

"Next 40 years of Abstract Interpretation"

Abstract Interpretation – 40 years back + some years ahead

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Abstract interpretation: origin (abridged)

Before starting (1972-73): formal syntax

- **Radhia Rezig**: works on **precedence parsing** (R.W. Floyd, N. Wirth and H. Weber, etc.) for Algol 68
 - ➔ Pre-processing (by **static analysis and transformation**) of the grammar before building the *bottom-up* parser
- **Patrick Cousot**: works on **context-free grammar parsing** (J. Earley and F. De Remer)
 - ➔ Pre-processing (by **static analysis and transformation**) of the grammar before building the *top-down* parser

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- Radhia Rezig. *Application de la méthode de précedence totale à l'analyse d'Algol 68*, Master thesis, Université Joseph Fourier, Grenoble, France, September 1972.
 - Patrick Cousot. *Un analyseur syntaxique pour grammaires hors contexte ascendant sélectif et général*. In Congrès AFCET 72, Brochure 1, pages 106-130, Grenoble, France, 6-9 November 1972.

Before starting (1972-73): formal semantics

- **Patrick Cousot**: works on the **operational semantics** of programming languages and the **derivation of implementations from the formal definition**
 - ➔ Static analysis of the formal definition and transformation to get the implementation by “pre-evaluation” (similar to the more recent “partial evaluation”)

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- Patrick Cousot. *Définition interprétative et implantation de langages de programmation*. Thèse de Docteur Ingénieur en Informatique, Université Joseph Fourier, Grenoble, France, 14 Décembre 1974 (submitted in 1973 but defended after finishing military service with J.D. Ichbiah at CII).

Vision (1973)

pas le niveau de "compréhension" des programmes. Les langages actuels ne sont pas faits pour l'optimisation. Entre autres, il y a certains faits sur un programme qui sont connus du programmeur et qui ne sont pas explicites dans le programme. On pourrait y remédier en incluant des assertions, tout comme on insère des déclarations de type pour les variables.

Exemple :

```
(1) - pour i de 0 à 10 faire a[i] := i ; fin ;
(2) - pour i de 11 à 10000 faire a[i] := 0 ; fin ;
(3) - a[a[j] + 1] x a [j + 1]] := j ;
(4) - si a[j x j + 2 x j + 1] ≠ a[j] aller à étiquette ;
```

Pour un tel programme, il est important de savoir que $1 \leq j < 99$ (à charge éventuellement au système de le déduire à partir d'autres assertions), parce qu'on peut alors remplacer (4) par (4') :

```
(4') si j < 10 aller à étiquette ;
```

Cette insertion d'assertions peut donc servir de guide à une analyse automatique des programmes essentielle pour l'optimisation (mais également pour la mise au point, la documentation automatique, la décompilation, l'adaptation à un changement d'environnement d'exécution...).

Dans tous les exemples que nous avons pris, (équivalence de définitions de données, équivalence de définition d'opérateurs) nous avons conduit cette analyse sémantique à la main.

La possibilité de son automation, nous semble conditionner les progrès dans le domaine de l'optimisation de l'implantation automatisée d'un langage étant donnée sa définition, aussi bien que dans celui de l'optimisation des programmes [4].

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Intervals →

Assertions →

Static analysis →

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An important encounter

- I do my military service as a scientist with Jean Ichbiah
- Work on the revision of LIS (ancestor of Green → ADA)
- Will always be a very strong support on our work



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1973: Dijkstra's handmade proofs

- Radhia Rezig: attends Marktoberdorf summer school, July 25–Aug. 4, 1973
 - ➔ Dijkstra shows program proofs (*inventing* elegant backward invariants)



- ➔ Radhia has the idea of automatically *inferring* the invariants by a backward calculus to determine intervals

