

# A semantic study of higher-order model-checking

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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.

Need to balance expressivity vs. complexity in the choice of the model and of the logic.

# Prologue: finite automata theory

# 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**

# A very naive model-checking problem

A word of actions :

$$\textit{open} \cdot (\textit{read} \cdot \textit{write})^2 \cdot \textit{close}$$

A property to check: is every *read* immediately followed by a *write* ?

Corresponds to an automaton with two states:  $Q = \{q_0, q_1\}$ .

$q_0$  is both initial and final.

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# A type-theoretic intuition

The **transition function** may be seen as a **typing** of the letters of the word, seen as function symbols.

For example,

$$\delta(q_0, read) = q_1$$

corresponds to the typing

$$read : q_1 \rightarrow q_0$$

Note that **the order is reversed**.

The idea is that the **type of a word** is a state from which the word is accepted.



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# 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  $L = \phi^{-1}(K)$ .

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Now the model-checking problem can be solved by:

- computing the **interpretation** of a word (its **denotation**)
- and check whether it **belongs** to  $M$

This is reminiscent of **interpretations in logical models** – which would allow to model-check **terms** as well.

**Typings and interpretations.** A choice for  $M$  is the one of the **transition monoid** of the automata. Note that it can be computed from the data of all constructors' types.

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# A very naive model-checking problem

In this talk, we **explore these ideas of typing and of interpretation in logical models**, in a more general case than the one of finite words and of finite automata.

# A very naive model-checking problem

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.

Alternatively, we can do this **syntactically over type derivations**: we get infinite-depth derivations, over which we can check whether a final state occurs infinitely.

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# Higher-order model-checking

# Model-checking higher-order programs

This work is concerned with the verification of **higher-order functional programs** (Haskell, OCaml, Scala, Python, Javascript, C++).

A function may take a function as input.

Examples: the `map` function, or `compose`  $\phi x = \phi(\phi(x))$

A model for such programs is **higher-order recursion schemes** (HORS), generating **trees** describing all the potential behaviours of a program.

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

Their automata counterpart is given by **alternating parity automata** (APT).

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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 + collapsible higher-order pushdown automata)
- Kobayashi-Ong 2009 (intersection types)
- Salvati-Walukiewicz 2011 (interpretation with Krivine machines)
- Carayol-Serre 2012 (collapsible higher-order pushdown automata)
- Tsukada-Ong 2014 (game semantics)
- Salvati-Walukiewicz 2015 (interpretation in finite models)
- Grellois-Melliès 2015

Our aim was to **deepen the semantic understanding** we have of this result, using existing relations between **alternating automata**, **intersection types**, **(linear) logic** and its **models** – game-based as well as denotational.



# Model-checking higher-order programs

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

We would like to interpret the recursion scheme in an algebraic structure, so that

acceptance by the automata

of the tree of behaviours it generates would reduce to

checking whether some element belongs to the semantics

of the term.

Or, using an associated type system, to

check whether the term has an appropriate type.

# Higher-order recursion schemes

# Higher-order recursion schemes

**Idea:** it is a kind of **grammar whose parameters may be functions** and which **generates ranked trees** labelled by elements of a ranked alphabet  $\Sigma$ .

Alternatively, it is a formalism equivalent to  $\lambda Y$  calculus with uninterpreted constants of order at most one.

# 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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or, in  $\lambda$ -calculus style :

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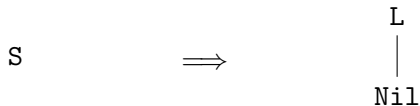
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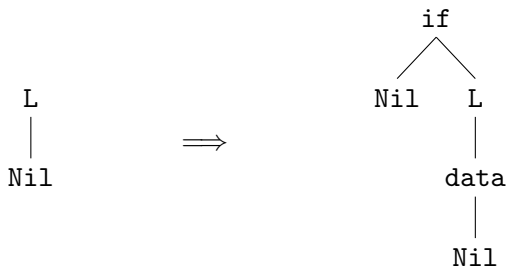
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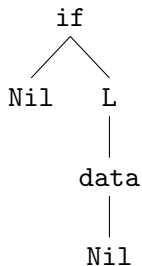


