

Recognizability in functional programs

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Journées annuelles GT Vérif et GT SCALP du GDR IFM 2024

λ -calculus

Applications of λ -calculus

- ▶ Programming languages (Lisp, Ocaml, SML, Haskell, ...)

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- ▶ program verification.

Simply typed λ -calculus

Types: \mathcal{A} is a finite set of atomic types and $(A \rightarrow B)$ is a type when A and B are types.

$$\text{order}(A) = 1, \text{order}(A \rightarrow B) = \max(\text{order}(A) + 1, \text{order}(B))$$

Higher-order signature $\Sigma = \{a^A, b^B, \dots\}$ is a set of typed constant.

λ -calculus

$$\Lambda : \quad M^A, N^B ::= x^A \mid c^A \mid (\lambda x^A. M^B)^{A \rightarrow B} \mid (M^{A \rightarrow B} N^A)^B$$

$$(\beta) \quad (\lambda x. M)N = M[N/x]$$

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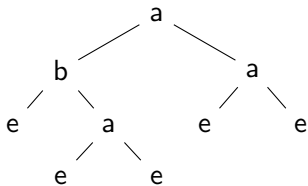
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$$(\delta) \quad YM = M(YM)$$

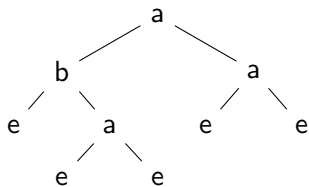
Syntax basics

Trees



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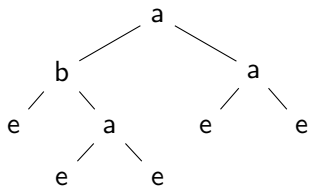


Strings

$\lambda x.$
|
a
|
b
|
c
|
a
|
x

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Strings

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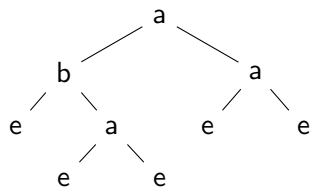
|

x



Syntax basics

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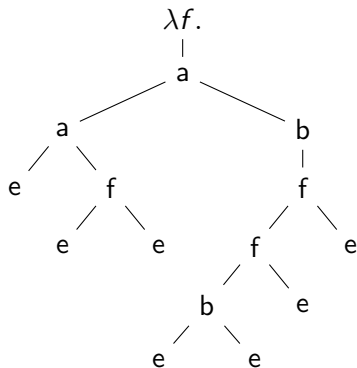
c

a

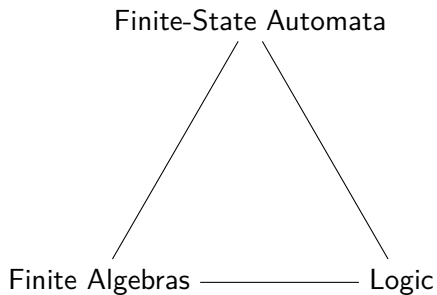
x



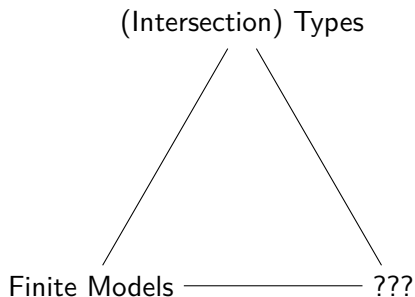
Complex operations



Recognizability

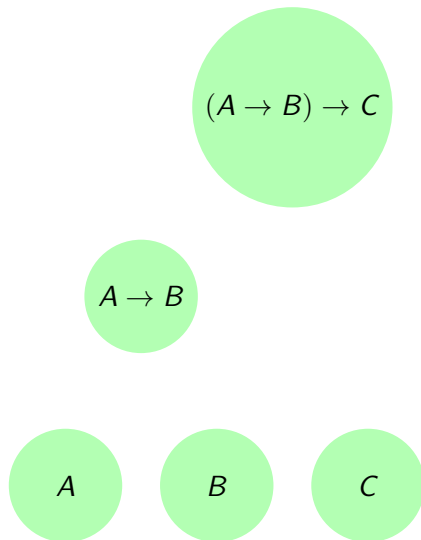


Recognizability in the simply typed λ -calculus [S.09]



