'_0, q'_2) \in (I_2 - I - \{(q_0, q_2)\})(vars'_t), \\
\forall(a'^\#, q'_1) \in I_{(q'_0, q'_2)}(vars'_t), \\
F_{\sigma_2}[q'_2](q'_0, a(vars'_t)) \wedge F_{\sigma_1}[q'_1](a'^\#, q'_0) \\
\Rightarrow a'^\# \in \alpha_{\sigma_1 \circ \sigma_2}(E)
\end{array}$$

$$\wedge \quad \llbracket ctx(vars'_t) \rrbracket_{\mathcal{M}} \quad = \quad \llbracket ctx(vars) \rrbracket_{\mathcal{M}}$$

31) *Handled*( $I \cup \{(q_0, q_2)\}$ ), our desired result ! □

### A.3 Cell abstraction results

**Theorem 10** (Abstraction compatibility for cell abstractions). *The abstractions of Example 9 have strongly complete instantiation heuristics when  $Cell_n$  has.*

*Proof.* As the abstractions are  $Cell_n$  are finite abstractions, the only consideration is compatibility of the abstractions (condition for  $\circ$  to have strongly complete instantiation). Let us prove the result for  $Cell_1$  and consider the composed abstraction  $\sigma_1$ . We need to prove:  $\forall E \neq \emptyset, \alpha_{Cell_1} \circ \gamma_{Cell_1} \circ \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{Cell_1}(E) = \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{Cell_1}(E)$ .

Introduce  $E \neq \emptyset$  and define  $X = \gamma_{\sigma_1} \circ \alpha_{\sigma_1} \circ \alpha_{Cell_1}(E)$ . Note that  $\exists a, \forall i, (i, a[i]) \in X$  because  $E \neq \emptyset$ , thus,  $\exists a \in E$ , thus,  $\exists a, \forall i, (i, a[i]) \in \alpha_{Cell_1}(E)$ , thus,  $\exists a, \forall i, (i, a[i]) \in X$  as  $\forall S, S \subseteq \gamma_{\sigma_1} \circ \alpha_{\sigma_1}(S)$ .

We now prove  $\alpha_{Cell_1} \circ \gamma_{Cell_1}(X) = X$ .

$$\begin{aligned}
& \alpha_{Cell_1} \circ \gamma_{Cell_1}(X) = \{(i, a[i]) | a \in \gamma_{Cell_1}(X)\} \\
&= \{(i, a[i]) | a \in \{a | \sigma_{Cell_1}(a) \subseteq X\}\} \\
&= \{(i, v) | \exists a \in \{a | \sigma(a) \subseteq X\} \wedge v = a[i]\} \\
&= \{(i, v) | \exists a, \sigma_{Cell_1}(a) \subseteq X \wedge v = a[i]\} \\
&= \{(i, v) | \exists a, \forall i, (i, a[i]) \in X \wedge v = a[i]\} \\
&= \{(i, v) | true \wedge (i, v) \in X\} \text{ as proved above} \\
&= X
\end{aligned}$$

□

**Theorem 11** (Correctness of *relevant*( $a, expr$ )). *If  $\top \notin \text{relevant}(a, expr)$  then*

$$\begin{aligned}
& \forall \mathcal{M}, vars, a', (\forall i \in \text{relevant}(a, expr), a'[i] = a(vars)[i]) \Rightarrow \\
& \quad \exists vars', \llbracket expr(vars) \rrbracket_{\mathcal{M}} = \llbracket expr(vars') \rrbracket_{\mathcal{M}} \wedge a(vars') = a'
\end{aligned}$$

**Remark 11.** *Should the relevant algorithm be expanded, one only needs to keep the property of this theorem to have strong completeness of  $Cell_n$ .*

*Proof.* Let us first prove a property about *read* : if *read*(*avar*, *expr*) does not contain  $\top$ , then

$$\forall \mathcal{M}, a, a', (\forall i \in \text{read}(\text{avar}, \text{expr}), a[i] = a'[i]) \Rightarrow \\ \forall \text{vars}, \llbracket \text{expr}(\text{vars}[\text{avar} \leftarrow a]) \rrbracket_{\mathcal{M}} = \llbracket \text{expr}(\text{vars}[\text{avar} \leftarrow a']) \rrbracket_{\mathcal{M}}$$

This proof is done by induction on *expr*. Now, let us introduce  $\mathcal{M}, \text{vars}, a'$  and let us assume  $\forall i \in$

*relevant*(*a*, *expr*),  $a'[i] = a(\text{vars})[i]$

Because  $\top \notin \text{relevant}(a, \text{expr})$ , introduce *avar* such that  $a = \text{arrayStoreChain}(\text{avar}, I, V)$ .

