# Higher-order Arities, Signatures and Equations via Modules

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# Keywords associated with syntax

Induction/Recursion

Substitution



Model

Operation/Construction

Arity/Signature

This talk: give a mathematical account of this area

### **Motivation: LCD**

The *differentiable*  $\lambda$ -calculus (LCD) was introduced by [Ehrard-Regnier 2003].

The syntax is not straightforward, as it involves some equations.

There are alternative presentations of the syntax in later articles, more or less verbose.

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The syntax is not straightforward, as it involves some equations.

There are alternative presentations of the syntax in later articles, more or less verbose.

The next slides give 3 variants of the syntax

A **syntax** for the **differentiable λ-calculus** by **mutual induction**:

[Categorical Models for Simply Typed Resource Calculi]

#### Simple terms:

$$\Lambda^s: \quad s, t, u, v ::= \quad x \mid \lambda x.s \mid sT \mid \mathsf{D} s \cdot t$$

#### Differential λ-terms:

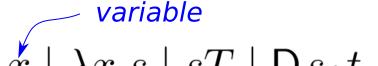
$$\Lambda^d: \quad S, T, U, V ::= \quad 0 \mid s \mid s + T$$

A syntax for the differentiable λ-calculus by mutual induction:

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 $\Lambda^d: \quad S, T, U, V ::= \quad 0 \mid s \mid s + T$ neutral element for + modulo commutativity

$$s+T$$

modulo  $\alpha$ -renaming of x

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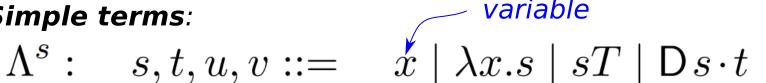
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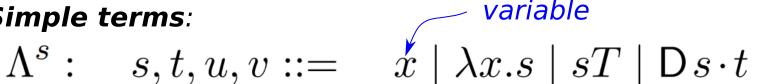
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A syntax is specified by operations and equations.

But which ones are allowed? What is the limit?

### Which operations/equations are allowed to specify a syntax?

Can we avoid mutual induction?

### A stand-alone presentation of simple terms:

Simple terms:

$$\Lambda^s: s, t, u, v ::= x \mid \lambda x.s \mid sT \mid \mathsf{D} s \cdot t$$

Differential λ-terms:

$$T \in \Lambda^d = FreeCommutativeMonoid(\Lambda^s)$$

### Which operations/equations are allowed to specify a syntax?

Can we avoid mutual induction?

### A stand-alone presentation of simple terms:

Simple terms:

$$\Lambda^s: \quad s,t,u,v ::= \quad x \mid \lambda x.s \mid sT \mid \mathsf{D} \, s \cdot t$$

as an operation:  $\Lambda^s \times FreeCommutativeMonoid(\Lambda^s) \to \Lambda^s$ 

Differential λ-terms:

 $T \in \Lambda^d = FreeCommutativeMonoid(\Lambda^s)$ 

### Which operations/equations are allowed to specify a syntax?

### A stand-alone presentation of differential $\lambda$ -terms:

Allow summands everywhere (not only in the right arg of application)

#### Differential $\lambda$ -terms:

$$\Lambda^{
m d}: S,\!T$$
  $::= x \mid \lambda x.S \mid ST \mid {\sf D}S \cdot T$  neutral element for  $+$  modulo commutativity and associativity

Turn [Categorical Models for

Simply Typed Resource Calculi]'s

abbreviations into equations:

$$\lambda x. \Sigma_i t_i = \Sigma_i \lambda x. t_i$$
$$(\Sigma_i t_i) u = \Sigma_i t_i u$$

$$D(\Sigma_i t_i) \cdot (\Sigma_j u_j) = \Sigma_i \Sigma_j D t_i \cdot u_j$$

# Syntax of LCD: Conclusion

How can we compare these different versions?

In which sense are they syntaxes?

Which operations/equations are we allowed to specify in a syntax?