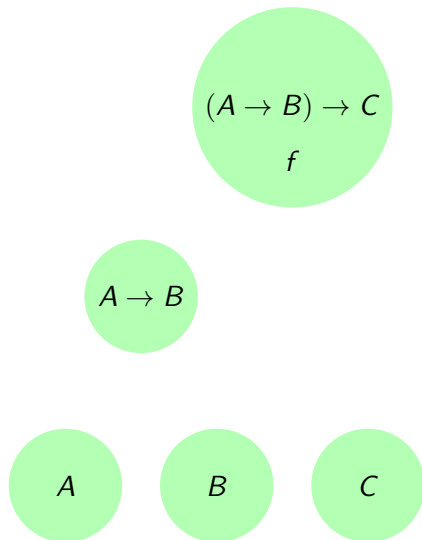
Finite models

$\llbracket M, \nu \rrbracket$



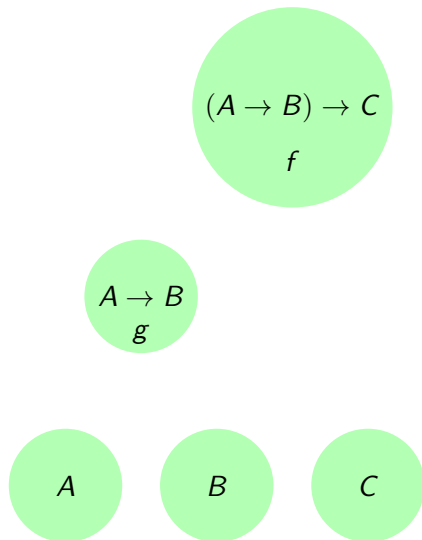
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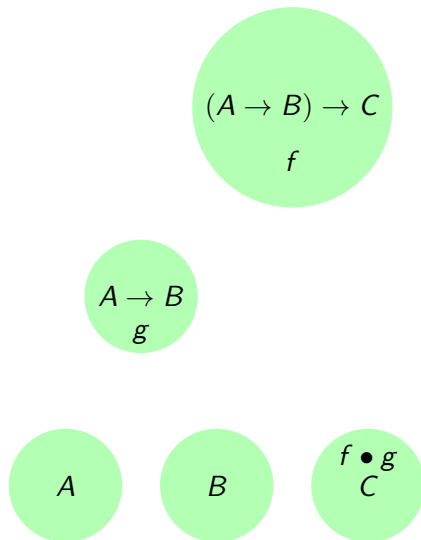
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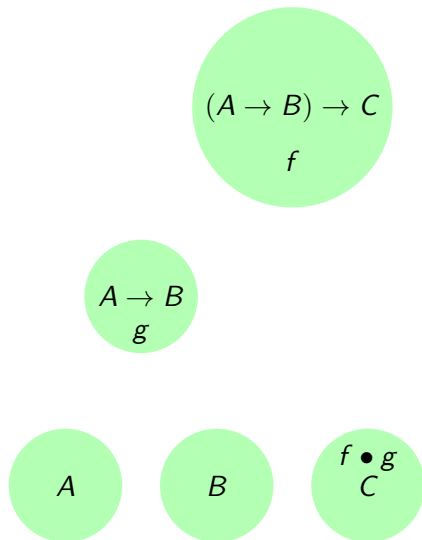


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Axioms

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$$(A \rightarrow B) \rightarrow C$$

f

$$A \rightarrow B$$

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Lemma (Correctness)

If $M =_{\beta} N$, then for every ν ,
 $\llbracket M, \nu \rrbracket = \llbracket N, \nu \rrbracket$.

A wealth of possibilities

standard, monotonous, stable,
strongly stable ...models,
bi-domains etc.

$$(A \rightarrow B) \rightarrow C$$

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A

B

$$f \bullet g$$

C

Recognizability in the simply typed λ -calculus

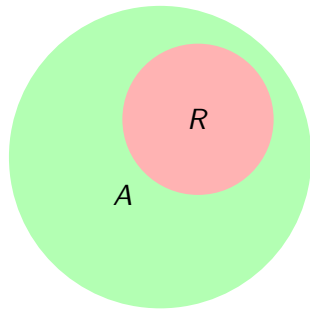
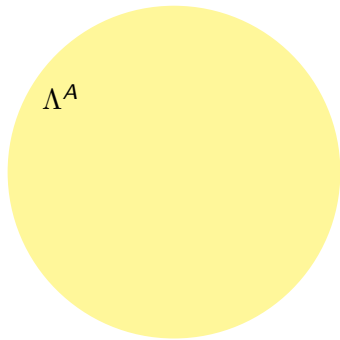


Λ^A



A

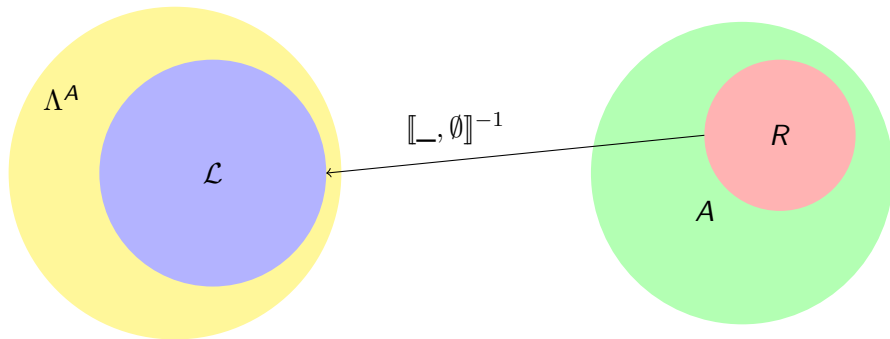
Recognizability in the simply typed λ -calculus



Recognizability in the simply typed λ -calculus

\mathcal{L} is recognizable iff:

$$\mathcal{L} = \{M \mid \llbracket M, \emptyset \rrbracket \in R\}$$



Basic properties

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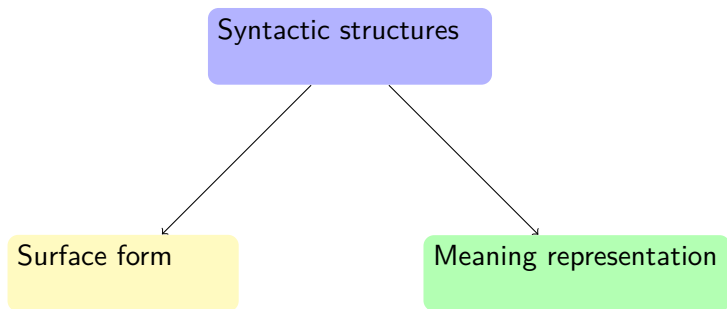
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First application

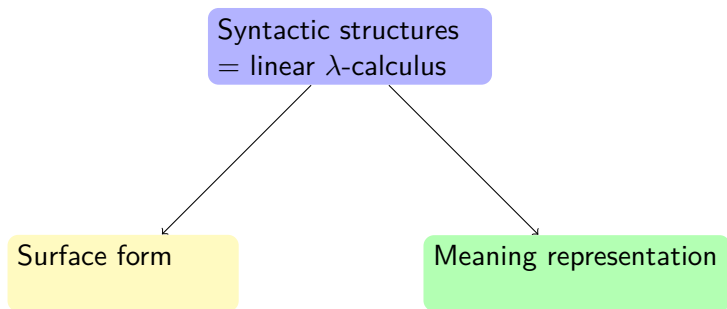
Simple proof of decidability of 4^{th} order matching.

