

Verifying properties of functional programs using modal extensions of linear logic

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(partly joint with Melliès)

FOCUS Team – INRIA & University of Bologna

Présentation à l'équipe LIRICA
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Emplois

Jan 2016 –	Postdoc INRIA Bologne
2e sem 2015	Research Assistant Dundee
2012-2015	Doctorant Moniteur PPS & LIAFA, Paris 7
2008-2012	Fonctionnaire Stagiaire ENS Cachan

Formation

M2 Informatique Théorique
MPRI

M2 Mathématiques
Fondamentales, Paris 6

Mobilité

Bologne (20 mois)

Dundee (5 mois)

Oxford (3 + 1 mois)

Turku (3 mois)

Thèmes étudiés en lien avec l'équipe

- **Logique**
 - ▶ connaissances de base en **théorie de la preuve** (calcul des séquents, élimination des coupures, un peu de méthode des tableaux...)
 - ▶ en particulier **logique linéaire** et ses sémantiques (dénotationnelles, modèles de jeux...)
 - ▶ aussi, **preuves circulaires**
- **Logique et automates** (MSO, μ -calcul modal, automates à parité...)
- **Théorie des catégories**, notamment en lien avec la sémantique
- Actuellement : **programmation probabiliste** et liens avec l'IA (machine learning)

Aujourd'hui : on va parler de logique (linéaire, modale) et automates.

Functional programs, Higher-order models

Imperative vs. functional programs

- **Imperative** programs: built on **finite state machines** (like Turing machines).

Notion of **state**, **global memory**.

- **Functional** programs: built on functions that are composed together (like in Lambda-calculus).

No state (except in impure languages), **higher-order**: functions can manipulate functions.

(recall that Turing machines and λ -terms are equivalent in expressive power)

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Example: imperative factorial

```
int fact(int n) {  
    int res = 1;  
    for i from 1 to n do {  
        res = res * i;  
    }  
}  
return res;  
}
```

Typical way of doing: using a **variable** (change the state).

Example: functional factorial

In OCaml:

```
let rec factorial n =  
  if n <= 1 then  
    1  
  else  
    factorial (n-1) * n;;
```

Typical way of doing: using a **recursive function** (don't change the state).

In practice, **forbidding global variables** reduces considerably the number of bugs, especially in a parallel setting (cf. Erlang).

Advantages of functional programs

- **Very mathematical**: calculus of functions.
- ... and thus very much studied from a mathematical point of view. This notably leads to **strong typing**, a marvellous feature.
- Much **less error-prone**: no manipulation of global state.

More and more used, from Haskell and Caml to Scala, Javascript and even Java 8 nowadays.

Also emerging for **probabilistic programming**.

Price to pay: **analysis of higher-order constructs**.

Advantages of functional programs

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Example of higher-order function: `map`.

`map φ [0, 1, 2]` returns `[$\varphi(0)$, $\varphi(1)$, $\varphi(2)$]`.

Higher-order: `map` is a function taking a function φ as input.

Semantics of linear logic and higher-order model-checking

Linear logic: a logical system with an emphasis on the notion of *resource*.

Model-checking: a key technique in *verification* — where we want to determine *automatically* whether a program satisfies a specification.

My thesis: linear logic and its semantics can be enriched to obtain new and cleaner proofs of decidability in higher-order model-checking.

What is model-checking?

The halting problem

A natural question: does a program always **terminate**?

Undecidable problem (Turing 1936): a machine can not always determine the answer.

What if we use approximations?

Model-checking

Approximate the program \longrightarrow build a **model** \mathcal{M} .

Then, formulate a **logical specification** φ over the model.

Aim: design a **program** which checks whether

$$\mathcal{M} \models \varphi.$$

That is, whether the model \mathcal{M} meets the specification φ .