# Syntax of LCD: Conclusion

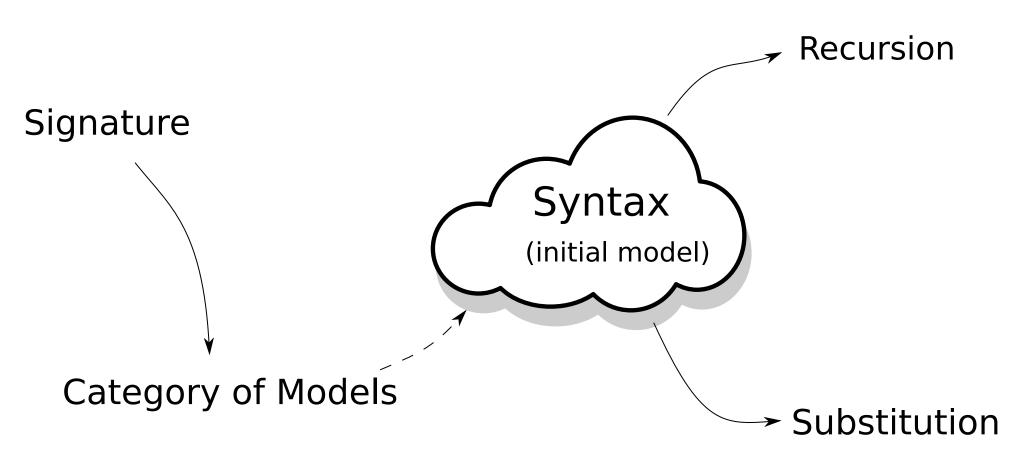
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What is a syntax?

# What is a syntax?



generates a syntax = existence of the initial model

### Overview

**Topic**: specification and construction of untyped syntaxes with variables and a well-behaved substitution (e.g. differential  $\lambda$ -calculus).

#### Our work:

- 1. general notion of *1-signature* based on *monads* and *modules*.
  - Caveat: Not all of them do generate a syntax
  - special case: classical *algebraic 1-signatures* generate a syntax
- 2. notion of **2-signature**: a pair of a 1-signature and a set of equations.
  - special case: *algebraic 2-signatures* generate a syntax

### Previous work of Fiore-Hur 2010

[Fiore-Hur 2010]: presentations of simply typed languages by generating *binding* operations (e.g.  $\lambda$ -abstraction) and equations among them.

**Our work**: for the untyped setting, a variant of their approach where monads and modules over them are the central notions.

### Table of contents

1. Review: Binding signatures and their models

2. 1-Signatures and models based on monads and modules

3. Equations

4. Recursion

### Table of contents

### 1. Review: Binding signatures and their models

- Categorical formulation of term languages
- Initial semantics for binding signatures

- 2. 1-Signatures and models based on monads and modules
- 3. Equations
- 4. Recursion

**Example**: differential  $\lambda$ -calculus (last variant)

$$\Lambda^{
m d}: S,\!T := x \mid \lambda x.S \mid ST \mid \mathsf{D}S \cdot T \mid 0 \mid S+T$$

### Free variable indexing:

$$LCD: X \mapsto \{\text{terms taking free variables in } X\}$$
  
 $LCD(\emptyset) = \{0, \lambda x.x, \dots\}$   
 $LCD(\{x,y\}) = \{0, \lambda z.z, \dots, x, y, x + y, \dots\}$ 

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### Free variable renaming:

$$\begin{array}{cccc} LCD(f) \,:\, LCD(X) \to & LCD(Y) \\ & t & \mapsto & t[x \mapsto f(x)] \end{array} \qquad \text{where} \quad f: X \to Y$$

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⇒ LCD is an endofunctor on Set

### Operations as natural transformations:

$$+: LCD \times LCD \xrightarrow{\cdot} LCD$$

$$0: \quad 1 \quad \stackrel{\centerdot}{\rightarrow} LCD$$

. . .

#### Variables as a natural transformation:

$$\operatorname{var}: \operatorname{Id}_{\operatorname{Set}} \to LCD$$

Putting all together:

$$LCD \times LCD + 1 + \operatorname{Id}_{\operatorname{Set}} \stackrel{\cdot}{\to} LCD$$

# Binding Signatures

Definition

**Binding signature** = a family of lists of natural numbers.

Each list specifies one operation in the syntax:

- length of the list = number of arguments of the operation
- natural number in the list = number of bound variables in the corresponding argument

Syntax with 0, +:

Lambda calculus:

# Initial semantics for binding signatures

The syntax (0,+) is the initial algebra for the endofunctor:

$$F \mapsto F \times F + 1 + \operatorname{Id}_{\operatorname{Set}}$$

More generally, any binding signature gives rise to an endofunctor  $\Sigma$ .

