

Tree automata and logical models

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Model-checking higher-order programs

A well-known approach in verification: **model-checking**.

- Construct a **model** of a program
- Specify a property in an appropriate **logic**
- Make them **interact** in order to determine whether the program satisfies the property.

Interaction is often realized by translating the formula into an equivalent **automaton**, which then runs over the model.

A very naive model-checking problem

Consider the most naive possible model-checking problem where:

- **Actions** of the program are modelled by a **finite word**
- The **property** to check corresponds to a **finite automaton**

Automata and recognition

Recall that, given a 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** $\phi : A^* \rightarrow M$ such that $L = \phi^{-1}(K)$.

Roughly speaking: there exists a **finite algebraic structure** in which the language is **interpreted**

Note that the interpretation depends on the choice of \mathcal{A} . However, the problem can be reformulated in order to remove this dependency.

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Now the model-checking problem can be solved by:

- computing the **interpretation** of a word
- and check whether it **belongs** to M

A more elaborate problem: what about **ultimately periodic words** and **Büchi automata** ?

We would need some model **extending the monoid's behaviour** with some notion of **recursion** (for periodicity) which would model the Büchi condition.

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Model-checking higher-order programs

This work is concerned with the verification of **higher-order functional programs**, as Java for instance.

They will be modelled by **recursion schemes**, generating **trees** describing all the potential behaviours of a program.

Properties will be expressed in **MSO** or **modal μ -calculus** (equi-expressive over trees).

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Model-checking higher-order programs

This model-checking problem is **decidable**:

- Ong 2006 (game semantics)
- Hague-Murawski-Ong-Serre 2008 (game semantics, higher-order pushdown automata)
- Kobayashi-Ong 2009 (intersection types)
- current work of Salvati and Walukiewicz (interpretation in finite models)
- ...

Our aim is to **deepen the semantic understanding** we have of this result, using existing relations between **alternating automata**, **intersection types**, **(linear) logic** and its **models**.

Model-checking higher-order programs

Is it possible to extend to this situation the setting for finite automata ?

We would like to interpret the tree of behaviours in an algebraic structure, so that

acceptance by the automata

would reduce to

checking whether some element belongs to the semantics

of the tree.

Higher-order recursion schemes

Idea: it is a kind of grammar whose parameters may be functions and which generates trees.

Alternatively, it is a formalism equivalent to λ calculus with recursion and uninterpreted constants from a ranked alphabet Σ .

A very simple functional program

```
    Main    =    Listen Nil
Listen x   =    if end then x else Listen (data x)
```

With a recursion scheme we can model this program and produce its **tree of behaviours**.

Note that constants are not interpreted: in particular, a recursion scheme does not evaluate a boolean conditional if ... then ... else ...

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formulated as a recursion scheme:

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    S      =    L Nil
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or, in λ -calculus style :

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(this latter representation is a **regular grammar** – equivalently, a **λY -term**)