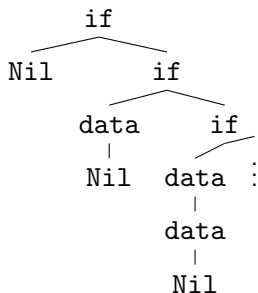
An example

```
    Main    = Listen Nil
Listen x   = if end_signal() then x
            else Listen received_data() :: x
```

An example

```
Main      = Listen Nil
Listen x  = if end_signal() then x
           else Listen received_data():x
```

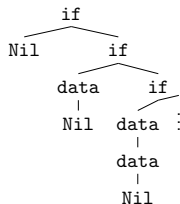
A **tree** model:



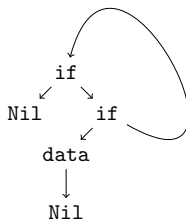
We abstracted **conditionals** and **datatypes**.

The approximation contains a non-terminating branch.

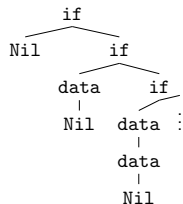
Finite representations of infinite trees



is not **regular**: it is not the unfolding of a **finite** graph as



Finite representations of infinite trees



but it is represented by a **higher-order recursion scheme** (HORS).

Modeling functional programs using higher-order recursion schemes

Higher-order recursion schemes

$$\mathcal{G} = \begin{cases} S & = L \text{ Nil} \\ L x & = \text{if } x (L (\text{data } x)) \end{cases}$$

Rewriting starts from the **start symbol** S:

$$S \quad \rightarrow_{\mathcal{G}} \quad \begin{array}{c} L \\ | \\ \text{Nil} \end{array}$$

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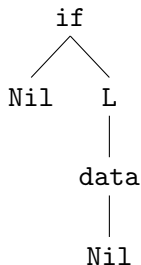
L
|
Nil

$\rightarrow_{\mathcal{G}}$

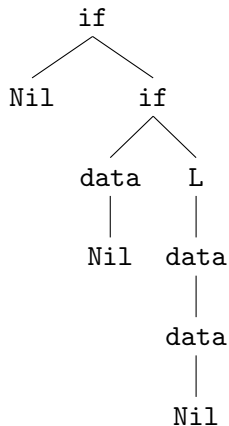
if
/ \
Nil L
|
data
|
Nil

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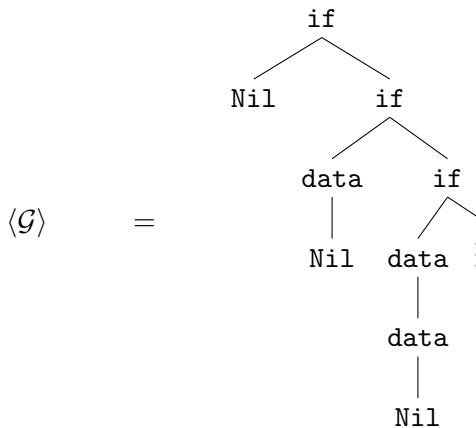


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HORS can alternatively be seen as **simply-typed** λ -terms with

simply-typed recursion operators $Y_\sigma : (\sigma \rightarrow \sigma) \rightarrow \sigma$.

Alternating parity tree automata

Checking specifications over trees

Monadic second order logic

MSO is a common logic in verification, allowing to express properties as:

“ all executions halt ”

“ a given operation is executed infinitely often in some execution ”

“ every time data is added to a buffer, it is eventually processed ”

It is also equivalent to **modal μ -calculus** over trees.

Alternating parity tree automata

Checking whether a formula holds can be performed using an **automaton**.

For an MSO formula φ , there exists an equivalent APT \mathcal{A}_φ s.t.

$$\langle \mathcal{G} \rangle \models \varphi \quad \text{iff} \quad \mathcal{A}_\varphi \text{ has a run over } \langle \mathcal{G} \rangle.$$

APT = **alternating** tree automata (ATA) + **parity** condition.

Alternating tree automata

ATA: **non-deterministic** tree automata whose transitions may **duplicate** or **drop** a subtree.