Finiteness: parsing algorithms

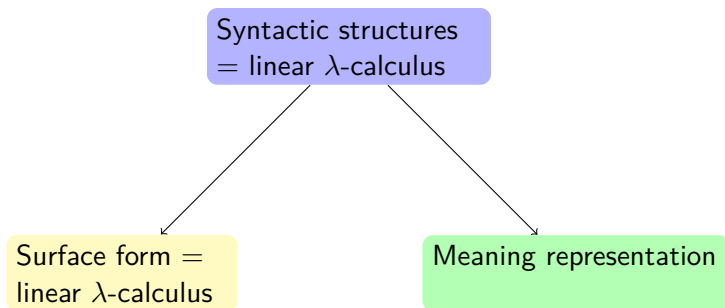
Abstract Categorical Grammars [de Groote 01, Muskens 01]



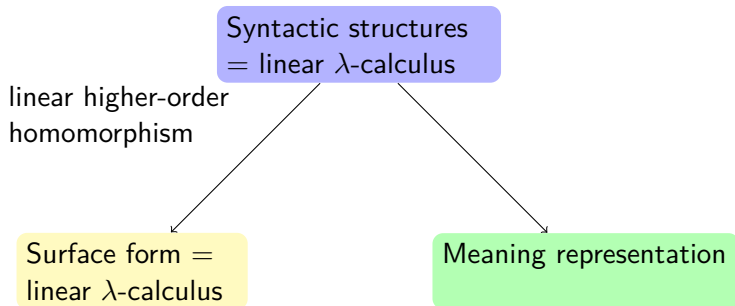
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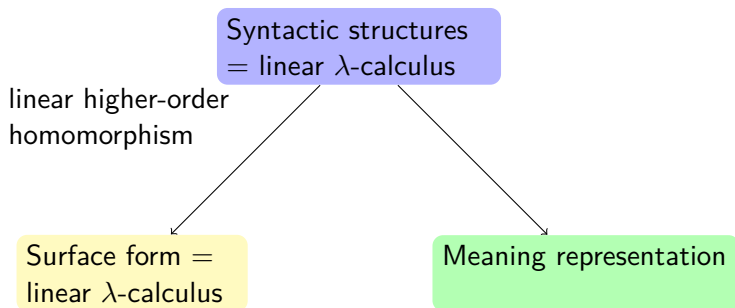
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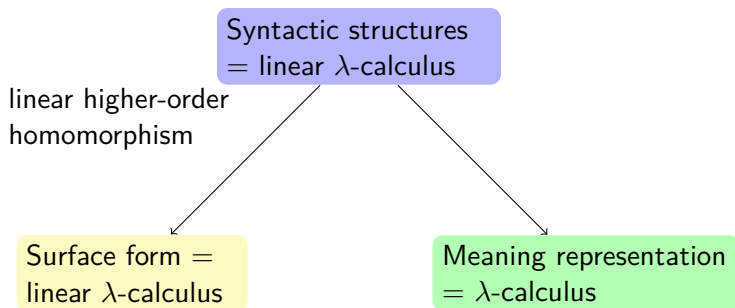


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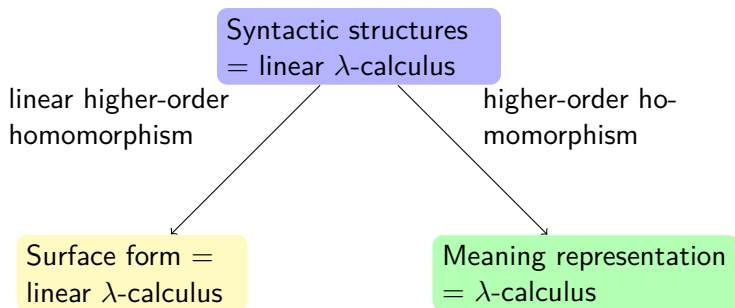
Generalizes many notions of grammars.

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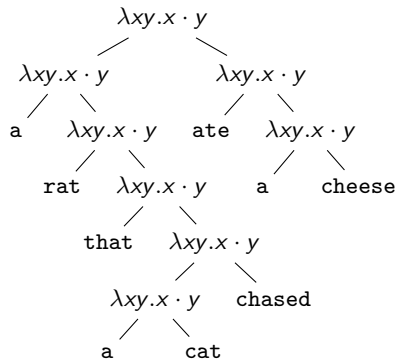
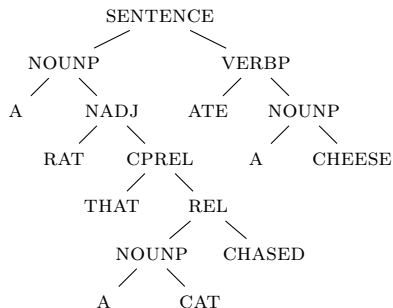
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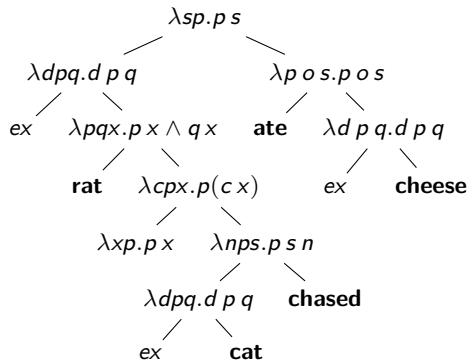
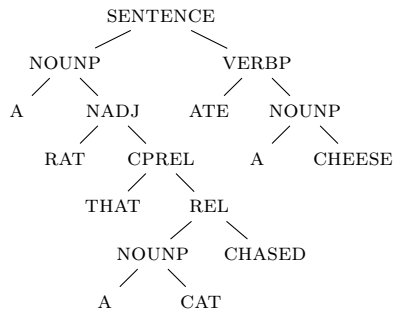
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Example: Surface Realization