Definition

**Model** =  $(\Sigma + Id_{Set})$ -algebra

e.g. LCD is a model of the (0,+) signature

Classical Theorem

The initial  $(\Sigma + \mathrm{Id}_{\mathrm{Set}})$ -algebra of a binding signature  $\Sigma$  always exists.

**Question**: Does this initial algebra come with a well-behaved substitution?

Answer: Yes: see e.g. [Fiore, Plotkin, Turi 1999], [Ghani & Uustalu 2003]

### Table of contents

1. Review: Binding signatures and their models

### 2. 1-Signatures and models based on monads and modules

- Our take on substitution
- Our take on 1-signatures, models and syntax
- Our take on binding 1-signatures
- 3. Equations
- 4. Recursion

Binding signatures  $\hookrightarrow$  Our 1-signatures

A **1-signature**  $\Sigma$  is a functorial assignment:

$$R \mapsto \Sigma(R)$$

A **model of**  $\Sigma$  is a pair:

$$(R, \rho: \Sigma(R) \to R)$$

monad := endofunctor with substitution

module over a monad := endofunctor with substitution

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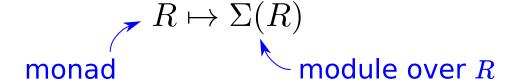
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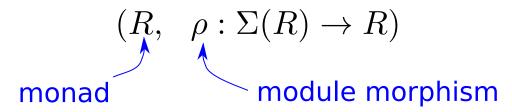
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#### Reminder:

- $LCD(X) = \{ \text{ differential } \lambda \text{-terms taking free variables in } X \}$
- ullet Variables induce a natural transformation  $\mathrm{var}:\mathrm{Id}_{\mathrm{Set}} o LCD$
- Variable renaming by functoriality:

$$LCD(f)(t) = t[x \mapsto f(x)]$$

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**Variable renaming** = special case of **substitution**:

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The triple (LCD, var, bind) is called a **monad**.

**monad morphism** = mapping preserving var and bind.

### Monads

1. LCD : Set  $\rightarrow$  Set

- 2. A collection of functions  $(var_X : X \to LCD(X))_X$ Variables are expressions
- 3. For each function  $u:X\to LCD(Y)$ , a function  $\operatorname{bind}_u:LCD(X)\to LCD(Y)$  Parallel substitution

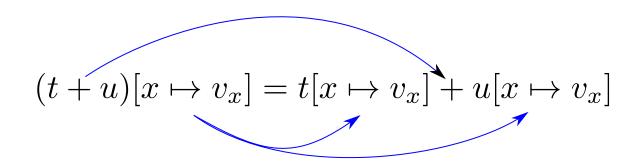
**Notation:** 
$$\operatorname{bind}_{\mathbf{u}}(\mathbf{t}) = \mathbf{t}[\mathbf{x} \mapsto \mathbf{u}(\mathbf{x})]$$

4. Monadic laws:

$$\begin{aligned} \operatorname{var}(y)[x \mapsto u(x)] &= u(y) \\ t[x \mapsto \operatorname{var}(x)] &= t \\ t[x \mapsto f(x)][y \mapsto g(y)] &= t[x \mapsto f(x)[y \mapsto g(y)] \ ] \end{aligned}$$

### Preview: Operations are module morphisms

#### + commutes with substitution



#### **Categorical formulation**

$$LCD imes LCD$$
 supports  $LCD$ -substitution



 $LCD \times LCD$  is a module over LCD



+:LCD imes LCD o LCD is

a module morphism

### Modules VS Monads

#### **Monad**

- 1.  $B : Set \rightarrow Set$
- 2. A collection of functions  $(var_X : X \rightarrow B(X))_X$ Variables are expressions
- 3. For each function  $u:X\to B(Y)$ , a function  $\operatorname{bind}_u:B(X)\to B(Y)$  Parallel substitution

