

A Compiled Implementation of Normalization by Evaluation

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Compute normal form of term wrt list of equations (incl β)

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Terms:

- ▶ Ground terms: $S(0) + S(0) \rightarrow^* S(S(0))$

- ▶ But also free and bound variables:

$$\lambda a.S(a) + S(b) \rightarrow^* \lambda a.S(S(a + b))$$

Normalization in Theorem Provers: Why and How

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Bypass inference kernel.

Model and verify implementation.

Untyped Normalization by Evaluation

Formalisation in Isabelle

Related and Future Work

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Handling of Variables

- ▶ “compile, evaluate, read back” works fine...
for *closed* term of *ground type*
 - ▶ But what about open terms?
 - ▶ Even closed functions can only be presented as $\lambda x.t$ with x free in t

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 - ▶ But what about open terms?
 - ▶ Even closed functions can only be presented as $\lambda x.t$ with x free in t
- ▶ So we do have to handle free variables!
 - ▶ Need a data type containing both, its own function space and free variables
 - ▶ First attempt

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- ▶ But need to implement application!
What is `(Var "x") v` supposed to mean?

Handling of Variables (cont'd)

- ▶ Have to define what an application $(\text{Var } "x") \ v$ means.

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Handling of Variables (cont'd)

- ▶ Have to define what an application $(\text{Var } "x") \ v$ means.
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datatype Univ =  
  | Var of string * Univ list  
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apply (Var x vs) v = Var x (vs @ [v])  
apply (Clo f)     v = f v
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- ▶ As Univ denotes normal terms, we can go back easily

```
term (Var x vs) = foldl Tapply (V x) (map term vs)  
term (Clo f)    = let x = new_var() in  
                  Lam x (term (f x))
```

Constructors, Arity, ...

- ▶ Fine for the pure lambda-calculus.

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- ▶ Want lambda-calculus with data constructors (0, S, ...).

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↪ Add constructors **Application?**

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datatype Univ =  
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apply (Var x vs) v = Var x (vs @ [v])  
apply (Clo f ) v = f v
```

Constructors, Arity, ...

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↪ Add constructors **Application won't cause a redex!**

```
datatype Univ =  
| C of string * Univ list  
| Var of string * Univ list  
| Clo of (Univ -> Univ)  
  
apply (Var x vs) v = Var x (vs @ [v])  
apply (C s args) v = C s (args @ [v])  
apply (Clo f ) v = f v
```

Constructors, Arity, ...

- ▶ Want lambda-calculus with data constructors (0, S, ...).
- ▶ Some functions have **higher arity**

$$\begin{aligned}\min x \quad 0 &= x \\ \min 0 \quad y &= y \\ \min (Sx) (Sy) &= S(\min x y)\end{aligned}$$

↪ Add constructors

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datatype Univ =  
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↪ Add constructors, allow n -ary functions

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Constructors, Arity, ...

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$$\begin{aligned}\min x \quad 0 &= x \\ \min 0 \quad y &= y \\ \min (Sx) (Sy) &= S(\min x y)\end{aligned}$$

↪ Add constructors, allow n -ary functions, **partially applied**

```
datatype Univ =  
| C of string * Univ list  
| Var of string * Univ list  
| Clo of int * (Univ list -> Univ) * Univ list
```

```
apply (Var x vs) v = Var x (vs @ [v])  
apply (C s args) v = C s (args @ [v])  
apply (Clo 0 f vs) v = f (vs @ [v])  
apply (Clo n f vs) v = Clo (n-1) f (vs @ [v])
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- ▶ Just match against the constructors in Univ

```
fun apd [C "Nil" [],      bs] = bs
  | apd [C "Cons" [a, as], bs] = C "Cons" [a, apd as bs]
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apd Nil bs = bs
apd (Cons a as) bs = Cons a (apd as bs)
```

- ▶ Just match against the constructors in Univ
Not exhaustive!! *E.g., we have Var "x".*

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fun apd [C "Nil" [], bs] = bs
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- ▶ Just match against the constructors in Univ
and add a default clause

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fun apd [C "Nil" [],      bs] = bs
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```

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- ▶ Example **with rewrite rule**

$$\begin{aligned} \text{apd } \text{Nil} \quad \quad \quad \text{bs} &= \text{bs} \\ \text{apd } (\text{Cons } a \text{ as}) \text{ bs} &= \text{Cons } a (\text{apd } as \text{ bs}) \end{aligned}$$
$$\text{apd } (\text{apd } as \text{ bs}) \text{ cs} = \text{apd } as (\text{apd } bs \text{ cs})$$

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- ▶ Just match against the constructors in Univ
and add a default clause
- ▶ For rewrite rules, *match against the function "constructors"*

```
fun apd [C "Nil" [],      bs] = bs
|   apd [C "Cons" [a, as], bs] = C "Cons" [a, apd as bs]
|   apd [C "apd" [as, bs], cs] =
    apd [as, apd [bs, cs]]
|   apd [as,              bs] = C "apd" [as, bs]
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Related and Future Work

Models of ML-Terms and λ -Terms

We use de Bruijn indices.

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$$\begin{array}{l} ml = C \text{ cname} \\ | V \text{ nat} \\ | A \text{ ml (ml list)} \\ | Lam \text{ ml} \end{array}$$

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| **A** *ml (ml list)*
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| **Clo** *ml (ml list) nat*
| **apply** *ml ml*

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Abstract λ -terms:

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$$\frac{(c, ts, t) \in R}{C\ c \bullet\bullet\ map\ (subst\ \sigma)\ ts \rightarrow subst\ \sigma\ t}$$

where $t \bullet\bullet [t_1, \dots, t_n] = t \bullet t_1 \bullet \dots \bullet t_n$

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- ▶ Reductions for $apply$, eg

$$apply\ (C\ l\ o\ 0\ f\ vs)\ v \Rightarrow\ A\ f\ (vs@[v])$$

Reduction \Rightarrow on ML-terms

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- ▶ rewriting wrt *compR* :: (cname \times ml list \times ml) set

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- ▶ Reductions for *apply*, eg

$$\text{apply (Clo 0 } f \text{ vs)} v \Rightarrow A f (vs@[v])$$

- ▶ Reductions for *term*, eg

$$\begin{aligned} &\text{term (Clo } f \text{ vs } n) \Rightarrow \\ &\lambda(\text{term (apply (lift 0 (Clo } f \text{ vs } n)) (\text{Var 0 []}))) \end{aligned}$$

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Rule compilation:

$$\mathit{comp}R = \dots \mathit{comp-open} \dots R \dots$$

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then $t \rightarrow^* t'$

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Main proof:	40%

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- ▶ Does not perform proofs, hence verification
- ▶ Typical performance figures:
 - 100 × faster than simplifier
 - 10 × slower than direct compilation to ML

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Related and Future Work

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Berger, Eberl & Schwichtenberg [98/03]

Compiled NbE in Scheme/MINLOG

Kernel extension

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Grégoire & Leroy [ICFP 02]

Abstract machine for fast normalization in Coq

Kernel extension

Verified

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