a rat that a cat saw ate a cheese

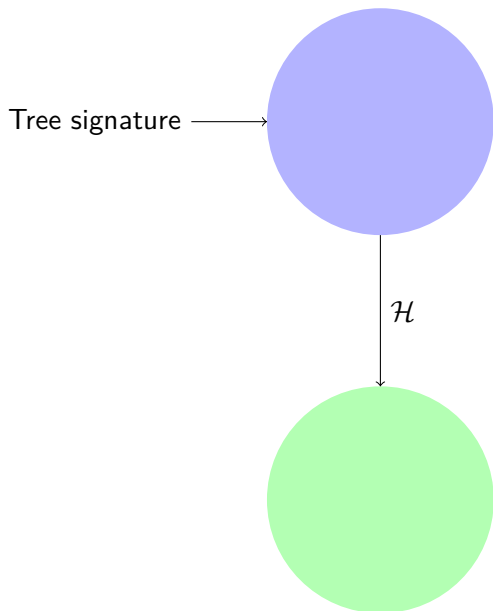
Example: Montague Semantics



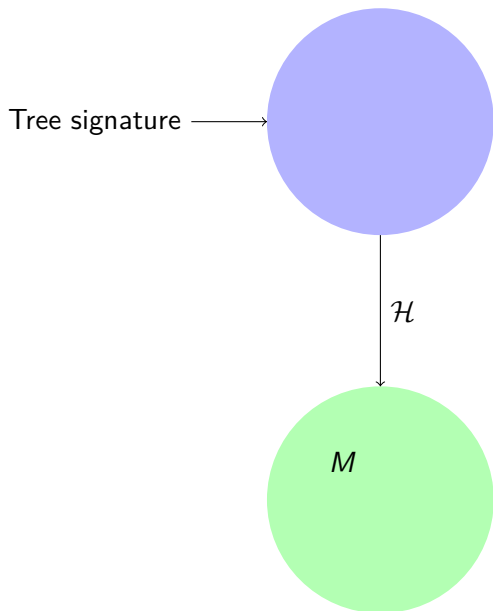
where $ex = \lambda pq.\exists x.px \wedge qx$.

$\exists x.\mathbf{rat}\ x \wedge (\exists y.\mathbf{cat}\ y \wedge \mathbf{chased}\ y\ x \wedge (\exists u.\mathbf{cheese}\ u \wedge \mathbf{ate}\ x\ u))$

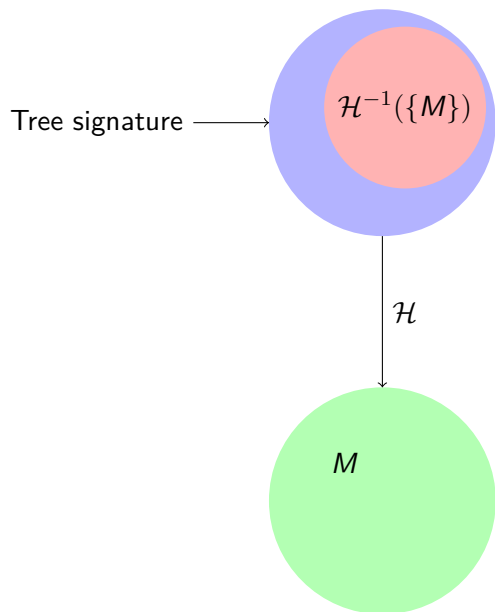
Decidability of parsing and text generation



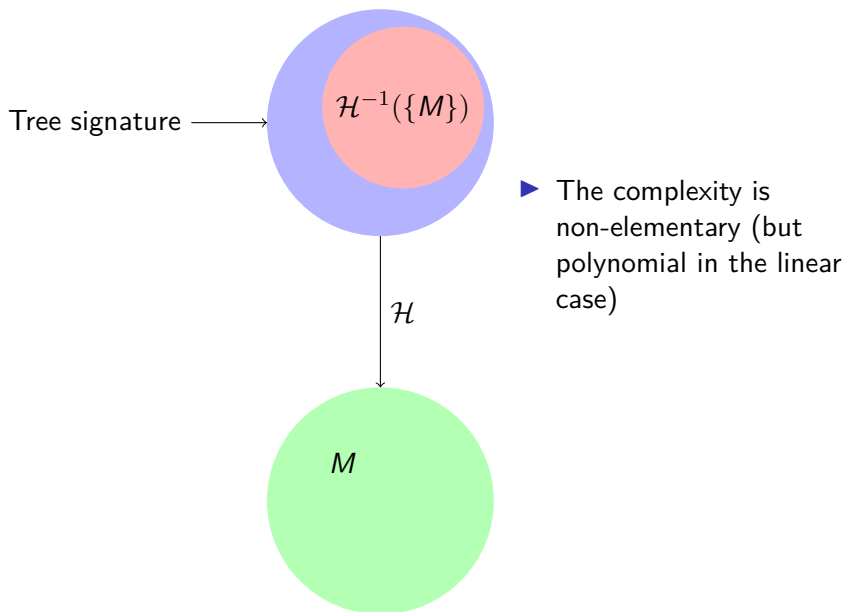
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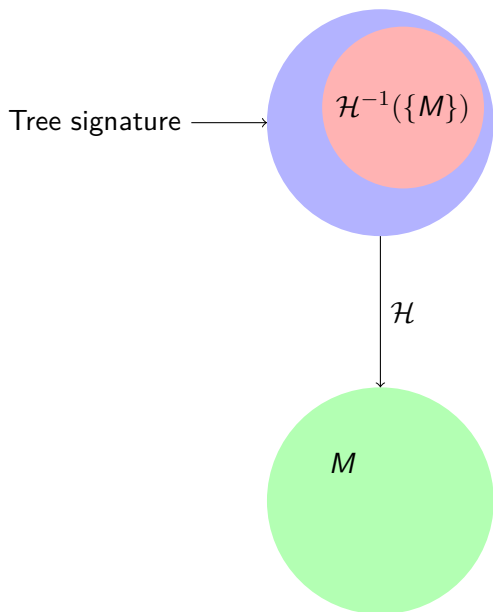
Decidability of parsing and text generation



Decidability of parsing and text generation



Decidability of parsing and text generation



- ▶ The complexity is non-elementary (but polynomial in the linear case)
- ▶ A semantic argument extends the decidability result to higher-order OI grammars [Kobele, S. 15]

Efficient algorithms

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With intentional models of λY -calculus, part of the properties can be used in parsing can be internalized in the semantics.