**Notation:** 
$$\operatorname{bind}_{\mathrm{u}}(\mathrm{t}) = \mathrm{t}[\mathrm{x} \mapsto \mathrm{u}(\mathrm{x})]^{\mathrm{B}}$$

4. Substitution laws:

$$\begin{split} var(y)[x \mapsto u(x)]^B &= u(y) \\ t[x \mapsto var(x)]^B &= t \\ t[x \mapsto f(x)]^B[y \mapsto g(y)]^B &= t[x \mapsto f(x)[y \mapsto g(y)]^B]^B \end{split}$$

### Modules VS Monads

**Monad** Module over a monad B (e.g.  $B \times B, 2, ...$ )

- 1.  $M : Set \rightarrow Set$   $M(X) = expressions \ taking \ variables \ in \ X$
- 2. A collection of functions  $(var_X : X \to M(X))_X$
- 3. For each function  $u:X\to B(Y)$ , a function  $\operatorname{bind}_u:M(X)\to M(Y)$  Parallel substitution

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### Building blocks for binding signatures

Essential constructions of **modules over a monad** R:

- R itself
- $M \times N$  for any modules M and N (in particular,  $R \times R$ )
- The **derivative of a module** M is the module M' defined by  $M'(X) = M(X + \{ \diamond \}).$

The derivative is used to model an operation binding a variable (Cf next slide).

# Syntactic operations are module morphisms

**module morphism** = maps commuting with substitution.

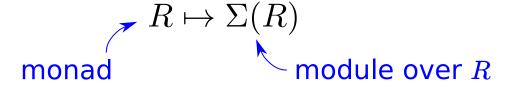
$$id_{M}:M
ightarrow M$$

$$0:1 \rightarrow LCD$$

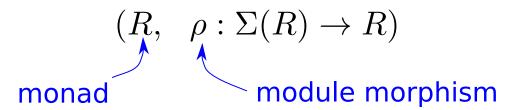
$$+:LCD imes LCD o LCD$$

### The Big Picture again

A **1-signature**  $\Sigma$  is a functorial assignment:



A **model of**  $\Sigma$  is a pair:



A **model morphism**  $m:(R,\rho)\to (S,\sigma)$  is a monad morphism commuting with the module morphism:  $\Sigma(R) \xrightarrow{\rho} R$ 

$$\Sigma(R) \xrightarrow{\rho} R$$

$$\Sigma(m) \downarrow \qquad \qquad \downarrow m$$

$$\Sigma(S) \xrightarrow{\sigma} S$$

# Syntax

Definition

Given a 1-signature  $\Sigma$ , its **syntax** is an initial object in its category of models.

**Question**: Does the syntax exist for every 1-signature?

Answer: No.

**Counter-example**: the 1-signature  $R \mapsto \mathscr{P} \circ R$ 

powerset endofunctor on Set

# Examples of 1-signatures generating syntax

#### • **(0,+) language**:

```
Signature: R \mapsto \mathbf{1} + R \times R
```

Model: 
$$(R \text{ , } 0: 1 \rightarrow R \text{ , } +: R \times R \rightarrow R)$$

Syntax: 
$$(B, 0: 1 \rightarrow B, +: B \times B \rightarrow B)$$

#### lambda calculus:

Signature:  $R \mapsto R' + R \times R$ 

Model:  $(R \text{ , } abs: R' \rightarrow R \text{ , } app: R \times R \rightarrow R)$ 

Syntax: ( $\Lambda$  ,  $abs: \Lambda' o \Lambda$  ,  $app: \Lambda imes \Lambda o \Lambda$ )

Can we generalize this pattern?

### Initial semantics for algebraic 1-signatures

Syntax exists for any **algebraic 1-signature**, i.e. 1-signature built out of derivatives, products, coproducts, and the trivial 1-signature  $R \mapsto R$ .

**Algebraic 1-signatures** correspond to binding signatures through the embedding:

Binding signatures  $\hookrightarrow$  Our 1-signatures

**Question**: Can we enforce some equations in the syntax?

For example: lambda calculus modulo beta and eta.