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1974: origin

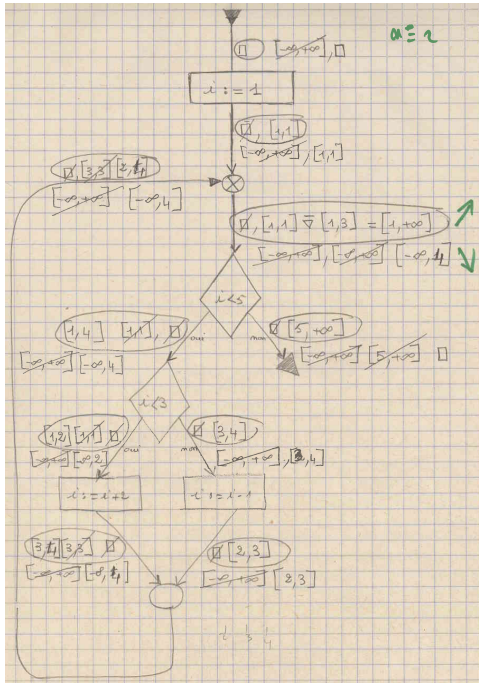
- Radhia Rezig shows her interval analysis ideas to Patrick Cousot
 - ➔ Patrick very critical on going backwards from $[-\infty, +\infty]$ and claims that going forward would be much better
 - ➔ Patrick also very skeptical on forward termination for loops
- Radhia comes back with the idea of extrapolating bounds to $\pm\infty$ for the forward analysis
- We discover widening = induction in the abstract and that the idea is very general



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Notes of Radhia Rezig
 on forward iteration
 from \perp ⁽¹⁾ versus
 backward iteration
 from $[-\infty, +\infty]$ ⁽²⁾

(1) i.e. forward least fixed point
 (2) i.e. backward greatest fixed point

First seminar in Grenoble: a warm welcome

- “Not all functions are increasing, for example, \sin ”
- “This is woolly” (*fumeux*)
- “This will have applications in hundred years”

The IRIA-SESORI contract (1975–76)

- The project evaluator (Bernard Lohro) points us to the literature on constant propagation in data flow analysis (Kildall thesis).
- It appears that it is completely related to some of our ideas, but *a.o.*
 - We are **not syntactic** (as in boolean DFA)
 - We have **no need for some hypotheses** (e.g. distributivity not even satisfied by constant propagation!)
 - We have **no restriction to finite lattices** (or ACC)
 - We have **no need of an a-posteriori proof of correctness** (e.g. with respect to the MOP as in DFA)
 - ...

The IRIA-SESORI contract (1975-76)

- **New general ideas**
 - The formal notions of **abstraction/approximation**
 - The formal notion of **abstract induction** (widening) to handle **infiniteness** and/or **complexity**
 - The **systematic correct design** with respect to a formal semantics
 - ...

On abstracting: transition system

Reachability semantics is an abstraction of the relational semantics
(in PC's thesis, 21 march 1978 also § 3 of POPL'79)

3.1.3 L'approche du point fixe à l'étude du comportement d'un système dynamique discret

DEFINITION 3.1.3.0.1 i.e. pre $wp \in ((S \times S) \rightarrow B) \rightarrow ((S \rightarrow B) \rightarrow (S \rightarrow B))$
 $= \lambda \theta. \{ \lambda \beta. [\lambda e_1. \{ \exists e_2 \in S : \theta(e_1, e_2) \text{ et } \beta(e_2) \}] \}$

DEFINITION 3.1.3.0.2 i.e. post transformer $sp \in ((S \times S) \rightarrow B) \rightarrow ((S \rightarrow B) \rightarrow (S \rightarrow B))$
 $= \lambda \theta. \{ \lambda \beta. [\lambda e_2. \{ \exists e_1 \in S : \beta(e_1) \text{ et } \theta(e_1, e_2) \}] \}$

Partant du fait que $\tau^* = eq \text{ ou } \tau^* \circ \tau = eq \text{ ou } \tau \circ \tau^*$, nous obtenons $wp(\tau^*)$ et $sp(\tau^*)$ comme points fixes d'une équation.