Infiniteness: Program Verification

Schematology

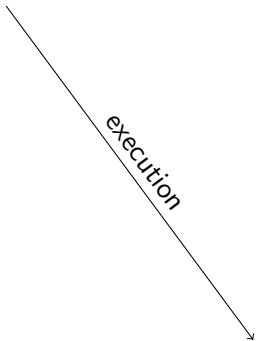
Programs

Schematology

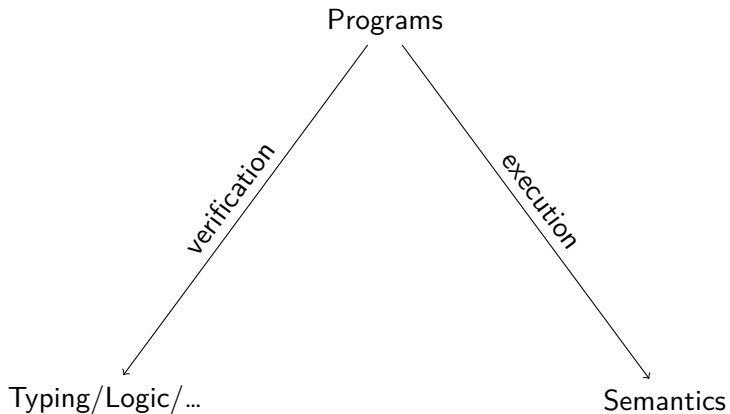
Programs

execution

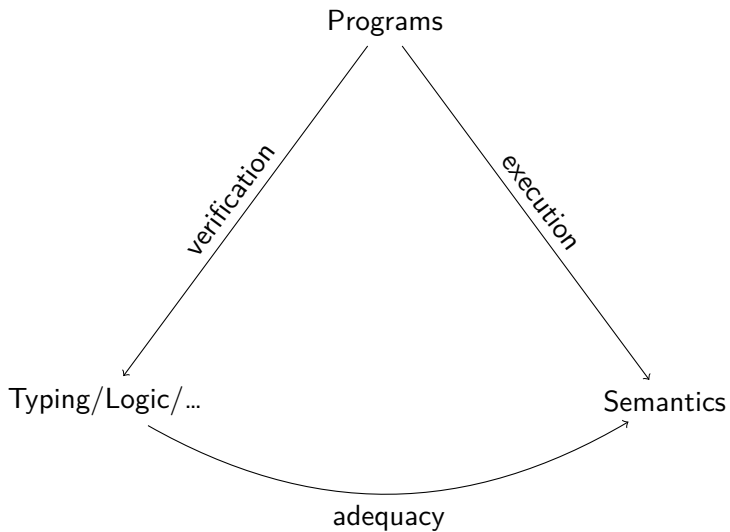
Semantics



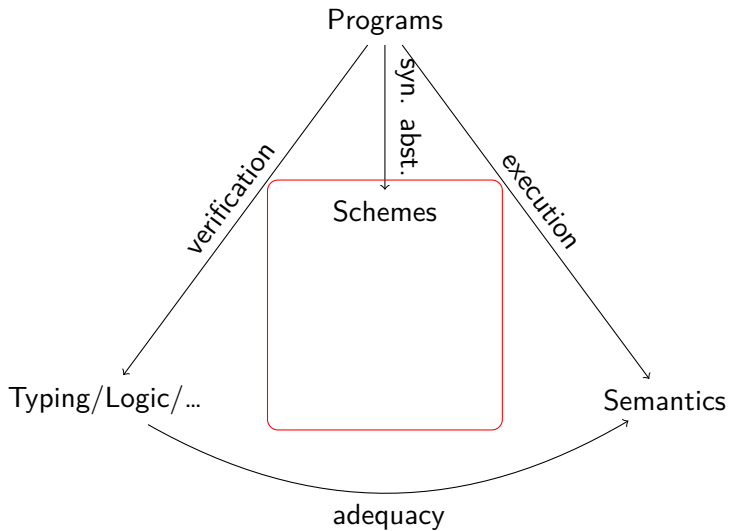
Schematology



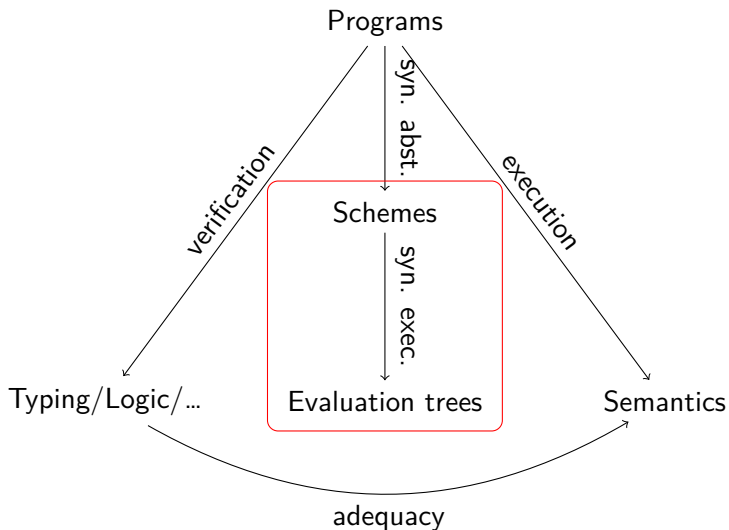
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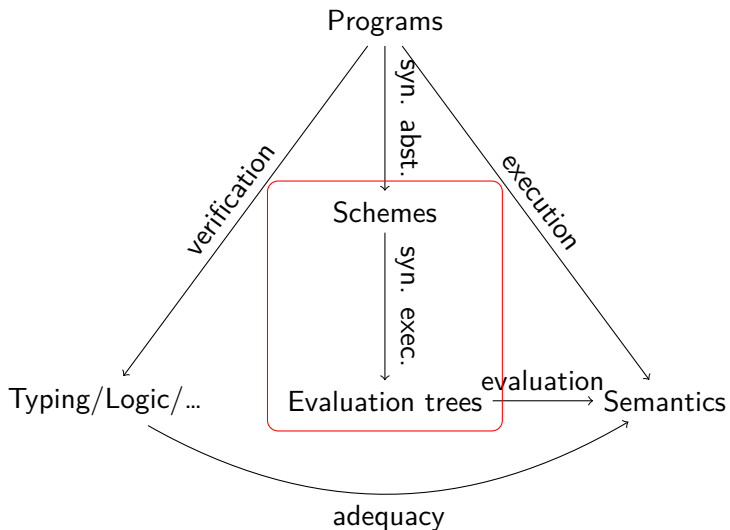
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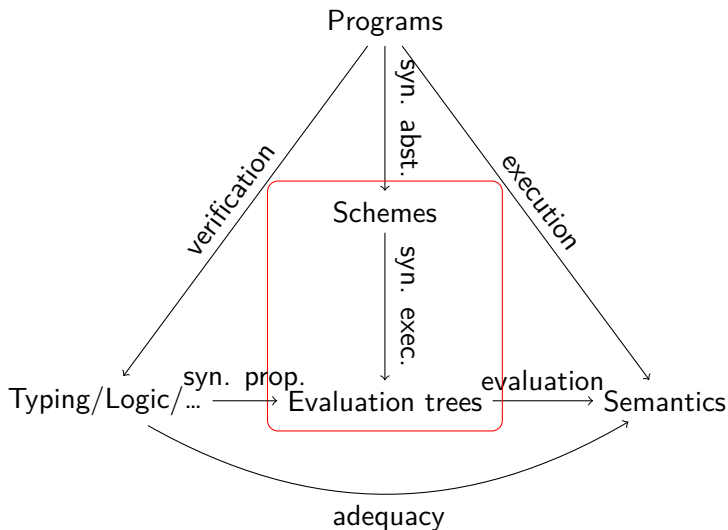