Notice that **substitution and expansion occur in one same step.**

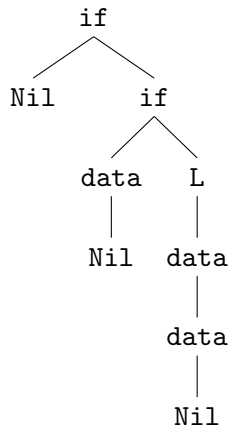
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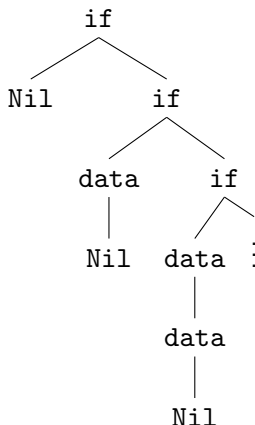
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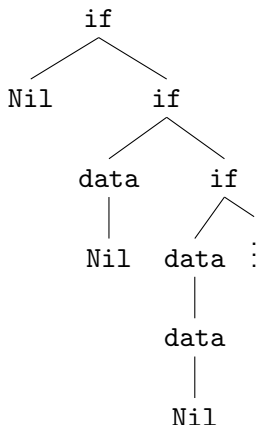


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# Representation of recursion schemes

The only **finite** representation of such a tree is actually **the scheme** itself — even for this very simple, order-1 recursion scheme.

This suggests that we should interpret **the associated  $\lambda Y$ -term** in an algebraic structure suitable for **higher-order interpretations**: a **logical model** (a domain).

# Recursion schemes and models of the $\lambda Y$ -calculus

Note that a recursion scheme may be translated to a  $\lambda$ -term with a recursion operator  $Y$ , and conversely (for appropriate terms).

**Important consequence:** recursion schemes can be interpreted in models of the  $\lambda Y$ -calculus — that is, **models of the  $\lambda$ -calculus together with a recursion operator**.



# Logical specification

# Alternating parity tree automata

Over trees we may use several logics: CTL, MSO,...

We focus on MSO, which is equivalent to modal  $\mu$ -calculus over trees. Its automata companion model is **alternating parity tree automata** (APT).

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

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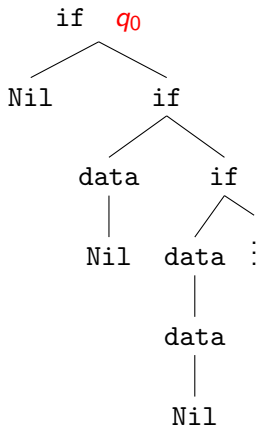
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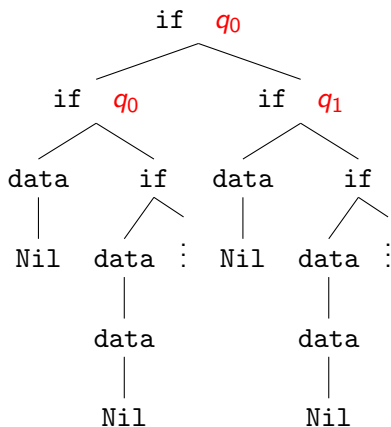
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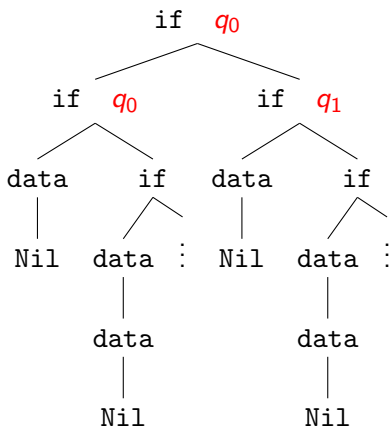
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# Alternation and intersection types

# Alternating parity tree automata and intersection types

A key remark (Kobayashi 2009): if  $\delta(q, a) = (1, q_0) \wedge (1, q_1) \wedge (2, q_2) \dots$

then we may consider that  $a$  has a refined intersection type

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This remark is very important, because unlike automata, **typing lifts to higher-order**.

So we may **type** a recursion scheme with the states of an automaton to verify if the property it expresses is satisfied.

**Very important consequence:** remember even very simple program models can be not regular. But schemes always are **finite** — and most of the time rather small.