THEOREME 3.1.3.0.3
 (a) - $((S \times S) \rightarrow B) \rightarrow \{ \lambda(e_1, e_2). \text{faux}, \lambda(e_1, e_2). \text{vrai}, \text{OU}, \text{ET}, \text{non} \}$ est un treillis booléen complet.
 (b) - Soient $a, b \in ((S \times S) \rightarrow B)$ alors $\lambda a. [a \text{ ou } b \circ a]$ et $\lambda a. [a \text{ ou } a \circ b]$ sont des morphismes complets pour la disjonction.
 (c) - Soient $\tau \in ((S \times S) \rightarrow B)$ et eq la relation d'égalité alors $\tau^* = \text{Lfp}(\lambda a. [eq \text{ ou } a \circ \tau]) = \text{Lfp}(\lambda a. [eq \text{ ou } \tau \circ a])$.

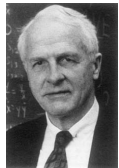
THEOREME 3.1.3.0.6.
 Quels que soient $a, b \in ((S \times S) \rightarrow B)$ et $\beta \in (S \rightarrow B)$ nous avons:
 • $wp(\text{Lfp}(\lambda a. [a \text{ ou } b \circ a]))(\beta)$
 $= \text{Lfp}(\lambda a. [wp(a)(\beta) \text{ ou } wp(b)(a)])$
 $= \text{OU } wp(b^*)(wp(a)(\beta))$
 • $sp(\text{Lfp}(\lambda a. [a \text{ ou } a \circ b]))(\beta)$
 $= \text{Lfp}(\lambda a. [sp(a)(\beta) \text{ ou } sp(b)(a)])$
 $= \text{OU } sp(b^*)(sp(a)(\beta))$

Propose: Posons $h = \lambda \theta. [wp(\theta)(\beta)]$, $f = \lambda a. [a \text{ ou } b \circ a]$ et $g = \lambda a. [wp(a)(\beta) \text{ ou } wp(b)(a)]$ et montrons que $h \circ f = g \circ h$.

Annotations: **fixpoint reflexive transitive closure**, **abstract transformer**, **concrete transformer**, **fixpoint**, **backward reachability**, **forward reachability**, **iterative fixpoint computation**, **Fixpoint abstraction under commutativity with abstraction h**.

On convincing ...

- During PC's thesis defense, it was suggested that **abstraction/approximation is useless since computers are finite and executions are timed-out** (so, the second part of the thesis on fixpoint approximation/widening/narrowing/... is superfluous!)
- Fortunately we do not listen (otherwise we would have invented enumeration methods that fail to scale)
- On the contrary, in 1978, during a seminar at Harvard ⁽¹⁾, G. Birkhoff appears interested, according to his questions & feedback, in the **effective computational aspects of lattice fixpoint theory**



⁽¹⁾ invited by Ed. Clarke.

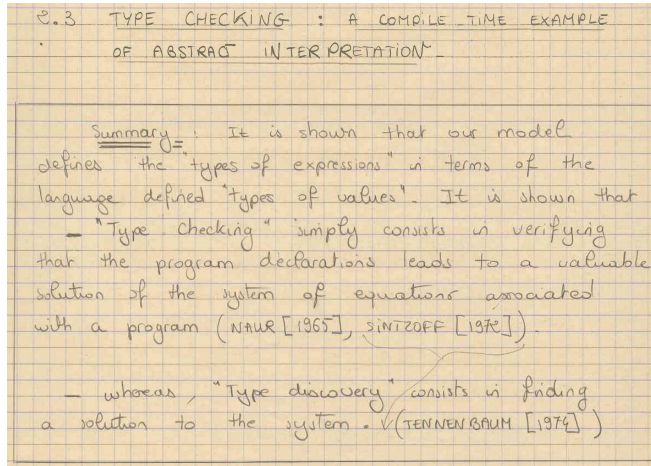
The principles (1977–79) are lasting

- Define the **semantics** (operational, denotational, axiomatic, ...) of the programming language (as a ... / **trace semantics** / **transition system** / **transformers** / ...)
- Define the **strongest property of interest** (also called the **collecting semantics**)
- Express this collecting semantics in **fixpoint** (constraint, rule-based,...) form
- Define the **abstraction/concretization** compositionally (by composition of elementary abstractions and abstraction constructors/functors)
- Design the **abstract proof / analysis semantics** by calculus using [structural] abstraction i.e. **abstract domain** + **abstract fixpoint**
- Combine abstractions (e.g. **reduced product**)