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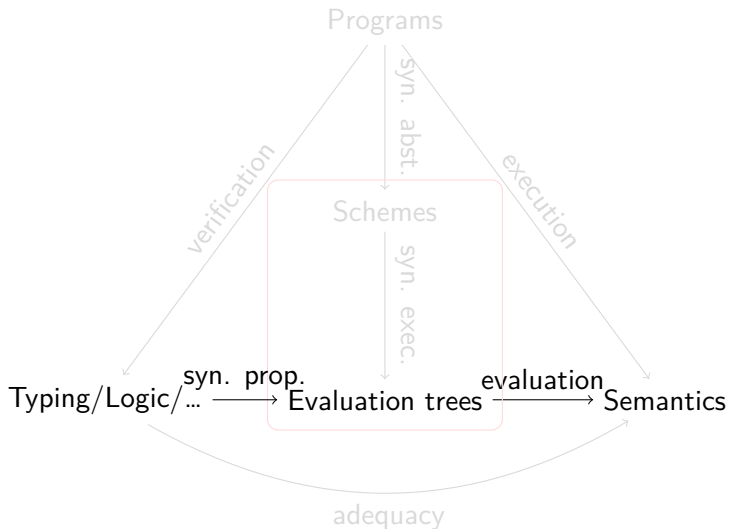
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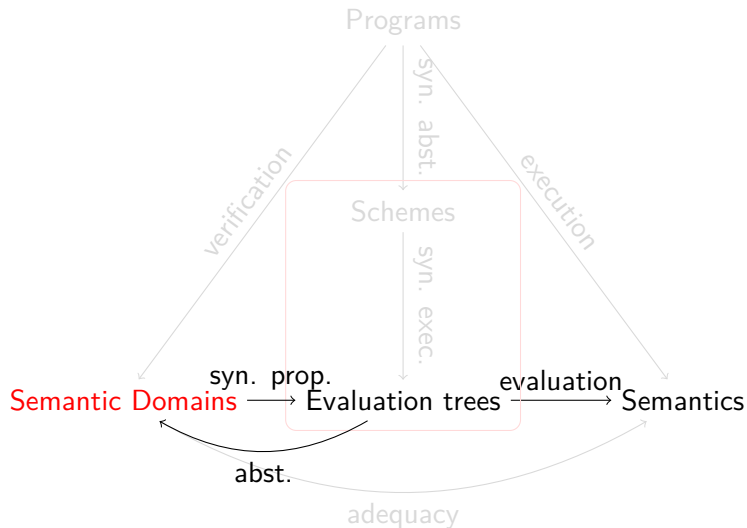
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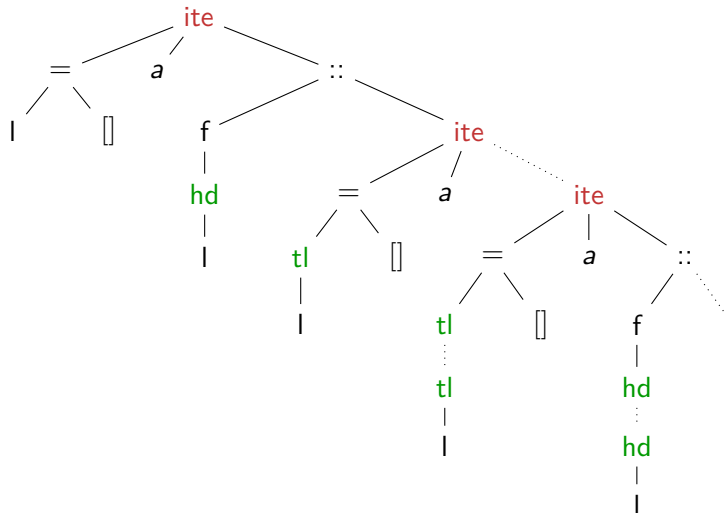


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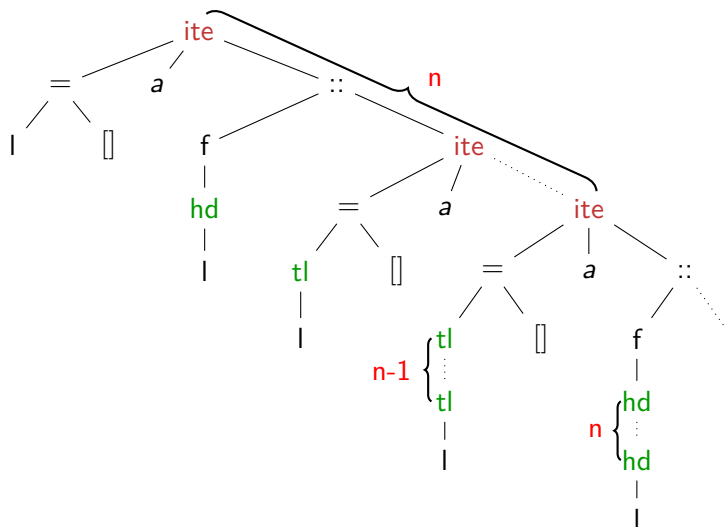
Higher-order control flow

```
fold f a l = if l==[] then a else f (hd l) (fold f a (tl l))
```

$$M = Y \lambda \text{fold } f \text{ a l.ite } (=l []) \text{ a } (f (\text{hd } l) (\text{fold } f \text{ a } (\text{tl } l)))$$


