



Modular Implementation of Programming Languages and a Partial Order Approach to Infinitary Rewriting

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The Big Picture



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Modular Implementation of Programming Languages





Implementation of a DSL-Based ERP System

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ERP systems integrate

- Financial Management
- Supply Chain Management
- Manufacturing Resource Planning
- Human Resource Management
- Customer Relationship Management

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What do ERP systems look like under the hood?





POETS [Henglein et al. 2009]





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The abstract picture

- We have a number of domain-specific languages.
- Each pair of DSLs shares some common sublanguage.
- All of them share a common language of values.
- We have the same situation on the type level!



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The abstract picture

- We have a number of domain-specific languages.
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How do we implement this system without duplicating code?!



Library of language features



basic data structures

reading and aggregating data from the database

arithmetic operations

contract clauses

type definitions

inference rules

Library of language features



Library of language features



Constructing the DSLs



Library of language features



Constructing the DSLs

Report Language

Contract Language



Library of language features



Constructing the DSLs



Library of language features



Constructing the DSLs

Report Language	=	+	F1)	F2 F	F3
Contract Language	=	H	F1 P	F4	F3
Ontology Language	=	+	F1 F	F5	
			-	-	-

Example: Pretty Printing

Goal: functions of type $Program_L \longrightarrow String$ for each language L











Based on: Wouter Swierstra. Data types à la carte


















How does it work?



Explicit recursion

 $\begin{array}{ll} pp :: Exp \to String \\ pp (Lit i) &= show \ i \\ pp (Add \ e_1 \ e_2) &= "(" + pp \ e_1 + " + " + pp \ e_2 + ")" \\ pp (Mult \ e_1 \ e_2) &= "(" + pp \ e_1 + " * " + pp \ e_2 + ")" \end{array}$



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Non-recursive function

 $\begin{array}{ll} pp' :: Sig \ String \to String \\ pp' \ (Lit \ i) &= show \ i \\ pp' \ (Add \ e_1 \ e_2) &= "(" + e_1 + " + " + e_2 + ")" \\ pp' \ (Mult \ e_1 \ e_2) &= "(" + e_1 + " * " + e_2 + ")" \end{array}$



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Non-recursive function

 $\begin{array}{ll} pp_{1} :: Lit \; String \to String \\ pp_{1} \; (Lit \; i) &= show \; i \\ pp_{2} :: Ops \; String \to String \\ pp_{2} \; (Add \; e_{1} \; e_{2}) \; = \; "(" \; + \; e_{1} \; + \; " \; + \; e_{2} \; + \; ")" \\ pp_{2} \; (Mult \; e_{1} \; e_{2}) \; = \; "(" \; + \; e_{1} \; + \; " \; * \; " \; + \; e_{2} \; + \; ")" \end{array}$



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```

Fold

fold :: Functor
$$f \Rightarrow (f \ a \rightarrow a) \rightarrow Fix \ f \rightarrow a$$

fold f (In t) = f (fmap (fold f) t)



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Applying Fold

 $\begin{array}{l} \textit{pp} :: \textit{Fix} (\textit{Lit} :+: \textit{Ops}) \rightarrow \textit{String} \\ \textit{pp} = \textit{fold} (\textit{pp}_1 :+: \textit{pp}_2) \end{array}$

Make compositional data types more useful in practise.

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Make compositional data types more useful in practise.

Extend the class of definable types

- mutually recursive types, GADTs
- abstract syntax trees with variable binders



Make compositional data types more useful in practise.

Extend the class of definable types

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"Algebras with more structure"

- algebras with effects
- tree homomorphisms, tree automata, tree transducers
 - ▶ sequential composition ~→ program optimisation (deforestation)
 - ► tupling ~→ additional modularity

Skip details

We may compose tree automata along 3 different dimensions.

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input signature: the type of the AST

 $\llbracket \mathcal{A}_1 \rrbracket : \mu \mathcal{S}_1 \to R$ $\llbracket \mathcal{A}_2 \rrbracket : \mu \mathcal{S}_2 \to R$



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sequential composition: a.k.a. deforestation

$$\mu S_1 \xrightarrow{[\![A_1]\!]} \mu S_2 \xrightarrow{[\![A_2]\!]} \mu S_3$$

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$$\begin{split} \llbracket \mathcal{A}_1 \rrbracket : \mu \mathcal{S}_1 \to R \\ \llbracket \mathcal{A}_2 \rrbracket : \mu \mathcal{S}_2 \to R \end{split} \implies \qquad \llbracket \mathcal{A}_1 + \mathcal{A}_2 \rrbracket : \mu (\mathcal{S}_1 + \mathcal{S}_2) \to R \end{split}$$

sequential composition: a.k.a. deforestation



output type: tupling / product automaton construction

 $\llbracket \mathcal{A}_1
rbracket : \mu \mathcal{S} o \mathcal{R}_1$ $\llbracket \mathcal{A}_2
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tupling / product automaton construction

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tupling / product automaton construction

\mathcal{A}_1	:	$\mathcal{S} ightarrow \mathit{R}_1$	\Rightarrow	$\mathcal{A}_1 \times \mathcal{A}_2$:	$\mathcal{S} \rightarrow \mathcal{R}_1 \times \mathcal{R}_2$
\mathcal{A}_2	:	$\mathcal{S} ightarrow R_2$			



tupling / product automaton construction

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$$\mathcal{A}_1: \qquad \mathcal{S} \to \mathcal{R}_1$$
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tupling / product automaton construction