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# A type-system for verification: without colours

$$\text{Axiom} \quad \frac{}{x : \bigwedge_{\{i\}} \theta_i :: \kappa \vdash x : \theta_i :: \kappa}$$

$$\delta \quad \frac{\{(i, q_{ij}) \mid 1 \leq i \leq n, 1 \leq j \leq k_i\} \text{ satisfies } \delta_A(q, a)}{\emptyset \vdash a : \bigwedge_{j=1}^{k_1} q_{1j} \rightarrow \dots \rightarrow \bigwedge_{j=1}^{k_n} q_{nj} \rightarrow q :: \perp \rightarrow \dots \rightarrow \perp}$$

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In this type system, there is a proof of

$$S : \bigwedge q_0 :: o \vdash S : q_0 :: o$$

if and only if the alternating automaton has a run-tree over  $\llbracket \mathcal{G} \rrbracket$ .

Note that these intersection types are **idempotent**:

$$q_0 \wedge q_0 = q_0$$

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Moreover, for some appropriate intersection type systems, **derivations** may be understood via **game semantics** as the construction of **denotations** in associated **models of linear logic**.

# Linear models of the $\lambda$ -calculus

# Linear decomposition of the intuitionistic arrow

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

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

In other terms, in a model of linear logic, a program of type  $A \Rightarrow B$  is interpreted as a **replication** of its inputs, followed by a **linear** use of them.

Note that, given a categorical model of linear logic (with a suitable interpretation of  $!$ ), considering only morphisms

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# Linear decomposition of the intuitionistic arrow

With a “suitable interpretation” of ! comes an **identity morphism**

$$!A \multimap A$$

which uses an element of  $A$  once, and outputs it, and a **comultiplication** morphism used to define compositions:

$$!A \xrightarrow{\text{comult}} !!A \xrightarrow{!f} !B \xrightarrow{g} C$$



# Models of linear logic

We would typically like to understand the refined intersection typing

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

as the fact that

$$(\{q_0, q_1\}, \{q_2\}, q) \in \llbracket a \rrbracket$$

However, **set-based** interpretations of the exponential lead to **complicated** models of linear logic.

Some additional **ordering on sets** is required, as well as a **saturation property** – roughly speaking, if a morphism can compute  $b$  out of  $X$ , it can also compute a worse output  $a$  out of a better input  $Y$ .

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# Models of linear logic

There are thus **two main classes of denotational models** of linear logic:

- **qualitative** models: the exponential modality enumerates the resources used by a program, but not their multiplicity,
- **quantitative** models, in which the number of occurrences of a resource is precisely tracked.

The former use a **set-based** interpretation of the exponential, the latter a **multiset-based** one.

# Models of linear logic

Typing in Kobayashi's system corresponds to interpretation in a **qualitative** model of linear logic — due to **idempotency** of types, multiplicities are not accounted for.

(only works for  $\eta$ -long forms. . . )

It is interesting to consider **quantitative** interpretations as well – they are bigger, yet simpler.

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# Relational model of linear logic

Consider the relational model, in which

- $\llbracket o \rrbracket = Q$
- $\llbracket A \multimap B \rrbracket = \llbracket A \rrbracket \times \llbracket B \rrbracket$
- $\llbracket !A \rrbracket = \mathcal{M}_{fin}(\llbracket A \rrbracket)$

where  $\mathcal{M}_{fin}(A)$  is the set of finite **multisets** of elements of  $\llbracket A \rrbracket$ .

We have

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

It is some collection (with multiplicities) of elements of  $\llbracket A \rrbracket$  producing an element of  $\llbracket B \rrbracket$ .

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# Intersection types and relational interpretations

Consider again the typing

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

In the relational model:

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

and this example translates as

$$([q_0, q_1], [q_2], q) \in \llbracket a \rrbracket$$

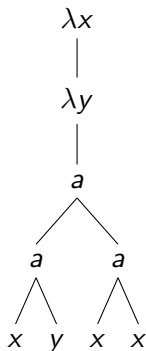
## An example of interpretation

Terms are interpreted as subsets of the interpretation of their simple type.