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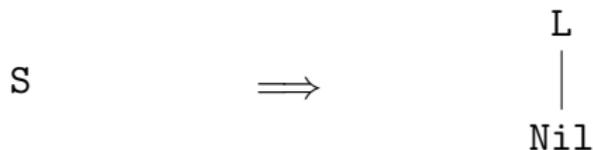
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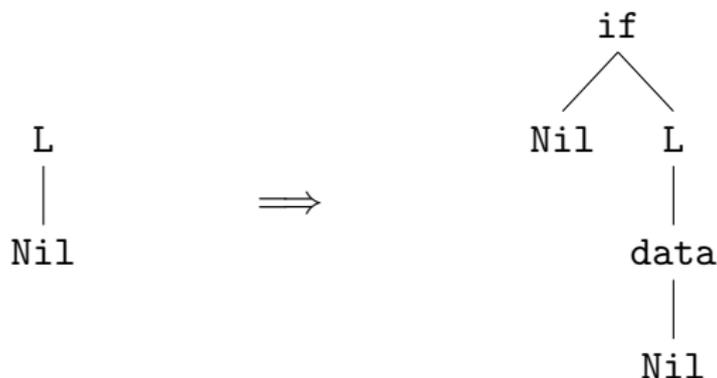
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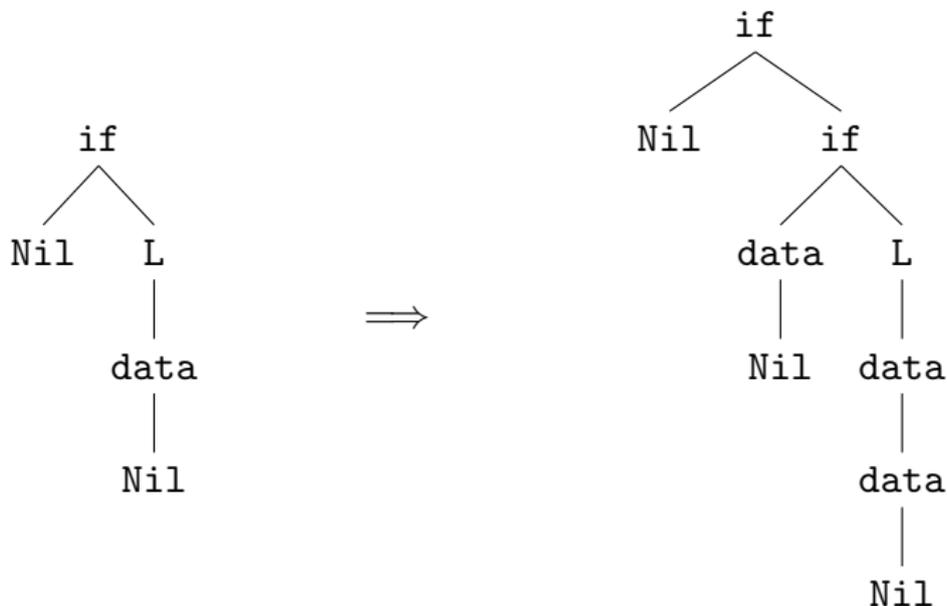


Notice that **substitution and expansion occur in one same step.**

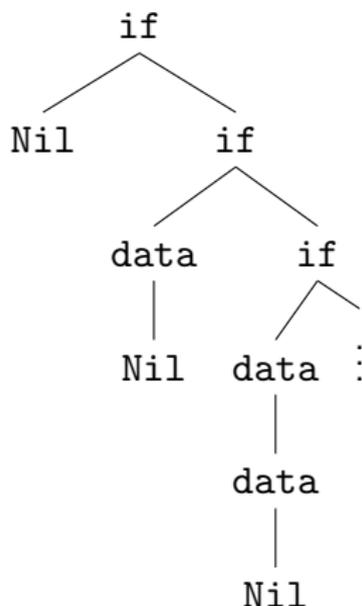
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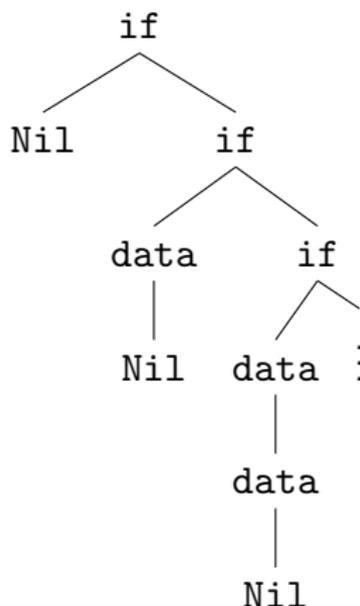


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Very simple program, yet it produces a tree which is **not regular**...

Representation of recursion schemes

The only **finite** representation of such a tree is actually **the scheme** itself.

This suggests that we should interpret **the scheme** (in fact, the associated λ -term) in an algebraic structure suitable for **higher-order interpretations**: some **logical model**.

Alternating parity tree automata

Modal μ -calculus is an extension of boolean logic over a branching structure, with fixpoints and quantifications over the successors of the current position.

It allows to **unravel** some formula over the structure. This can be encoded into an **alternating parity tree automata** (APT).

Its states are the subformulas of the encoded formula.

Alternating parity tree automata

APT are non-deterministic tree automata whose transitions may **duplicate** or **drop** a subtree.

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

This is reminiscent of the exponential modality of linear logic

This motivates the use of suitable **models of linear logic** for interpreting schemes.