Abstract interpretation: Research takes time

Typing

- Type checking and inference is an abstract interpretation:



Typing

- POPL 1997:

Types as Abstract Interpretations

(invited paper)

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Abstract

Starting from a denotational semantics of the eager untyped lambda-calculus with explicit runtime errors, the standard collecting semantics is defined as specifying the strongest program properties. By a first abstraction, a new sound type collecting semantics is derived in compositional fixpoint form. Then by successive (semi-dual) Galois connection based abstractions, type systems and/or type inference algorithms are designed as abstract semantics or abstract interpreters approximating the type collecting semantics. This leads to a hierarchy of type systems, which is part of the lattice of abstract interpretations of the untyped lambda-calculus. This hierarchy includes two new à la Church/Curry polytype systems. Abstractions of this polytype semantics lead to classical Milner/Mycroft and Damas/Milner polymorphic type schemes, Church/Curry monotypes and Hindley principal typing algorithm. This shows that types are abstract interpretations.

1 Introduction

The leading idea of abstract interpretation [8, 7, 9, 12] is that program semantics, proof and static analysis methods have common structures which can be exhibited by abstraction of the structure of runtime computations. This leads to an organization of the paper or less approximate or refined semantics into a lattice of abstract interpretations. This unifying point of view allows for a synthetic understanding of a wide range of works from theoretical mathematical specifications to practical static analysis algorithms.

It will be shown that this point of view can be applied to type theory, in particular to type soundness and à la Curry type inference which, following [17, 29], have been dominating research themes in programming languages during the last two decades, at least for functional programming language [1, 19, 31]. Traditionally the design of a type-system

"involves defining the notion of type error for a given language, formalizing the type system by a set of type rules, and verifying that program execution of well-typed programs cannot produce type errors. The process, if successful, guarantees the type-soundness of a language as a whole. Type-checking algorithms can then be developed as a separate component."

Formalizing the type system by a set of type rules, and verifying that program execution of well-typed programs cannot produce type errors. The process, if successful, guarantees the type-soundness of a language as a whole. Type-checking algorithms can then be developed as a separate component.

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cern, and their correctness can be verified with respect to a given type system; this process guarantees that type checkers satisfy the language definition." [2]. Abstract interpretation allows viewing all these different aspects in the more unifying framework of semantic approximation. Formalization of program analysis and type systems within the same abstract interpretation framework should lead to a better understanding of the relationship between these seemingly different approaches to program correctness and optimization.

2 Syntax

The syntax of the untyped eager lambda calculus is:

$x, f, \dots \in X$: program variables
 $e \in E$: program expressions
 $e ::= x \mid \lambda x. e \mid e_1 e_2 \mid \mu f. \lambda x. e \mid \mathbb{I} e_1 \dots e_n \mathbb{I} (e_1 \tau_1 \dots e_n \tau_n)$

$\lambda x. e$ is the lambda abstraction and $e(\tau)$ the application. In $\mu f. \lambda x. e$, the function f with formal parameter x is defined recursively: $(e_1 \tau_1 \dots e_n \tau_n)$ is the test for zero.

3 Denotational Semantics

The semantic domain \mathbb{D} is defined by the following equations [2]:

$W \subseteq \omega$ wrong
 $\mathbb{Z} \subseteq \mathbb{Z}$ integers
 $\omega, f, \dots \in \mathbb{D} \Rightarrow W, \omega \in \mathbb{Z}, \omega \in \mathbb{I} \rightarrow \mathbb{I}$ values
 $\mathbb{R} \subseteq \mathbb{R} \subseteq X \Rightarrow U$ environments
 $\omega \in \mathbb{D} \subseteq \mathbb{R} \Rightarrow U$ semantic domain