### Table of contents

- 1. Review: Binding 1-signatures and their models
- 2. 1-Signatures and models based on monads and modules

#### 3. Equations

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### Example: a commutative binary operation

#### **Specification of a binary operation**

1-Signature:  $R \mapsto R \times R$ 

Model:  $(R, + : R \times R \rightarrow R)$ 

What is an appropriate notion of model for a commutative binary operation ?

### Example: a commutative binary operation

#### Specification of a commutative binary operation

1-Signature:  $R \mapsto R \times R$ 

Model:  $(R, +: R \times R \rightarrow R)$  s.t. t+u=u+t (1)

# What is an appropriate notion of model for a commutative binary operation ?

**Answer**: a monad equipped with a commutative binary operation

### Example: a commutative binary operation

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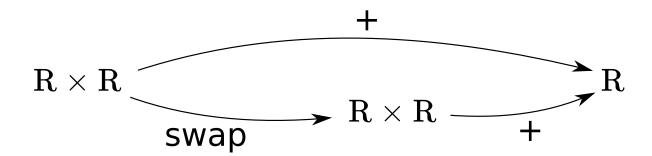
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Answer: a monad equipped with a commutative binary operation

Equation (1) states an equality between R-module morphisms:



### Review: Signatures with equations

• [Fiore-Hur 2010]: existence of an initial model for an inductively defined (with a specific syntax) set of possible equations.

• [AHLM CSL 2018]: "quotients" of algebraic 1-signatures generate a syntax (e.g. a binary commutative operation).

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Our work: alternative approach where monads and modules are the central notions.

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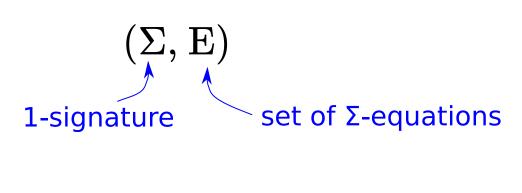
This work: more general equations (e.g.  $\lambda$ -calculus modulo  $\beta\eta$ ).

### Equations

Given a 1-signature  $\Sigma$ , a  $\Sigma$ -equation  $A \Rightarrow B$  is a functorial assignment

$$R \mapsto \left(\begin{array}{c} A(R) \Longrightarrow B(R) \\ & \text{parallel pair of module} \\ & \text{morphisms over } R \end{array}\right)$$

A 2-signature is a pair



#### *model* of a 2-signature $(\Sigma, E)$ :

- a model R of Σ
- s.t.  $\forall$  (A  $\Rightarrow$  B)  $\in$  E, the two morphisms  $A(R) \Rightarrow B(R)$  are equal

### Algebraic 2-signatures

Given a 1-signature  $\Sigma$ , a  $\Sigma$ -equation  $A \Rightarrow B$  is **elementary** if:

- 1. A "preserves pointwise epimorphisms"
  - (e.g., any "algebraic 1-signature")
- 2. B is of the form  $R \mapsto R'^{...}$  (e.g.  $R \mapsto R$ )

**Algebraic** 2-signature:

 $(\Sigma, E)$  set of **elementary** algebraic 1-signature  $\Sigma$ -equations

Syntax exists for any algebraic 2-signature

# Example: λ-calculus modulo βη

The algebraic 2-signature  $(\Sigma_{LC\beta\eta}, E_{LC\beta\eta})$  of  $\lambda$ -calculus modulo  $\beta\eta$ :

$$\mathbf{\Sigma}_{\mathbf{LC\beta\eta}}\left(\mathrm{R}
ight):=\Sigma_{\mathrm{LC}}(\mathrm{R})=\mathrm{R} imes\mathrm{R}+\mathrm{R}^{\prime}$$

**model of**  $\Sigma_{LC}$  = monad R with module morphisms:

$$app: R \times R \to R$$
  $abs: R' \to R$ 

β-equation: 
$$(\lambda x.t) u = \underline{t[x \mapsto u]}$$
 η-equation:  $t = \lambda x.(t x)$   $\sigma_R(t,u)$ 

$$\mathbf{E}_{\mathbf{LC}\boldsymbol{\beta}\boldsymbol{\eta}} = \{ \beta \text{-equation}, \eta \text{-equation} \}$$