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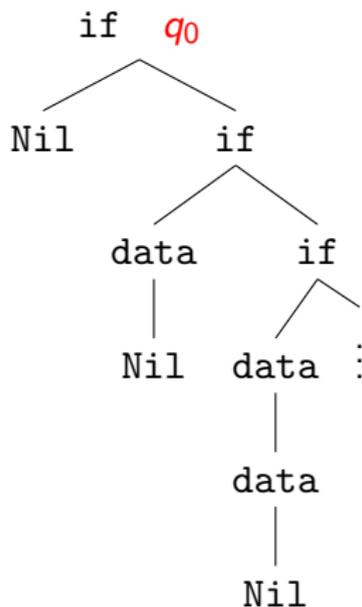
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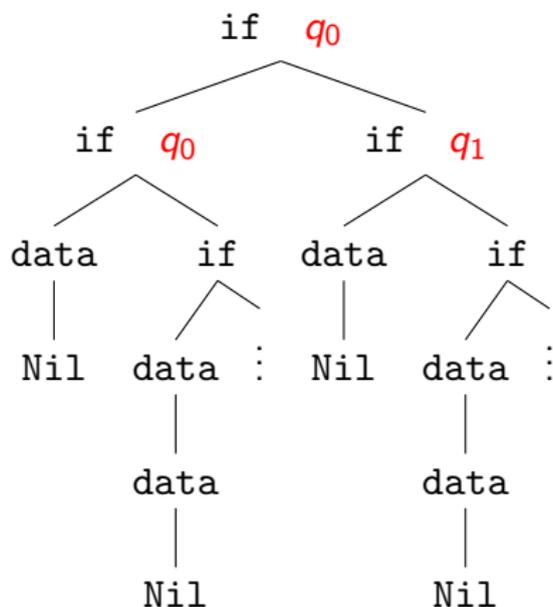
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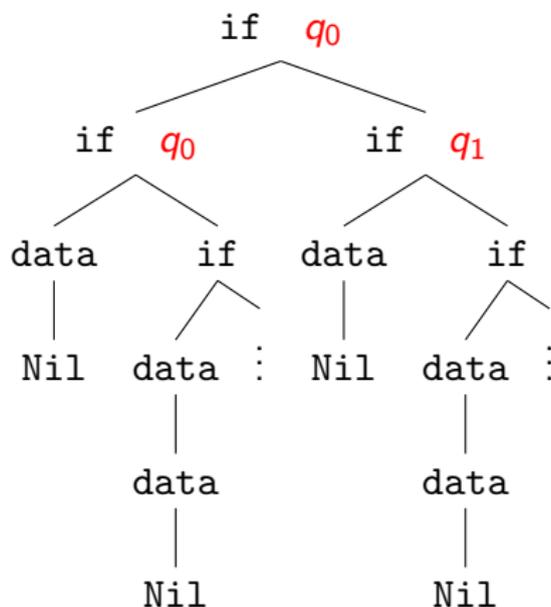
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may be understood as a refinement of the simple typing

$$a : \perp \rightarrow \perp \rightarrow \perp$$

with intersection types:

$$a : (q_0 \wedge q_1) \rightarrow q_2 \rightarrow q :: \perp \rightarrow \perp \rightarrow \perp$$

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Linear decomposition of the intuitionistic arrow

In linear logic, the intuitionistic arrow $A \Rightarrow B$ factors as

$$!A \multimap B$$

whose interpretation in this relational model is

$$\mathcal{M}_{fin}(\llbracket A \rrbracket) \times \llbracket B \rrbracket$$

In other words, it is some collection (with multiplicities) of elements of $\llbracket A \rrbracket$ producing an element of $\llbracket B \rrbracket$.