where ω is the wrong value, ω denotes non-termination, D_1 is the list of domain D (with up injection $\omega \in D \Rightarrow D_1$), and partial down injection $\omega \in D_1 \Rightarrow D$, $D_1 \oplus D_2$ is the cartesian sum of domain D_1 and D_2 (with left and right injections $\omega \in D_1 \in D_1 \oplus D_2$ and $\omega \in D_2 \in D_1 \oplus D_2$), $\mathbb{I} \subseteq \mathbb{I} \subseteq \omega$; W, ω and $\mathbb{I} D_1 \Rightarrow D_2$ is the domain of continuous, ω -strict, (strict) functions from D_1 into D_2 , \mathbb{I} is the computational ordering on \mathbb{I} and ω is the least upper bound (lub) of increasing chains. In the metatanguage for defining the denotational semantics below, $\lambda x. e$, or $\lambda x. (e)$, is the lambda abstraction, $(\dots \tau_1 \dots \tau_n \dots)$ is the conditional expression.

Probabilistic static analysis

4.e.5.e - Performance Analysis of Programs -

Diagram 1: A control flow graph with a unique entry node i . The flow goes to a node j , then to a node k (labeled 'true'), and then to a node l . The flow from l goes back to j (labeled 'false').

Diagram 2: A control flow graph with a loop. The flow starts at a node $k=0$, goes to a node k (labeled 'true'), then to a node $k=k+1$, and then back to k (labeled 'false').

Equations:

$$C_i = 1 \text{ (unique entry node)}$$

$$C_i = \sum_{j \in \text{pred}(i)} C_j$$

$$C_i = C_j$$

$$C_j = C_i * \text{Prob}(Q = \text{true})$$

$$C_k = C_i * (1 - \text{Prob}(Q = \text{true}))$$

Iteration	C_e
0	1
1	$1 + (1-p)$
2	$1 + (1-p) + (1-p)^2$
...	...
n	$1 + (1-p) + (1-p)^2 + \dots + (1-p)^{n-1}$
...	...

thus the limit of the sequence leads for C_e to an infinite series, which limit is $1/p$:

$$\frac{1}{p} = \frac{1}{1-(1-p)} = 1 + (1-p) + \dots + (1-p)^{n-1} + \dots$$

Applying KIRCHOFF laws, we get the system of equations:

$$C_0 = 1$$

$$C_1 = C_0$$

$$C_2 = C_1 + C_0$$

$$C_3 = C_2 * p$$

$$C_4 = C_3 * (1-p)$$

$$C_5 = C_4 * q$$

$$C_6 = C_5$$

$$C_7 = C_6 * (1-q)$$

$$C_8 = C_7 + C_6$$

$$C_9 = C_8$$

$\left. \begin{array}{l} p = \text{Prob}(T(k) > \text{max}) \\ \text{(not simple, see KIRCHOFF [1969, page 92])} \end{array} \right\}$

Probabilistic static analysis

- ESOP 2012:

Probabilistic Abstract Interpretation

Patrick Cousot and Michael Monerau

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Abstract. Abstract interpretation has been widely used for verifying properties of computer systems. Here, we present a way to extend this framework to the case of probabilistic systems.

The probabilistic abstraction framework that we propose allows us to systematically lift any classical analysis or verification method to the probabilistic setting by separating in the program semantics the probabilistic behavior from the (non-)deterministic behavior. This separation provides new insights for designing novel probabilistic static analyses and verification methods.

We define the concrete probabilistic semantics and propose different ways to abstract them. We provide examples illustrating the expressiveness and effectiveness of our approach.

Termination

- 1 - ABSTRACT -
Abstract interpretation of programs is shown to be a suitable means to statically analyse their weak or strong properties.

- proofs of program termination,
(MANNA and VUILLEMIN [1972], SINTZOFF [1976], SITES [1974])

Termination

• POPL 2012:

An Abstract Interpretation Framework for Termination

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Abstract Proof, verification and analysis methods for termination all rely on two induction principles: (1) a variant function or induction on data ensuring progress towards the end and (2) some form of induction on the program structure.