### Example: λ-calculus modulo βη

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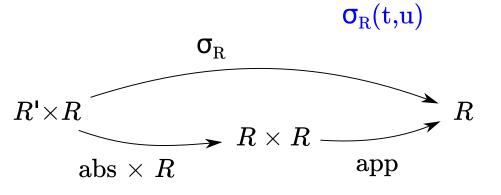
$$\mathbf{\Sigma}_{\mathrm{LCBn}}\left(\mathrm{R}
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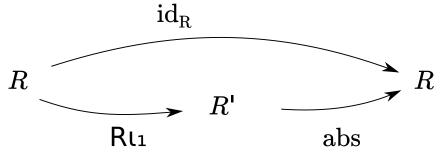
**model of**  $\Sigma_{1C}$  = monad R with module morphisms:

$$app: R \times R \to R$$
  $abs: R' \to R$ 

**β-equation**: 
$$(\lambda x.t) u = t[x \mapsto u]$$

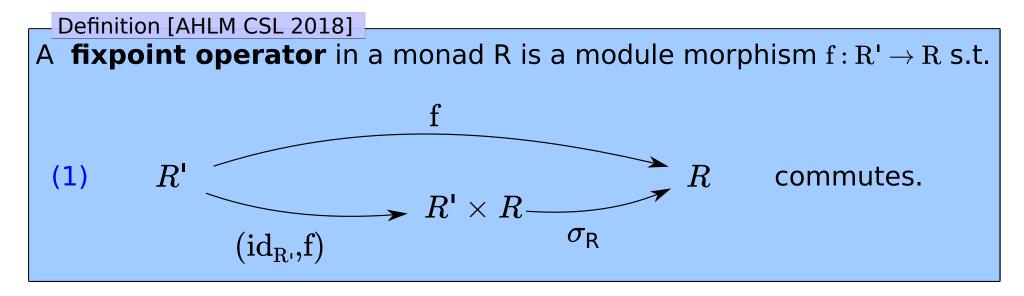
η-equation:  $t = \lambda x.(t x)$ 





$$\mathbf{E}_{\mathbf{LC}\boldsymbol{\beta}\boldsymbol{\eta}} = \{ \beta \text{-equation}, \eta \text{-equation} \}$$

# Example: fixpoint operator



The algebraic 2-signature  $(\Sigma_{fix}, E_{fix})$  of a fixpoint operator:

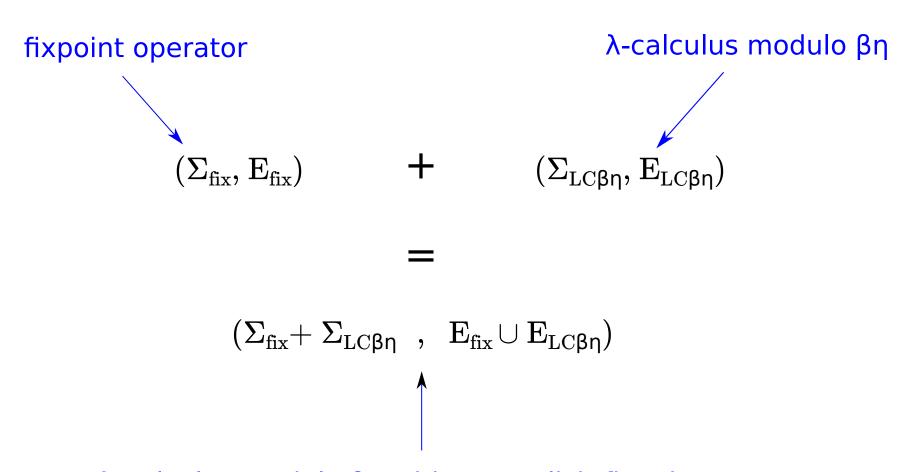
$$\Sigma_{ ext{fix}}\left(\mathrm{R}
ight) := \mathrm{R'} \qquad \qquad \mathrm{E}_{ ext{fix}} = \left\{ \ egin{pmatrix} 1 \ \end{pmatrix} 
ight.$$

#### Proposition [AHLM CSL 2018]

**Fixpoint operators** in  $LC_{\beta\eta}$  are in one to one correspondance with fixpoint combinators (i.e.  $\lambda$ -terms Y s.t. t (Yt) = Yt for any t).