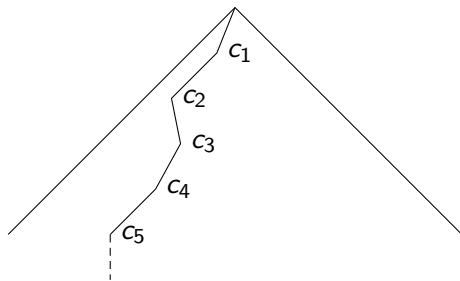
Typically: $\delta(q_0, \text{if}) = (2, q_0) \wedge (2, q_1)$.

Alternating parity tree automata

Each state of an APT is attributed a **color**

$$\Omega(q) \in Col \subseteq \mathbb{N}$$

An infinite branch of a run-tree is **winning** iff the **maximal color among the ones occurring infinitely often along it is even**.



Alternating parity tree automata

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A run-tree is **winning** iff all its infinite branches are.

For a MSO formula φ :

\mathcal{A}_φ has a **winning** run-tree over $\langle \mathcal{G} \rangle$ iff $\langle \mathcal{G} \rangle \models \varphi$.

The higher-order model-checking problem (★)

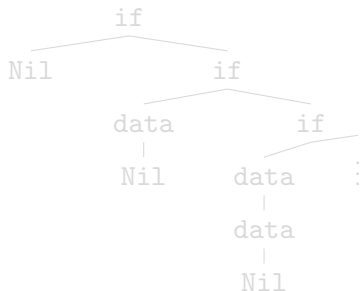
(★) : there are three but we present just one here

The (local) HOMC problem

Input: HORS \mathcal{G} , formula φ .

Output: true if and only if $\langle \mathcal{G} \rangle \models \varphi$.

Example: $\varphi =$ “ there is an infinite execution ”



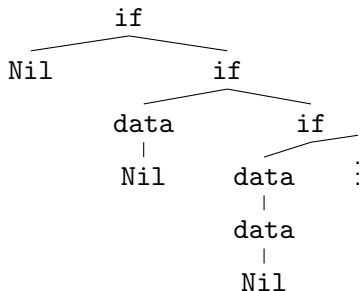
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Recognition by homomorphism

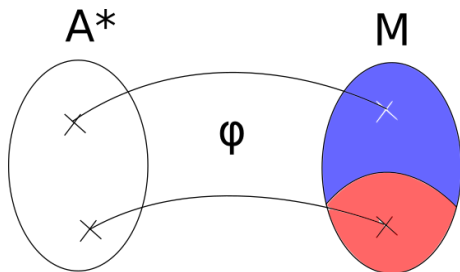
Where semantics comes into play

Automata and recognition

For the usual **finite** automata on **words**: given a **regular** language $L \subseteq A^*$,

there exists a finite **automaton** \mathcal{A} recognizing L

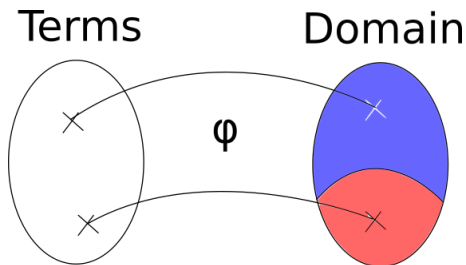
if and only if...



there exists a finite **monoid** M , a subset $K \subseteq M$
and a **homomorphism** $\varphi : A^* \rightarrow M$ such that $L = \varphi^{-1}(K)$.

Automata and recognition

The picture we want:



(after Aehlig 2006, Salvati 2009)

but with **recursion** and w.r.t. an APT.