 $\begin{array}{cccc} \mathcal{A}_1 & : & \mathcal{S} \to \mathcal{R}_1 \\ \mathcal{A}_2 & : & \mathcal{S} \to \mathcal{R}_2 \end{array} \implies \qquad \mathcal{A}_1 \times \mathcal{A}_2 & : & \mathcal{S} \to \mathcal{R}_1 \times \mathcal{R}_2 \end{array}$

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Discussion

Advantages

- it's just a Haskell library
- uses well-known concepts (algebras, tree automata, functors etc.)
- high degree of modularity
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- learning curve
- typical drawbacks of higher-order abstract syntax



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Future work

reasoning about modular implementations

(Meta-Theory à la Carte [Delaware et al. 2013])

- describing interactions between modules
- how well does modularity scale?

And now it's time for something completely different.

Partial Order Approach to Infinitary Rewriting





What are (term) rewriting systems?

- generalisation of (first-order) functional programs
- consist of directed symbolic equations of the form $I \rightarrow r$
- semantics: any instance of a left-hand side may be replaced by the corresponding instance of the right-hand side



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Example (Term rewriting system defining addition and multiplication)

$$\mathcal{R}_{+*} = egin{cases} x+0 & o x & x*0 & o 0 \ x+s(y) & o s(x+y) & x*s(y) & o x+(x*y) \end{cases}$$



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 \mathcal{R}_{+*} is terminating!

Termination: repeated rewriting eventually reaches a normal form.

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Non-terminating systems can be meaningful

- modelling reactive systems, e.g. by process calculi
- approximation algorithms which enhance the accuracy of the approximation with each iteration, e.g. computing π
- specification of infinite data structures, e.g. streams

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Example (Infinite lists)

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from(0)

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- approximation algorithms which enhance the accuracy of the approximation with each iteration, e.g. computing π
- specification of infinite data structures, e.g. streams

Example (Infinite lists)

$$\mathcal{R}_{nats} = \left\{ from(x) \rightarrow x : from(s(x)) \right\}$$

 $from(0) \rightarrow 50:1:2:3:4:from(5)$

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intuitively this converges to the infinite list 0:1:2:3:4:5:....

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do not differ up to depth d

Example: Convergence of a Reduction



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Example: Non-Convergence of a Reduction



$$\mathcal{R} = \left\{egin{array}{l} \mathsf{a} o \mathsf{g}(\mathsf{a}) \ \mathsf{h}(\mathsf{x}) o \mathsf{h}(\mathsf{g}(\mathsf{x})) \end{array}
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$$\mathcal{R} = \begin{cases} a \to g(a) \\ h(x) \to h(g(x)) \end{cases}$$

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For every $t, t_1, t_2 \in \mathcal{T}^{\infty}(\Sigma, \mathcal{V})$ with $t_1 \leftarrow t \twoheadrightarrow t_2$ there is a $t' \in \mathcal{T}^{\infty}(\Sigma, \mathcal{V})$ with $t_1 \twoheadrightarrow t' \leftarrow t_2$

Partial Order Approach to Infinitary Term Rewriting

Partial order on terms

- partial terms: terms with additional constant \perp (read as "undefined")
- partial order \leq_{\perp} reads as: "is less defined than"
- \leq_{\perp} is a complete semilattice (= bounded complete cpo)

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Convergence

• formalised by the limit inferior:

$$\liminf_{\iota \to \alpha} t_\iota = \bigsqcup_{\beta < \alpha} \prod_{\beta \le \iota < \alpha} t_\iota$$

- intuition: eventual persistence of nodes of the terms
- convergence: limit inferior of the contexts of the reduction

An Example





An Example





. . .

An Example (h) h a h а (h)g g (h)g g g g g b а a g g g b b а b b eventually stable: g g

. . .

An Example (h) (**h**) a h а (h)g g (h)g g g g g b а a g g b b g а b b *p*-converges to g g

Properties of the Partial Order Approach

Benefits

- reduction sequences always converge (but result may contain \perp s)
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For every reduction S in a TRS, we have

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Theorem (confluence, normalisation)

Every orthogonal TRS is normalising and confluent w.r.t. p-convergent reductions, i.e. every term has a unique normal form.

Sharing – From Terms to Term Graphs

Lazy evaluation and infinitary rewriting

Skip term graphs

Lazy evaluation consists of two things:

- non-strict evaluation
- sharing

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For every left-linear, left-finite GRS ${\mathcal R}$ we have

$$\underline{\mathcal{R}}$$
 g $\xrightarrow{\rho}$ h



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Completeness of m-convergence for normalising reductions $\mathcal{U}(\mathcal{R})$ s m $t \in NF$ $\mathcal{U}(\cdot)$ \mathcal{R} g m h

Contributions

- novel approach to infinitary term rewriting
- first formalisation of infinitary term graph rewriting

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Note: Böhm reduction for TRSs

$$s \xrightarrow{p}_{\mathcal{R}} t \iff s \xrightarrow{m}_{\mathcal{B}} t$$

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Future work: Infinitary term graph rewriting

- Are orthogonal systems infinitarily confluent?
- higher-order systems (e.g. lambda calculus with letrec)



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