Consider the rule

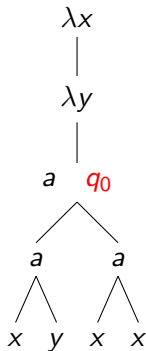
$$F x y = a (a x y) (a x x)$$

which corresponds to



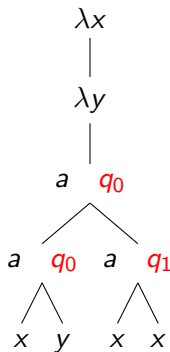
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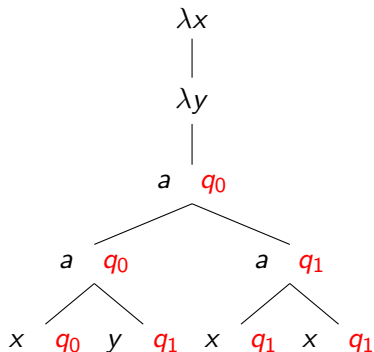


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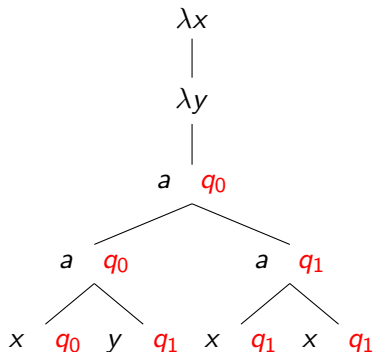
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# Relational interpretation and automata acceptance

## Theorem (G.-Melliès 2014)

Consider an *alternating tree automaton*  $\mathcal{A}$  and a  $\lambda$ -term  $t$  reducing to a tree  $T$ .

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

$$\{q_0\} \subseteq \llbracket t \rrbracket$$

where the interpretation is computed in the relational model.

# Linear models of the $\lambda$ -calculus with recursion



## Recursion: the *fix* rule

This model lacks recursion, and can not interpret in general the rule

$$\text{fix} \quad \frac{\Gamma \vdash \mathcal{R}(F) : \theta :: \kappa}{F : \theta :: \kappa \vdash F : \theta :: \kappa}$$

Since schemes produce **infinite trees**, we need to shift to an infinitary variant of *Rel*.

We consider a new exponential modality  $\Downarrow$ :

$$\llbracket \Downarrow A \rrbracket = \mathcal{M}_{\text{count}}(\llbracket A \rrbracket)$$

(**finite-or-countable** multisets)

This exponential  $\Downarrow$  satisfies the required axiom, and thus gives immediately an **infinitary model of the  $\lambda$ -calculus**.

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A function may now have a **countable** number of inputs.

This model has a **coinductive** fixpoint. The Theorem then extends:

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Consider an *alternating tree automaton*  $\mathcal{A}$  and a  $\lambda Y$ -term  $t$  producing a tree  $T$  (or, equivalently, a *higher-order recursion scheme*).

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# Specifying inductive and coinductive behaviours: parity conditions

# Alternating parity tree automata

Modal  $\mu$ -calculus allows to discriminate **inductive** from **coinductive** behaviour.

This allows to express properties as

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

or

“after a read operation, a write eventually occurs”.

# Alternating parity tree automata

In the APT, this inductive-coinductive policy is encoded using **parity conditions**. Every state receives a **colour**

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

Say that an infinite branch of a run-tree is **winning** iff the **maximal colour among the ones occurring infinitely often along it is even**.

Say that a run-tree is **winning** iff all of its infinite branches are.

Then an APT has a winning run-tree over a tree  $T$  iff the root of  $T$  satisfies the corresponding MSO formula  $\phi$ .

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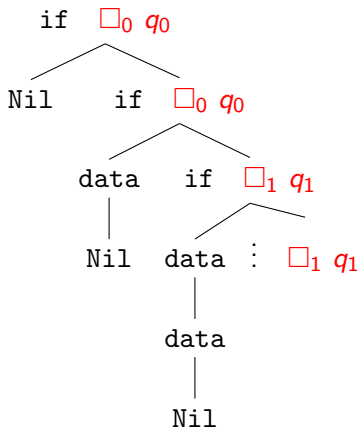
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## Parity condition on an example



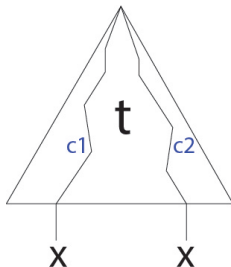
would **not** be a winning run-tree.