Intersection types and alternation

A first connection with linear logic

Alternating tree automata and intersection types

A key remark (Kobayashi 2009):

$$\delta(q_0, \text{if}) = (2, q_0) \wedge (2, q_1)$$

can be seen as the intersection typing

$$\text{if} : \emptyset \rightarrow (q_0 \wedge q_1) \rightarrow q_0$$

refining the simple typing

$$\text{if} : o \rightarrow o \rightarrow o$$

Alternating tree automata and intersection types

In a derivation typing the tree $\text{if } T_1 \ T_2 :$

$$\begin{array}{c} \delta \\ \text{App} \frac{\frac{\frac{}{\emptyset \vdash \text{if} : \emptyset \rightarrow (q_0 \wedge q_1) \rightarrow q_0}}{\emptyset \vdash \text{if } T_1 : (q_0 \wedge q_1) \rightarrow q_0}}{\emptyset \vdash \text{if } T_1 \ T_2 : q_0} \quad \emptyset \quad \frac{\vdots}{\emptyset \vdash T_2 : q_0} \quad \frac{\vdots}{\emptyset \vdash T_2 : q_1} \end{array}$$

Intersection types naturally lift to higher-order – and thus to \mathcal{G} , which **finitely** represents $\langle \mathcal{G} \rangle$.

Theorem (Kobayashi 2009)

$\vdash \mathcal{G} : q_0$ *iff* *the ATA \mathcal{A}_φ has a run-tree over $\langle \mathcal{G} \rangle$.*

A closer look at the Application rule

In the intersection type system:

$$\text{App} \quad \frac{\Delta \vdash t : (\theta_1 \wedge \dots \wedge \theta_n) \rightarrow \theta \quad \Delta_i \vdash u : \theta_i}{\Delta, \Delta_1, \dots, \Delta_n \vdash t u : \theta}$$

This rule could be decomposed as:

$$\frac{\Delta \vdash t : (\bigwedge_{i=1}^n \theta_i) \rightarrow \theta' \quad \frac{\Delta_i \vdash u : \theta_i \quad \forall i \in \{1, \dots, n\}}{\Delta_1, \dots, \Delta_n \vdash u : \bigwedge_{i=1}^n \theta_i}}{\Delta, \Delta_1, \dots, \Delta_n \vdash t u : \theta'} \quad \text{Right } \wedge$$

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Right \wedge

Linear decomposition of the intuitionistic arrow:

$$A \Rightarrow B = !A \multimap B$$

Two steps: **duplication** / **erasure**, then **linear use**.

Right \wedge corresponds to the **Promotion** rule of indexed linear logic.
(see G.-Melliès, ITRS 2014)

Intersection types and semantics of linear logic

$$A \Rightarrow B = !A \multimap B$$

Two interpretations of the exponential modality:

Qualitative models
(Scott semantics)

$$!A = \mathcal{P}_{fin}(A)$$

$$\llbracket o \Rightarrow o \rrbracket = \mathcal{P}_{fin}(Q) \times Q$$

$$\{q_0, q_0, q_1\} = \{q_0, q_1\}$$

Order closure

Quantitative models
(Relational semantics)

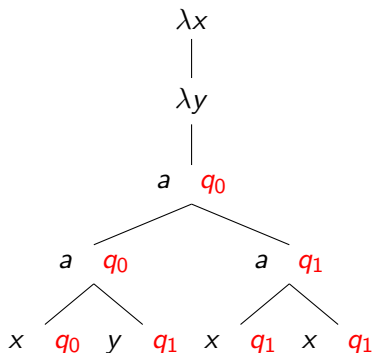
$$!A = \mathcal{M}_{fin}(A)$$

$$\llbracket o \Rightarrow o \rrbracket = \mathcal{M}_{fin}(Q) \times Q$$

$$[q_0, q_0, q_1] \neq [q_0, q_1]$$

Unbounded multiplicities

An example of interpretation



In *Rel*, one denotation:

$([q_0, q_1, q_1], [q_1], q_0)$

In *ScottL*, a **set** containing the principal type

$(\{q_0, q_1\}, \{q_1\}, q_0)$

but also

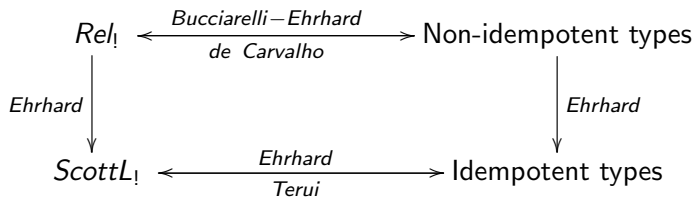
$(\{q_0, q_1, q_2\}, \{q_1\}, q_0)$

and

$(\{q_0, q_1\}, \{q_0, q_1\}, q_0)$

and ...