We can use our property on *read* with  $\mathcal{M} = \mathcal{M}, a = a(\text{vars}), a' = a', \text{vars} = \text{vars}$  as :

$\forall i \in \text{read}(\text{avar}, \text{expr}), a(\text{vars})[i] = a'[i]$ . (In fact  $\text{read}(\text{avar}, \text{expr}) \subseteq \text{relevant}(a, \text{expr})$  and  $\forall i \in \text{relevant}(a, \text{expr}), a'[i] = a(\text{vars})[i]$ ). Therefore, we have :

$$\begin{aligned} \llbracket \text{expr}(\text{vars}[\text{avar} \leftarrow a(\text{vars})]) \rrbracket_{\mathcal{M}} &= \llbracket \text{expr}(\text{vars}[\text{avar} \leftarrow a']) \rrbracket_{\mathcal{M}} \\ &\equiv \llbracket \text{expr}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{expr}(\text{vars}[\text{avar} \leftarrow a']) \rrbracket_{\mathcal{M}} \\ &\equiv \llbracket \text{expr}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{expr}(\text{vars}') \rrbracket_{\mathcal{M}} \end{aligned}$$

with  $\text{vars}' = \text{vars}[\text{avar} \leftarrow a']$ , which verifies  $a(\text{vars}') = a'$   $\square$

**Theorem 12** (Strong Completeness for cell Abstraction). *Any call to  $\text{insts}(F_{\sigma_{\text{Cell}_n}}, a, \text{ctx})$  is strongly complete whenever  $\top \notin \text{relevant}(a, \text{ctx})$ .*

*Proof.* We shall refer to *Ind*, *I* etc. as defined in Algorithm. 6. For simplicity, let us write everything as though

$\text{insts}(F_{\sigma_{\text{Cell}_n}}, a, \text{ctx})$  returned  $I^n$  instead of  $(I^n, ())$ . Introduce *vars*, *E*,  $\mathcal{M}$  and assume

$$\forall a^\# \in \text{insts}(F_{\sigma_{\text{Cell}_n}}, a, \text{ctx})(\text{vars}), F_{\sigma_{\text{Cell}_n}}(a^\#, a(\text{vars})) \Rightarrow a^\# \in \alpha_{\sigma_{\text{Cell}_n}}(E)$$

which is equivalent to

$$\text{insts}(F_{\sigma_{\text{Cell}_n}}, a, \text{ctx})(\text{vars}) \cap \sigma_{\text{Cell}_n}(a(\text{vars})) \subseteq \alpha_{\sigma_{\text{Cell}_n}}(E)$$

which is equivalent to (as  $\text{Cell}_n$  is just *n* replication of  $\text{Cell}_1$ )

$$\text{insts}(F_{\sigma_{\text{Cell}_1}}, a, \text{ctx})(\text{vars}) \cap \sigma_{\text{Cell}_1}(a(\text{vars})) \subseteq \alpha_{\sigma_{\text{Cell}_1}}(E) \quad (15)$$

We need to show (using the same simplifications) :

$$\exists \text{vars}', \llbracket \text{ctx}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{ctx}(\text{vars}') \rrbracket_{\mathcal{M}} \wedge \sigma_{\text{Cell}_1}(a(\text{vars}')) \subseteq \alpha_{\sigma_{\text{Cell}_1}}(E)$$

1. Case  $E = \emptyset$  :

Let us prove that the assumption 15 is not verified and thus by absurdum, our result stands.

To prove the assumption if not verified, we use :

$$(a) \alpha_{\sigma_{\text{Cell}_1}}(E) = \alpha_{\sigma_{\text{Cell}_1}}(\emptyset) = \emptyset$$

$$(b) \text{insts}(F_{\sigma_{\text{Cell}_1}}, a, \text{ctx})(\text{vars}) \cap \sigma_{\text{Cell}_1}(a(\text{vars})) \neq \emptyset \text{ As } \text{insts}(F_{\sigma_{\text{Cell}_1}}, a, \text{ctx})(\text{vars}) \neq \emptyset \text{ by construction of } Ind \text{ and } \text{insts}(F_{\sigma_{\text{Cell}_1}}, a, \text{ctx})(\text{vars}) \subseteq \sigma_{\text{Cell}_1}(a(\text{vars})) \text{ by construction of } I \text{ (we chose } (a, a[i])).$$