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Two kinds of properties

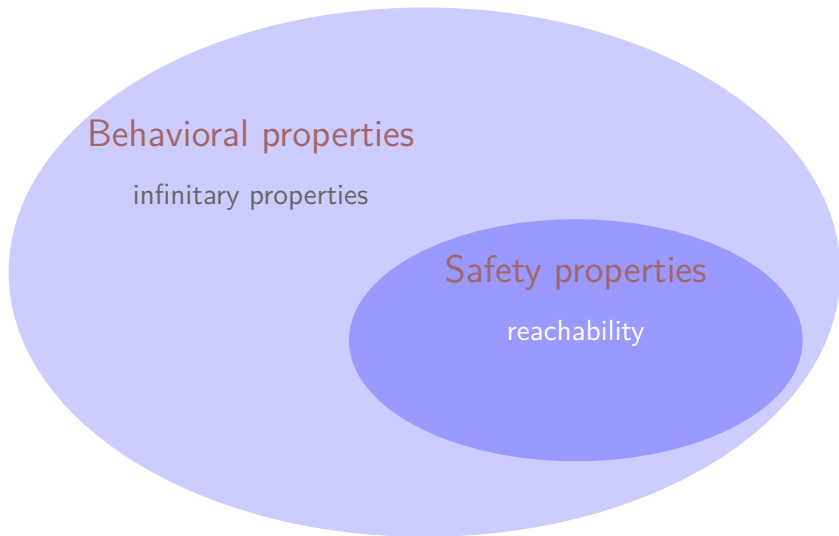
Behavioral properties

the service is always available
every query is eventually processed
etc...

Safety properties


array bounds
division by 0
etc...

Two kinds of properties



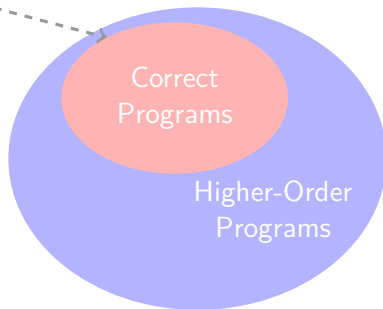
Finite abstractions

Reachability  Finite state automata

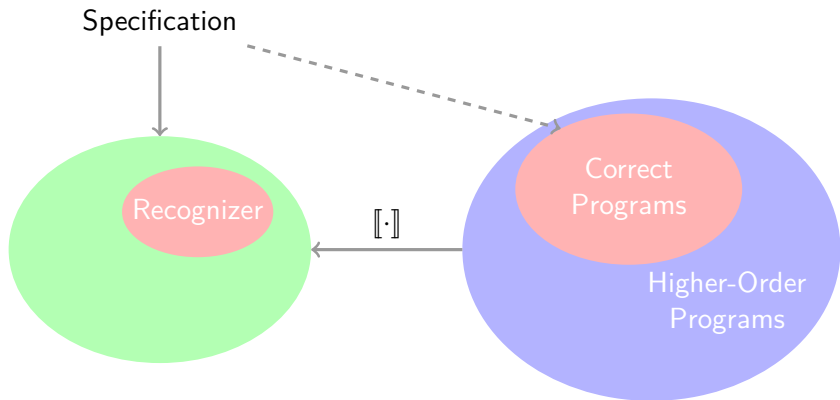
Infinitary properties  Parity automata
Monadic Second
Order Logic

Programs and recognizability

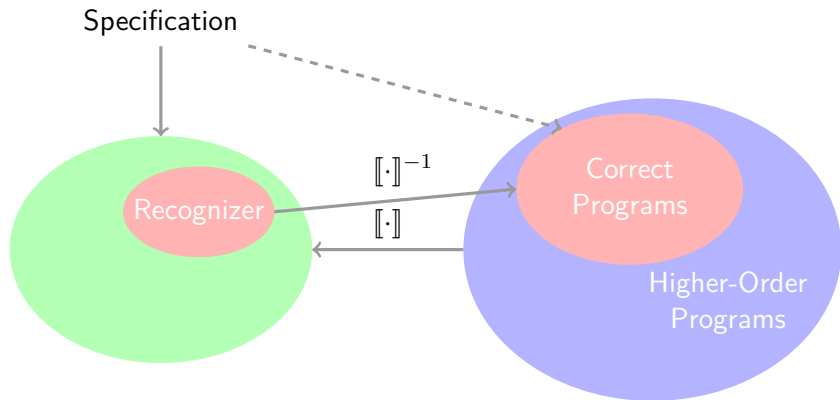
Specification



Programs and recognizability



Programs and recognizability



Motivations and results

- ▶ Relating finite state methods with denotational methods
- ▶ Reveal the invariants behind behavioral properties
- ▶ Obtain decidability results by finiteness properties

Some results:

- ▶ New proof of Ong's Theorem with Krivine Machine and semantics [Walukiewicz S. 11]
- ▶ Limitation of Scott models [Walukiewicz S. 13]
- ▶ Transfer Theorem for term evaluation [Walukiewicz S. 13]
- ▶ Finite models for weak MSOL based on wreath products of models [Walukiewicz S. 15]
- ▶ Finite models for MSOL [Walukiewicz S. 15]

Example: unfolding

$$\text{Graph} \xrightarrow{\text{unfold}} \text{Tree}$$

MSOL-compatibility of unfolding

For all Σ .

For all φ there is $\hat{\varphi}$ s.t. for all $G \in \text{Graph}(\Sigma)$:

$$G \models \hat{\varphi} \text{ iff } \text{Unf}(G) \models \varphi$$

Remark: this theorem implies Rabin's Theorem.

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Other example: Muchnik iteration.

$$M \xrightarrow{eval} BT(M)$$

Transfer Theorem

For all $\Sigma, \mathcal{T}, \mathcal{X}$.

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- ▶ Σ is a tree signature
- ▶ \mathcal{T} is a finite set of types

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- ▶ Σ is a tree signature
- ▶ \mathcal{T} is a finite set of types
- ▶ \mathcal{X} is a finite set of λ -variables

$$M \xrightarrow{eval} BT(M)$$

Transfer Theorem

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Note: no limitation on Y -variables.