The abstract interpretation design principle is first illustrated for the design of new forward and backward proof, verification and analysis methods for safety. The safety collecting semantics defining the strongest safety property of programs is first expressed in a constructive fixpoint form. Safety proof and checking/verification methods then immediately follow by fixpoint induction. Static analysis of abstract safety properties such as invariance are constructively designed by fixpoint abstraction (or approximation) to (automatically) infer safety properties. So far, no such clear design principle did exist for termination so that the existing approaches are scattered and largely not comparable with each other.

For (1), we show that this design principle applies equally well to *potential and definite termination*. The trace-based termination collecting semantics is given a fixpoint definition. Its abstraction yields a fixpoint definition of the best variant function. By further abstraction of this best variant function, we derive the Floyd/Turing termination proof method as well as new static analysis methods to effectively compute approximations of this best variant function.

For (2), we introduce a generalization of the syntactic notion of structural induction (as found in Hoare logic) into a *semantic structural induction* based on the new semantic concept of *inductive trace cover* covering execution traces by *segments*, a new basis for formulating program properties. Its abstractions allow for generalized recursive proof, verification and static analysis methods by induction on both program structure, control, and data. Examples of particular instances include Floyd's handling of loop cut-points as well as nested loops, Burstall's intermittent assertion total correctness proof method, and Podelski-Rybalchenko transition invariants.

Denotational Semantics

- 1 - ABSTRACT -
Abstract interpretation of programs is shown to be a suitable means to statically analyse their weak or strong properties.

- Derivation of the partial function computed by a program,
(McCARTHY [1963a,b], SCOTT and STRACHEY [1971])

Hierarchy of semantics

• POPL 1992:

Inductive Definitions, Semantics and Abstract Interpretation*

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Abstract

We introduce and illustrate a *specification method* combining rule-based inductive definitions, well-founded induction principles, fixed-point theory and abstract interpretation for general use in computer science. Finite as well as infinite objects can be specified, at various levels of details related by abstraction. General proof principles are applicable to prove properties of the specified objects.

The specification method is illustrated by introducing G^{∞} SOS, a structured operational semantics generalizing Plotkin's [28] structured operational semantics (SOS) so as to describe the finite, as well as the infinite behaviors of programs in a uniform way and by constructively deriving inductive presentations of the other (relational, denotational, predicate transformers, ...) semantics from G^{∞} SOS by abstract interpretation.

Hierarchy of semantics

- TCS 2002:

Constructive Design of a Hierarchy of Semantics of a Transition System by Abstract Interpretation

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We construct a hierarchy of semantics by successive abstract interpretations. Starting from the maximal trace semantics of a transition system, we derive the big-step semantics, termination and nontermination semantics, Plotkin's natural, Smyth's demonic and Hoare's angelic relational semantics and equivalent nondeterministic denotational semantics (with alternative powerdomains to the Egli-Milner and Smyth constructions), D. Scott's deterministic denotational semantics, the generalized and Dijkstra's conservative/liberal predicate transformer semantics, the generalized/total and Hoare's partial correctness axiomatic semantics and the corresponding proof methods. All the semantics are presented in a uniform fixpoint form and the correspondences between these semantics are established through composable Galois connections, each semantics being formally calculated by abstract interpretation of a more concrete one using Kleene and/or Tarski fixpoint approximation transfer theorems.

Hierarchy of semantics

- Information and computation 2009:

Bi-inductive Structural Semantics^{*}

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Radhia Cousot

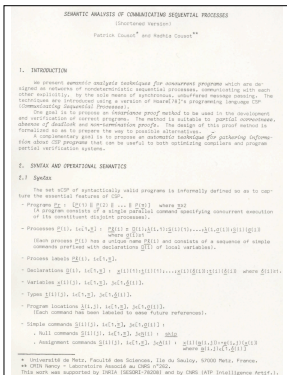
CNRS & École polytechnique, 91128 Palaiseau cedex, France

Abstract

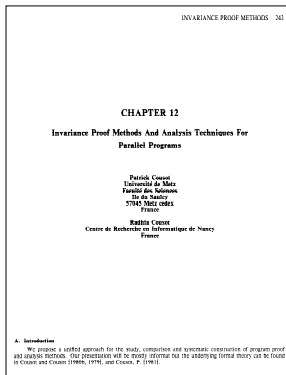
We propose a simple order-theoretic generalization, possibly non monotone, of set-theoretic inductive definitions. This generalization covers inductive, co-inductive and bi-inductive definitions and is preserved by abstraction. This allows structural operational semantics to describe simultaneously the finite/terminating and infinite/diverging behaviors of programs. This is illustrated on grammars and the structural bifinitary small/big-step trace/relational/operational semantics of the call-by-value λ -calculus (for which co-induction is shown to be inadequate).