### Combining algebraic 2-signatures

Algebraic 2-signatures can be combined:



 $\lambda$ -calculus modulo  $\beta\eta$  with an explicit fixpoint operator

### Example: free monoid

An algebraic 2-signature  $(\Sigma_{\mathrm{mon}}\,,\,\mathrm{E}_{\mathrm{mon}})$  for the free monoid monad  $\mathrm{X}\mapsto\coprod_{\mathrm{n}}\mathrm{X}^{\mathrm{n}}$ 

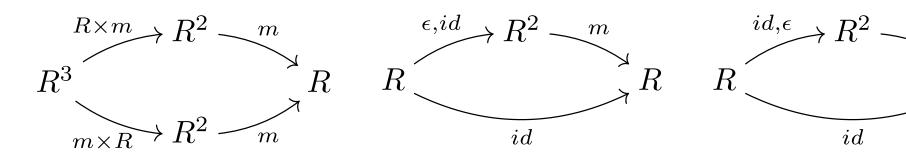
$$\Sigma_{\text{mon}}(R) := 1 + R \times R$$

**model of**  $\Sigma$  = monad R with module morphisms:

$$\epsilon: 1 \to R$$

$$\epsilon: 1 \to R$$
  $m: R \times R \to R$ 

3 elementary Σ-equations:



associativity

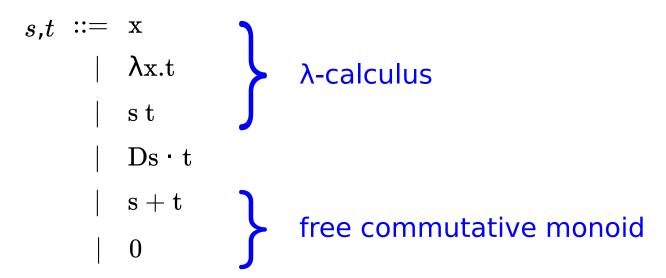
left unit

right unit

### Our target: LCD

#### Syntax of the differentiable λ-calculus:

Simple terms  $s,t \in \Lambda$ 



and (bi)linearity of constructors with respect to +:

$$\lambda x.(s+t) = \lambda x.s + \lambda x.t$$
 ...

### Algebraic 1-signature for LCD

#### Syntax of the differentiable λ-calculus:



Simple terms  $s,t \in \Lambda$  Corresponding 1-signature

### Algebraic 1-signature for LCD

#### Syntax of the differentiable λ-calculus:

Simple terms  $s,t \in \Lambda$  Corresponding 1-signature

Resulting algebraic 1-signature:

$$\Sigma_{
m LCD}({
m R}) = \Sigma_{
m LC}({
m R}) + {
m R} imes {
m R} + \Sigma_{
m mon}({
m R})$$

### Elementary equations for LCD

#### **Commutative monoidal structure:**

$$\mathbf{s} + \mathbf{t} = \mathbf{t} + \mathbf{s} \qquad \mathbf{R} \times \mathbf{R} \rightrightarrows \mathbf{R}$$

$$\mathbf{E}_{\text{mon}} \qquad \begin{cases} \mathbf{s} + (\mathbf{t} + \mathbf{u}) = (\mathbf{s} + \mathbf{t}) + \mathbf{u} & \mathbf{R} \times \mathbf{R} \rightrightarrows \mathbf{R} \\ 0 + \mathbf{t} = \mathbf{t} & \mathbf{R} \rightrightarrows \mathbf{R} \\ \mathbf{t} + 0 = \mathbf{t} & \mathbf{R} \rightrightarrows \mathbf{R} \end{cases}$$

#### **Linearity:**

$$\lambda x.(s+t) = \lambda x.s + \lambda x.t$$
  $R \times R \rightrightarrows R$   $D(s+t) \cdot u = Ds \cdot u + Dt \cdot u$   $R \times R \times R \rightrightarrows R$   $Ds \cdot (t+u) = Ds \cdot t + Ds \cdot u$   $R \times R \times R \rightrightarrows R$ 