Intersection types and semantics of linear logic



Let t be a term normalizing to a tree $\langle t \rangle$ and \mathcal{A} be an alternating automaton.

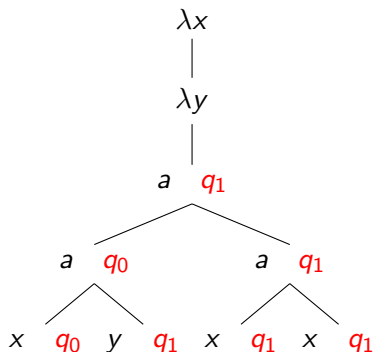
$$\mathcal{A} \text{ accepts } \langle t \rangle \text{ from } q \Leftrightarrow q \in \llbracket t \rrbracket \Leftrightarrow \emptyset \vdash t : q :: o$$

Extension with recursion and parity condition?

Adding parity conditions to the type system

An example of colored intersection type

Set $\Omega(q_0) = 0$ and $\Omega(q_1) = 1$.



has now type

$$\boxed{0} q_0 \wedge \boxed{1} q_1 \rightarrow \boxed{1} q_1 \rightarrow q_1$$

Note the color 0 on q_0 ...

A type-system for verification

We devise a type system capturing all MSO:

Theorem (G.-Melliès 2014, from Kobayashi-Ong 2009)

$S : q_0 \vdash S : q_0$ admits a winning typing derivation iff the alternating *parity* automaton \mathcal{A} has a winning run-tree over $\langle \mathcal{G} \rangle$.

We obtain **decidability** by considering **idempotent** types.

Our reformulation

- shows the **modal** nature of \Box (in the sense of S4),
- **internalizes** the parity condition,
- paves the way for **semantic constructions**.

Colored semantics

We extend:

- *Rel* with **countable** multiplicities, **coloring** and an **inductive-coinductive** fixpoint
- *ScottL* with **coloring** and an **inductive-coinductive** fixpoint.

Methodology: think in the relational semantics, and adapt to the Scott semantics using Ehrhard's 2012 result:

the **finitary** model *ScottL* is the extensional collapse of *Rel*.

Finitary semantics

In ScottL, we define \Box , λ and \mathbf{Y} using downward-closures.
 ScottL_\downarrow is a model of the $\lambda\mathbf{Y}$ -calculus.

Theorem

An APT \mathcal{A} has a winning run from q_0 over $\langle \mathcal{G} \rangle$ if and only if

$$q_0 \in \llbracket \lambda(\mathcal{G}) \rrbracket.$$

Corollary

The local higher-order model-checking problem is decidable (and is n -EXPTIME complete).

Similar model-theoretic results were obtained by Salvati and Walukiewicz the same year.

Conclusion

J'ai également travaillé :

- en **combinatoire des mots** (stage de L3)
- en **algèbre universelle** (mémoire de M2 maths)
- sur la **terminaison des programmes fonctionnels probabilistes** (postdoc à Bologne)

Projet de recherche :

- **model-checking d'ordre supérieur** : aller vers une compréhension logique plus poussée (lien avec les preuves circulaires, les travaux de Luigi Santocanale, de Baelde-Doumane-Saurin...)
- **terminaison probabiliste** : finir mes travaux avec Ugo Dal Lago et essayer d'aller un peu plus loin
- **logiques pour l'IA** (logiques modales non-normales, modalités probabilistes, quantificateurs non-standards) avec Nicola Olivetti
- **je suis ouvert à d'autres collaborations avec LIRICA !**