## Parity conditions

Kobayashi and Ong extend the **typings** with a **colouring operation**:

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

This operation lifts to higher-order.



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

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$$\text{Axiom} \quad \frac{}{x : \bigwedge_{\{i\}} \square_{-1} \theta_i :: \kappa \vdash x : \theta_i :: \kappa}$$

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This type system can have **infinite-depth derivations**.

The parity condition over branches of run-trees may be reformulated as a condition over infinite branches of a derivation tree.

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

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

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$$\Gamma \vdash t(\mathcal{G}) : q_0 :: \perp$$

where  $t(\mathcal{G})$  is the  $\lambda$ -term corresponding to  $\mathcal{G}$ .

This reformulation comes from a **game semantics** perspective.



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## A type-system for verification (Grellois-Melliès 2014)

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As in the prologue, we can **take advantage of this type-theoretic approach** to design an associated model.

An investigation of the **semantic nature** of  $\square$  shows that it has good properties: it is a **parameterized comonad**, which **distributes over the exponential**  $\downarrow$ .

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The modality is incorporated to the model by setting

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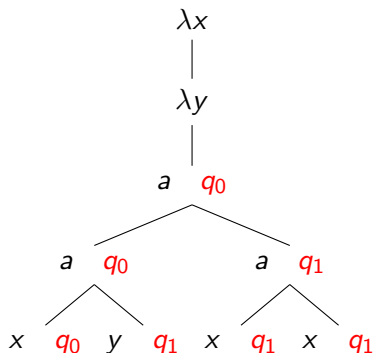
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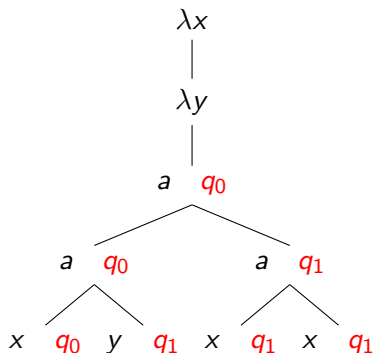


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# Connection with the coloured relational model

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(where the fixed point is interpreted as previously sketched)

# A finitary coloured model of the $\lambda Y$ -calculus

# Extensional collapses

In order to get a **decidability proof** and an **estimation of complexity**, we need to recast our work in a **finitary setting**.

If the exponential modality  $!$  is interpreted with **finite sets**, we obtain the poset-based model of linear logic (a.k.a. its Scott model).

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Basically, the Scott model of linear logic is a qualitative model in which

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

But it requires to carry an **ordering information**.

It gives a model of the  $\lambda$ -calculus in which

- 1 Types are interpreted as **preorders**
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Note that there is, again, a nice way to present the

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In fact, the denotation of a closed term  $t$  is the set of elements  $\alpha \in \llbracket \text{type}(t) \rrbracket$  such that

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where the interpretation is taken *in this finitary, coloured model*.

# Decidability of higher-order model-checking

Note that the **finiteness** of the model implies, together with the memoryless decidability of parity games, that every element of the denotation of a term can be extracted from a **finitary typing**: a finite typing derivation with backtracking pointers, which unravels to the original one.

This implies:

## Theorem

*The higher-order model-checking problem is decidable.*

# Decidability of higher-order model-checking

The **order** of a scheme/of a term can be understood as a measure of its complexity.

It somehow characterizes the **size of its set of refined intersection types/of its finitary denotation**.

## Proposition

*If  $\mathcal{G}$  has order  $n$ , then the complexity of the problem is  $O(n\text{-EXPTIME})$ .*

# Decidability of selection

Given an APT  $\mathcal{A}$  and a recursion scheme  $\mathcal{G}$ , the **selection problem** is to compute  $\mathcal{G}'$  whose value tree is a winning run-tree of  $\mathcal{A}$  over  $\llbracket \mathcal{G} \rrbracket$ .

From a finitary typing, we can build such a scheme, leading to

## Theorem

*The APT selection problem is decidable.*

# Conclusions and perspectives

- We studied **linear** models of the  $\lambda Y$ -calculus, designed to reflect the behaviour of **alternating parity tree automata**.
- In spite of its infinitary nature, the relational model is **convenient** for the theoretical study of the problem.
- From the recipes of the relational approach, we define a **finitary model**, which gives a **new decidability proof** of the problem.
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