• • •

### Table of contents

- 1. Review: Binding signatures and their models
- 2. 1-Signatures and models based on monads and modules
- 3. Equations

#### 4. Recursion

Recursion on the syntax  $\approx$  Initiality in the category of models

$$f:R\to S$$
 initial model of a 2-signature  $(\Sigma,E)$ 

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#### Recipe for constructing "by recursion" a monad morphism:

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1. Give a module morphism  $s : \Sigma(S) \to S$ 

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Initiality of R  $\Rightarrow$  model morphism  $R \to S \Rightarrow$  monad morphism  $R \to S$ 

### Example: Computing the set of free variables

$$LC = initial model of (\Sigma_{LC}, \emptyset)$$

$$\Sigma_{\rm LC}({
m R})={
m R} imes{
m R}+{
m R}^{\scriptscriptstyle \mathsf{I}}$$

 $\mathcal{P}$  = power set monad

#### Definition of a (monad) morphism $fv: LC \to \mathcal{P}$ s.t.

$$\mathrm{fv}(\mathrm{app}(\mathrm{t},\!\mathrm{u}))=\mathrm{fv}(\mathrm{t})\cup\mathrm{fv}(\mathrm{u})$$

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$$\cup:~\mathcal{P} imes\mathcal{P} o\mathcal{P}$$

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Initiality of  $LC \Rightarrow fv : LC \rightarrow P$  satisfying the above equations (as a model morphism).

# Example: Translating λ-calculus with fixpoint

Definition of a translation  $\mathbf{f}:\mathrm{LC}_{\beta\eta\mathrm{fix}}\to\mathrm{LC}_{\beta\eta}\,$  s.t.

$$f(u) = "u[ \ fix(t) \mapsto app(Y, abs(t)) \ ]"$$

a chosen fixpoint combinator

### Example: Translating λ-calculus with fixpoint

```
\mathsf{LC}_{\mathsf{Bnfix}} = \mathsf{initial} \; \mathsf{model} \; \mathsf{of} \; (\Sigma_{\mathsf{LCBn}} \, , \, \mathord{\mathrm{E}}_{\mathsf{LCBn}}) + (\Sigma_{\mathsf{fix}} \, , \; \mathord{\mathrm{E}}_{\mathsf{fix}})
          \lambda-calculus modulo \beta\eta with a fixpoint operator \mathrm{fix}:\mathrm{LC}_{\beta\eta\mathrm{fix}}'\to\mathrm{LC}_{\beta\eta\mathrm{fix}}
LC_{\beta n} = initial model of (\Sigma_{LC\beta n}, E_{LC\beta n})
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                                                                               monad morphism
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                                                                                                   a chosen fixpoint combinator
\Rightarrow \text{ make LC}_{\beta\eta} \text{ a model of } (\Sigma_{\mathrm{LC}\beta\eta}\,, E_{\mathrm{LC}\beta\eta}) + (\Sigma_{\mathrm{fix}}\,,\ E_{\mathrm{fix}}) \text{:}
                                                                                                   \hat{\mathsf{Y}}: \mathrm{LC}_{\mathsf{Bn}}{}^{\mathsf{I}} 
ightarrow \; \mathrm{LC}_{\mathsf{Bn}}
                                                    app, abs
                                                                                                                      t \mapsto app(Y,abs(t))
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Initiality of  $LC_{\beta\eta fix} \Rightarrow f: LC_{\beta\eta fix} \rightarrow LC_{\beta\eta}$ 

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#### **Definition of a (monad) morphism** $s : LC \rightarrow \mathbb{N}$ **s.t.**

$$s(app(t,u)) = 1 + s(t) + s(u) \qquad \qquad s(abs(t)) = 1 + s(t)$$

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$$\mathbf{s}(\mathbf{t}) = \mathbf{g}(\mathbf{t}, (\mathbf{x} \mapsto \mathbf{0}))$$

variables are of size 0 45/50

### Conclusion

#### Summary of the talk:

- presented a notion of 1-signature and models
- defined a 2-signature as a 1-signature and a set of equations
- identified a class of 2-signatures that generate a syntax

The main theorem has been formalized in Coq using the UniMath library.

#### **Future work:**

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### Thank you!