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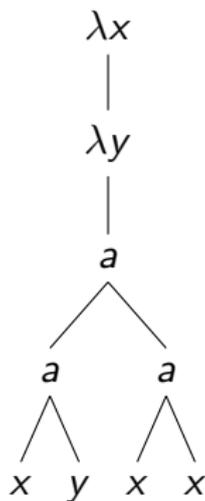
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An example of interpretation

Consider the rule

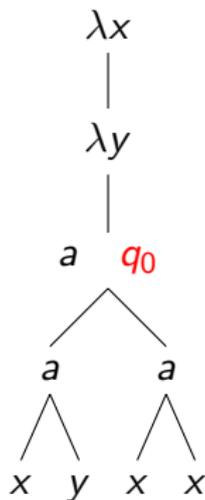
$$F x y = a (a x y) (a x x)$$

which corresponds to



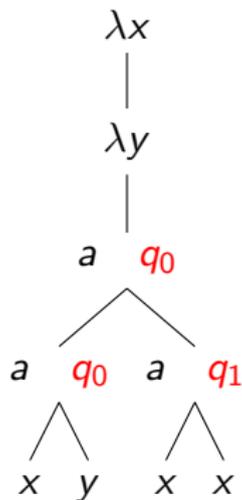
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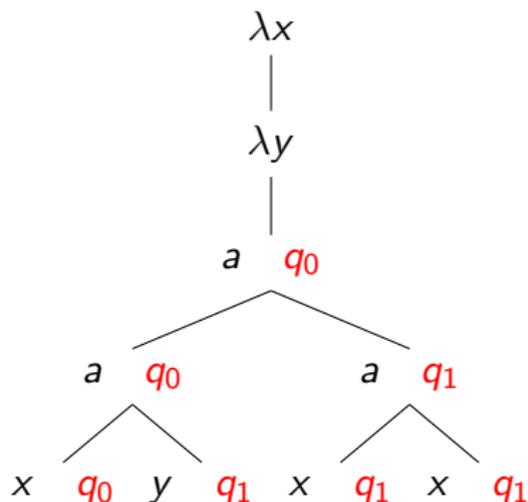


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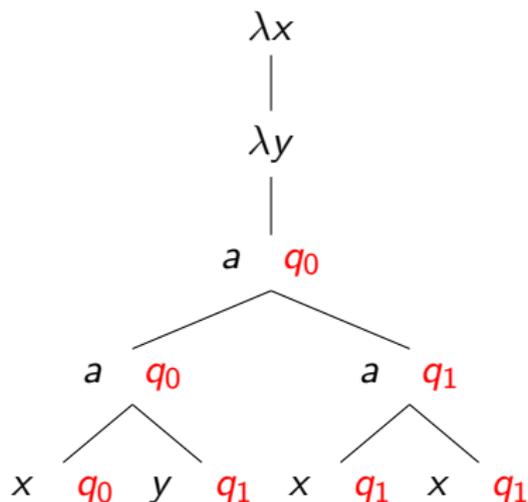
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Relational interpretation and automata acceptance

Theorem (G.-Melliès 2014)

Consider an alternating tree automaton \mathcal{A} and a scheme \mathcal{G} producing a tree T .

Then \mathcal{A} has a run-tree over T if and only if

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Note that the interpretation of \mathcal{G} depends of the choice of \mathcal{A} .
This dependence can be removed by reformulating the problem.

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Elements of proof

The proof relies on the equivalence of

run-trees and intersection typings

by Kobayashi, and of

intersection typings and (some) relational interpretations

by Grellois and Melliès (which uses a logical correspondence of Bucciarelli and Ehrhard).

Higher-order model checking

Two major issues of the model-checking problem were not adressed so far:

- recursion
- and parity conditions

Recursion can be added to the models and typings in the usual (coinductive) way.

Parity is more challenging.

Parity conditions

To capture all MSO, the alternating automaton needs to check whether it iterated **finitely** the properties whose infinite recursion was forbidden.

This is done *a posteriori*, by discriminating run-trees.

States are now **coloured** by a function $\Omega : Q \rightarrow \mathbb{N}$.

- A branch of a run-tree is **winning** if it is finite or if, among the colours it contains infinitely often, the greatest is **even**.
- A run-tree is **winning** if and only if all its branches are.

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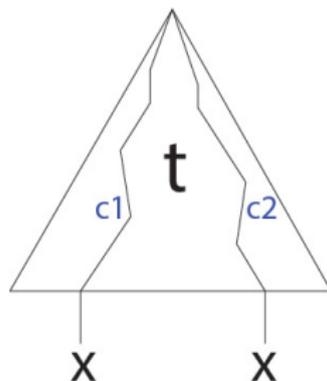
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Kobayashi and Ong extended the **typing** with a **colouring operation**:

$$a : (\emptyset \rightarrow \square_{c_2} q_2 \rightarrow q_0) \wedge ((\square_{c_1} q_1 \wedge \square_{c_2} q_2) \rightarrow \square_{c_0} q_0 \rightarrow q_0)$$

This operation lifts to higher-order.