Transducers

Deforestation

```
q = sum(filter p (map f l))
```

```
def query(l):  
    res = 0  
    for e in l:  
        if p(f e):  
            res += f e  
    return res
```

```
q = query(l)
```

Higher-order transducers

```
sum :: [a] -> Int
```

```
sum [] = 0
```

```
sum (n:l) = n + sum l
```

```
filter :: (a -> Bool) -> [a] -> [a]
```

```
filter p [] = []
```

```
filter p (a:as) | p a      = a : filter p as  
                | otherwise = filter p as
```

```
map :: (a -> b) -> [a] -> [b]
```

```
map _ [] = []
```

```
map f (a:as) = f a : map f as
```

The composed transducer

```
q = sum(filter p (map f l))  
query [] = 0  
query (a:as) | p(f a)      = f a + query as  
              | otherwise = query as
```

Closure of higher-order transducers under composition

- ▶ Higher-order transducers are closed under composition, provided they can inspect the input with regular properties: this implements *deforestation* in a very general setting.
- ▶ Finite models and recognizability give direct constructions of the compositions of transducers (Gallot, Lemay, S.).
- ▶ Several properties need to be investigated:
 - ▶ How complex are the regular properties to be checked on input?
 - ▶ When is the size of the composition reasonable?

We have Encouraging results for the transducers equivalent to MSOT (Gallot, Lemay, S. 20)

Perspectives

Evaluation of terms in finite models

Parsing HO Grammars
and HO verification

evaluation of higher-order
programs in finite models

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Abstract Interpretation

- ▶ abstraction refinements
- ▶ fixpoint acceleration techniques

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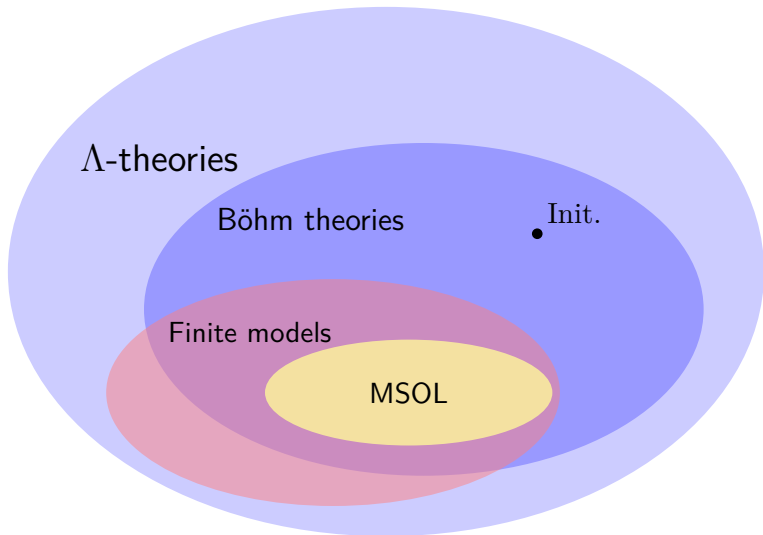
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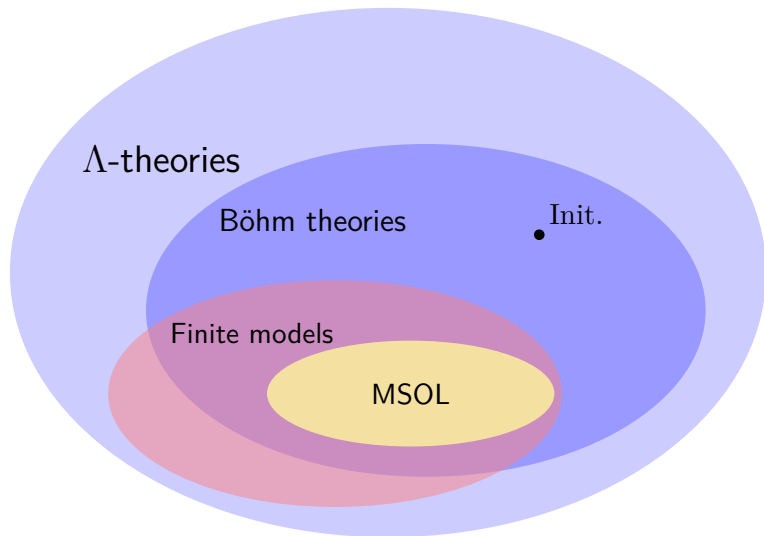
Structure of models

- ▶ sequential algorithms, etc...
- ▶ linear logic

Theory of Böhm trees

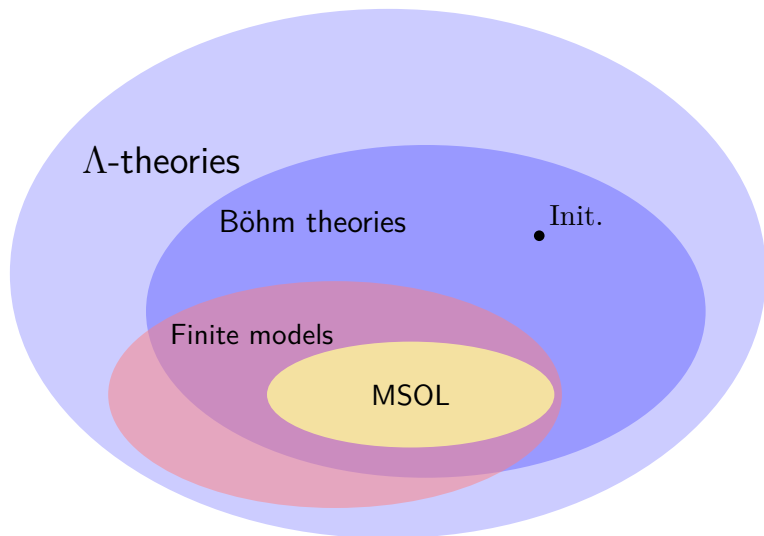


Theory of Böhm trees



- expressiveness of finite Böhm models?

Theory of Böhm trees



- ▶ expressiveness of finite Böhm models?
- ▶ axiomatization of finite Böhm models?