2. Continuing with  $E \neq \emptyset$

Let  $a_\top \in E$

3. Let  $a'$  such that

$$\forall i, a'[i] = \text{ite}(i \in \text{relevant}(a, \text{ctx}), a(\text{vars})[i], a_\top[i])$$

4. By assumption  $\top \notin \text{relevant}(a, \text{ctx})$  and by construction  $\forall i \in \text{relevant}(a, \text{ctx}), a'[i] = a(\text{vars})[i]$ , therefore

$$\exists \text{vars}', \llbracket \text{ctx}(\text{vars}) \rrbracket_{\mathcal{M}} = \llbracket \text{ctx}(\text{vars}') \rrbracket_{\mathcal{M}} \wedge a(\text{vars}') = a_\top \text{ using Theorem 11}$$

5. We already have  $\llbracket ctx(vars) \rrbracket_{\mathcal{M}} = \llbracket ctx(vars') \rrbracket_{\mathcal{M}}$ . Thus, we only need

$$\sigma_{Cell_1}(a(vars')) \subseteq \alpha_{\sigma_{Cell_1}}(E)$$

Which is equivalent to

$$\{(i, a'[i])\} \subseteq \alpha_{\sigma_{Cell_1}}(E)$$

Which is verified as

- (a)  $\{(i, a'[i]), i \in \text{relevant}(a, ctx)\} = \{(i, a(vars)[i]), i \in \text{relevant}(a, ctx)\} \subseteq \text{insts}(F_{\sigma_{Cell_1}}, a, ctx)(vars)$   
which by assumption is included in  $\alpha_{\sigma_{Cell_1}}(E)$
- (b)  $\{(i, a'[i]), i \notin \text{relevant}(a, ctx)\}$   
 $= \{(i, a_{\top}[i]), i \notin \text{relevant}(a, ctx)\}$   
 $\subseteq \sigma_{Cell_1}(a_{\top}) \subseteq \alpha_{Cell_1}(\{a_{\top}\}) \subseteq \alpha_{Cell_1}(\{E\})$   
as  $a_{\top} \in E$ .

□

**Theorem 14** (Satisfiability preservation of *trs*). *If the input clauses are normalized Horn clauses such that there is at most one negative predicate in each clause (corresponds to program without function calls) and the theory on which arrays are used contains read, write but no array equalities  $a = a'$  and there are no arrays whose index or value type is an array and no array variable appears twice within the same predicate then:*

$$trs(\mathfrak{C}, n) \text{ satisfiable} \equiv \exists \mathcal{M} \text{ expressible by } \mathcal{G}, H_C(\mathcal{M})$$

Where  $\mathcal{G}$  is the abstraction used, that is,  $\mathcal{G}_{\sigma_{P_1}}^{P_1} \circ \dots \circ \mathcal{G}_{\sigma_{P_m}}^{P_m}$  with  $P_1, \dots, P_m$  are the predicates of  $\mathfrak{C}$  and  $\sigma^{P_i}$  is as defined in Algorithm 7 and  $\mathcal{G}_{\sigma}^P$  is as defined in Definition 8.

*Proof.* First, note that  $\mathcal{G}$  does not use “data abstraction composition combinator”, and can be defined by  $\alpha_{\mathcal{G}}(\mathcal{M})(P_i) = \alpha_{\sigma^{P_i}}(\mathcal{M}(P_i))$ . As all our other combinators are strongly complete when their parameters are, we only need to prove that all calls to  $\text{insts}(Cell_n, a, ctx)$  are strongly complete, which is equivalent to  $\top \notin \text{relevant}(a, ctx)$ .

We thus need to examine the cases for  $\text{relevant}(a, ctx)$  as defined in Algorithm 5:

1. An array store chain of  $a$  (named  $asc(a)$ ) is only used in a read. This is equivalent to stating that  $asc(a)$  is not used in (i) array equalities (ii) nor within predicates of the context, (iii) nor in a tuple constructor. (i) is true since initial clauses do not contain array equalities initially and we do not introduce any. As all arrays of all predicates are abstracted, predicates do not contain array typed parameters (ii). Only the dot combinator introduce tuples constructors, and no array variable appears twice within the same predicate (iii).
2.  $ctx$  does not contain quantifiers. Initially, there are no quantifiers, and the quantifiers introduced by the abstractions are either positive predicates, and thus are transformed into free variables; or a unique negative predicate which is instanciated just afterwards. Thus, there are no quantifiers in the context.

□

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