In this setting, t will have some type $\square_{c_1} \sigma_1 \wedge \square_{c_2} \sigma_2 \rightarrow \tau$.

Parity conditions

We investigated the **semantic nature** of \square , and proved that it has good properties.

It can be **added to the model**, and there is a very natural **coloured interpretation of types**:

$$\llbracket A \Rightarrow B \rrbracket = \mathcal{M}_{fin}(Col \times \llbracket A \rrbracket) \times \llbracket B \rrbracket$$

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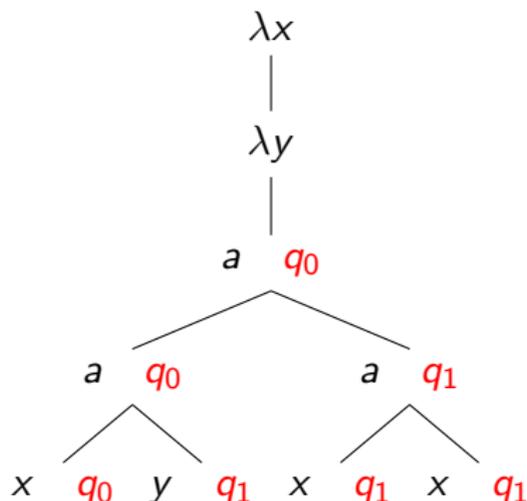
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An example of coloured interpretation

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

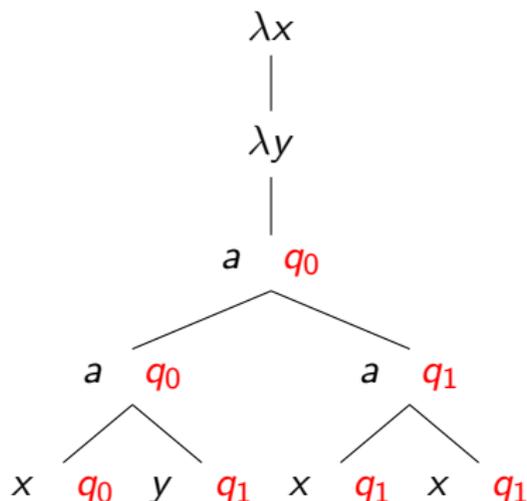


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Parity conditions and typing derivations

There are two crucial points:

- this can still be formulated **equivalently** in typing derivations
- the colouring of branches is **preserved by the rewriting dynamics of the scheme**

So we can decide **directly from a typing of the scheme's rules** whether the tree it produces will be accepted.

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The typing derivations are now of **infinite depth**.

We introduce the notion of **winning derivation** by setting the usual parity condition over typing trees.

Theorem (G.-Melliès 2014)

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*Then \mathcal{A} has a run-tree over T if and only if there exists a **winning typing tree** of*

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Connection with the coloured relational model

In order to obtain the corresponding model-theoretic version of this theorem, we need to **add an appropriate fixpoint** to the model.

In some sense, this fixpoint operator **composes** elements of the interpretation of a term in all possible ways which satisfy the parity condition.

This leads to an **extension of the theorem** to the coloured model-theoretic case.

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A last remark: extensional collapse and decidability

Ehrhard proved in 2012 a correspondence between the relational model we studied, and another model where **multisets** are replaced with **sets**.

We can extend this correspondence to the relational model proposed in this talk, so that all interpretations are taken in a **finite** model.

In other terms: the higher-order model-checking problem is **decidable**, again.

Conclusions and perspectives

- **Terms** can be **interpreted** in models **reflecting the behaviour** of APT.
- Model-checking reduces to **computing the interpretation of a scheme**, and checking whether it contains the initial state.
- This approach is equivalent to a **type-theoretic** one.
- Results of **extensional collapse** lead - again - to **decidability**.
- There is still a lot to do: axiomatize this extension of "recognition by monoid", develop a notion of **game semantics with parity**, extend the approach to other models of tree automata. . .

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