Key words: fixpoint definition, inductive definition, co-inductive definition, bi-inductive definition, non-monotone definition, grammar, structural operational semantics, SOS, trace semantics, relational semantics, small-step semantics, big-step semantics, divergence semantics.

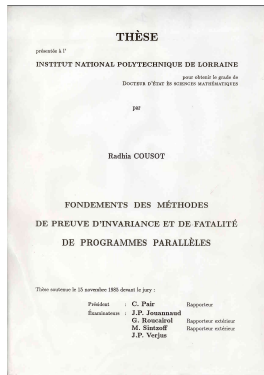
Parallelism



cited by 55



cited by 36



cited by 21



4.3.1.7 Dérivation de conditions de vérification correctes

Etant donné un principe d'induction correct et automatiquement complet

$$\exists I \in \mathcal{A}x. Co(I)$$

et une correspondance $\exists \varepsilon (A \varepsilon \rightarrow A_0)$ entre $\mathcal{A} \varepsilon$ et \mathcal{A}_0 , toute preuve

$$\exists I \varepsilon \in \mathcal{A}x. Co(I)$$

est telle que

$$Co \rightarrow Co_{\varepsilon}$$

est correcte. On peut donc choisir $Co[[P, P]]$ comme d'autre

$$Co[[S[P, A], A[P]], \exists I \varepsilon \in \mathcal{A}x, \varepsilon[[P, A]], \varepsilon[[P, A]], \forall [P, P]] \mid \exists I \varepsilon \in \mathcal{A}x, P]]$$

Par diverses manipulations algébriques on cherche à exprimer cette condition sous forme d'une conjonction de conditions plus simples correspondant chacune à une commande élémentaire du programme P . Des simplifications sont possibles puisque c'est une implication et non pas une égalité qui est requise. La méthode de preuve obtenue de cette manière est correcte par construction. Toutque le résultat soit valable non pas pour un programme P particulier mais pour le langage \mathcal{P} considéré il faut procéder par induction sur la syntaxe du langage.

Parallelism

- POPL 2017:

Ogre and Pythia: An Invariance Proof Method for Weak Consistency Models

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Abstract interpretation: Industrialization

Industrialization

- Very first industrial implementation:

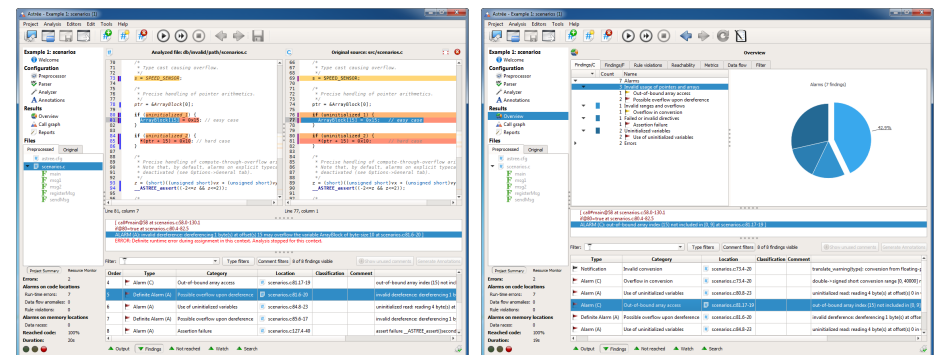
The **interval analysis** was implemented in the [AdaWorld compiler](#) for IBM PC 80286 by [J.D. Ichbiah](#) and his [Alsys SA corporation](#) team in 1980–87.

Warm welcome

- **Real-time software development companies:** we have to pay for this new option of the ADA compiler, but:
 - The machine code size is significantly reduced → we cannot sell as much memory as we did before;
 - Many bugs are found at compile time → we make less money with our debugging services.

AbsInt Angewandte Informatik GmbH

- Astrée sold by AbsInt:



Abstract interpretation based static analyzers

- [Ait](http://www.absint.com/ait/) www.absint.com/stackanalyzer from AbSint
- [Polyspace static analysis](http://www.mathworks.com/products/polyspace.html) www.mathworks.com/products/polyspace.html
- [Julia](http://www.juliasoft.com) (Java) www.juliasoft.com
- [Ikos](http://ti.arc.nasa.gov/opensource/ikos/), NASA ti.arc.nasa.gov/opensource/ikos/
- [Clousot](https://github.com/Microsoft/CodeContracts) for code contract, Microsoft, github.com/Microsoft/CodeContracts
- [Infer](http://fbinfer.com) (Facebook) <http://fbinfer.com>
- [Zoncolan](#) (Facebook)
- Google
- ...

Abstract interpretation: Prospective

The future is hard to predict

- From my thesis in 1978:

computer, economical and biological systems

Le concept de système dynamique discret est évidemment très général. Il s'applique aussi bien aux systèmes informatiques qu'économiques ou biologiques, à condition que le modèle du système étudié soit à évolution discrète dans le temps. En particulier, les systèmes dynamiques discrets sont des modèles des programmes aussi bien séquentiels que parallèles.

↑ sequential and parallel programs

The future is hard to predict

- From “30 years of Abstract Interpretation”:

<p>Programming</p> <ul style="list-style-type: none">- The evolution of programming languages and programming assistance systems has greatly helped to considerably speed up the development and scale up the size of conceivable programs- Software quality remains much far beyond, essentially because it is anti-economical- ... until the next catastrophe, evolution of the standards, revolution of the customers, or new laws holding computer scientists accountable for bugs <p><small>See Prentice, Jan. 9, 2008</small></p>	<p>Abstract interpretation</p> <ul style="list-style-type: none">- Beyond programming, abstraction is the only way to apprehend complex systems- Therefore, the scope of application of abstract interpretation ideas is large- Over 30 years, abstract interpretation theory, practice and achievements have grown despite trends and evanescent applications- Hopefully, abstract interpretation will continue to be useful in the future <p><small>See Prentice, Jan. 9, 2008</small></p>
<p>Formal methods</p> <ul style="list-style-type: none">- Formal methods might then become profitable at every stage of program design- The winners, if any, will definitely have to scale up, at a reasonable cost- Up to now, research has mainly concentrated on easy avenues with short-term rewards- Small groups cannot make it, large groups fail to share common interests- There is still a long long way to go <p><small>See Prentice, Jan. 9, 2008</small></p>	<p>THE END</p> <p>Many thanks to all of you who contributed to abstract interpretation!</p> <p><small>See Prentice, Jan. 9, 2008</small></p>

The future is hard to predict

- From the Dagstuhl Seminar “Formal Methods — Just a Euro-Science?” in December 2010:
 - More **properties**:
 - Security (not dynamically checkable)
 - ...
 - More **systems** and **tools**:
 - Parallel and distributed systems,
 - Cyber-physical (continuous+discrete)
 - Biological, financial, ...
 - Better **practices**:
 - Verification from design to implementation

Hopes (10 years)

- Complex data structures (libraries like for numerical domains)
- Program security
- Parallel & distributed systems, weak consistency models

Dreams (40 years)

1. The semantics is specified structurally and compositionally
2. The abstraction is specified by composition of Galois connections
POPL 2014:

A Galois Connection Calculus for Abstract Interpretation*

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3. The calculational design of the abstract interpreter is supported by libraries and tools
4. All modular and compositional

Dreams (40 years)

4. The design of static analyzers is computer-assisted by automatic composition of certified public-domain modules for:
 - Abstract domains
 - Syntax and semantics to fixpoint equations
 - Parallel/distributed fixpoint solvers (direct or with convergence acceleration)
 - User-interface automatic design
 - Automatic fixing of errors

The End