

# The cost of usage in the $\lambda$ -calculus

Andrea Asperti<sup>1</sup>    Jean-Jacques Lévy<sup>2</sup>

<sup>1</sup>DISI, University of Bologna  
Mura Anteo Zamboni 7, 40127, Bologna, ITALY  
Email: [asperti@cs.unibo.it](mailto:asperti@cs.unibo.it)

<sup>2</sup>INRIA Paris-Rocquencourt  
Le Chesnay, France  
Email: [jean-jacques.levy@inria.fr](mailto:jean-jacques.levy@inria.fr)

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- ▶ A  $\lambda$ -term has a normal form if and only if its leftmost outermost (normal) reduction is finite.
- ▶ The normal reduction  $\sigma_s$  can be much longer (a **double-exponential**, in the worst case) than the shortest reduction  $\sigma$ :

$$|\sigma_s| \leq |M|^{2^{|\sigma|}}$$

where  $M$  is the initial term

- ▶ In this paper, we prove that, in many interesting cases, we can reduce this bound to a mere **factorial**:

$$|\sigma_s| \leq |\sigma|!$$

# Content

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Standardization

General ideas

Minimal prefixes

Main results

Conclusions

A reduction  $M_0 \xrightarrow{R_1} M_1 \xrightarrow{R_2} \dots \xrightarrow{R_k} M_k \xrightarrow{R_{k+1}} \dots$  is **standard** when for any  $i, j$  such that  $1 \leq i < j$ , the redex  $R_j$  is not residual of a redex in  $M_{i-1}$  to the left of  $R_i$ .

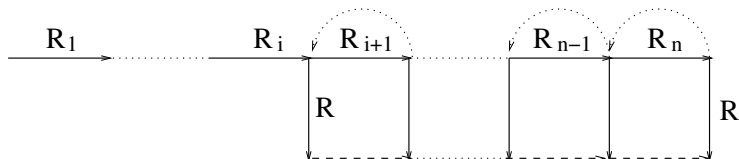
## Standardization theorem [Curry & Feys [10]]

For any reduction  $\sigma : M \twoheadrightarrow N$  there exists a *standard* reduction between the same terms.

**Corollary:** a term  $M$  has a normal form *if and only if* the leftmost reduction sequence originated by  $M$  is finite (normalization theorem).

Lots of proofs: Mitschke [21], Klop [15], Barendregt [7]; Gonthier et al. [12], ...

A recent “inductive” approach by Xi [25] allows to compute an upper bound for the length of the standard reduction.



See also Kashima [14] and Guidi [13].

## Xi's upper bound

The **multiplicity**  $m(R)$  of a redex  $R = (\lambda x.M)N$  is the number of occurrences of  $x$  in  $M$ .

### Standardization - Xi [25]

Let  $\sigma = R_0 R_1 \dots R_n$  be an arbitrary reduction; then there exists a standard reduction  $\sigma_s$  such that

$$|\sigma_s| \leq (1 + \max\{m(R_1), 1\}) \cdots (1 + \max\{m(R_n), 1\}) \quad (1)$$

The multiplicity of a redex  $R_i$  is bound by the size  $|M_i|$  of the term it belongs to, and the size of  $M_i$  is at most a double exponential  $|M|^{2^i}$  of the size of the initial term  $M = M_0$ , so

$$|\sigma_s| \leq |M|^{2^1} \cdots |M|^{2^{n-1}} < |M|^{2^n} \quad (2)$$

## Example

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Let  $S = \lambda x.xx(xx)$ ,  $I = \lambda x.x$ ,  $K = \lambda x,y.x$ ,  $P = IK$ . Then,

$$SP \xrightarrow{R_0} SK \xrightarrow{R_1} KK(KK) \xrightarrow{R_2} (\lambda y.K)(KK) \xrightarrow{R_3} K$$

$$m(R_0) = 1, m(R_1) = 4, m(R_2) = 1, m(R_3) = 0$$

Xi's-bound:  $5 \times 2 \times 2 = 20$ .

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- ▶ a framework for studying what is live (needed) or dead (useless) inside a lambda term:

minimal prefixes

- ▶ a bound for the live multiplicity of redexes.  
The size of minimal prefixes can grow very fast, but can only

decrease very slowly

Do not count the cost for **producing** a term, but for **consuming** it.

We consider terms with holes  $\_$ .

Given two terms  $M$  and  $N$ ,  $M$  is a prefix of  $N$  ( $M \preceq N$ ) if  $N$  matches  $M$  except on  $\_$  subterms.

## Stability theorem [Berry[9],Plotkin[22]]

For any term  $M$  producing a normal form  $A$ , there exists a **unique** minimum prefix  $[M]_A$  of  $M$  producing  $A$ .

(can be generalized to an arbitrary rigid prefix  $A$ : see the paper).

Let  $M$  be a term producing  $A$ .

- ▶ a subterm  $P$  of  $M$  is **live (for  $A$ )** in  $M$  if (the root of)  $P$  belongs to  $\llbracket M \rrbracket_A$
- ▶ the **live multiplicity**  $m(R)$  of a redex  $(\lambda x.P)Q$  in a term  $M$  is the number of live occurrences of  $x$  (that is the number of occurrences of  $x$  in  $\llbracket M \rrbracket_A$ ).

**Example** Let  $M = (\lambda f. ff(f\Delta))(\lambda x.I) \rightarrow I$ ; then

$$\llbracket M \rrbracket_I = (\lambda f.f_-(f_-))(\lambda x.I)$$

The subterm  $\Delta$  is dead for  $I$  in  $M$ , as well as the second occurrence of  $f$ ; so the live multiplicity of  $f$  is 2.

## Definition

(applicative size) The applicative size  $|M|_{@}$  of a  $\lambda$ -term  $M$  is the number of applications in it.

## Lemma

(@-survival) Suppose  $R : M \rightarrow N$ ; if  $P$  is a live applicative subterm of  $M$ , and  $P \neq R$ , then it has at least one live residual in  $N$ .

## Lemma

(@ slow consumption) For any rigid prefix  $A$  produced by  $M$ , if  $R : M \rightarrow N$ , then

$$|[N]_A|_{@} \geq |[M]_A|_{@} - 1$$

## Examples: @-size of minimal prefixes

red.	$(\lambda f.f f (f \Delta))(\lambda x.I) \rightarrow (\lambda x.I)(\lambda x.I)((\lambda x.I)\Delta) \rightarrow (\lambda x.I)(\lambda x.I)I \rightarrow II \rightarrow I$
min.pref.	$(\lambda f.f _ (f _))(\lambda x.I) \quad (\lambda x.I)_ _ ((\lambda x.I)_ _) \quad (\lambda x.I)_ _ I \quad II \quad I$
@-size	$4 \quad 3 \quad 2 \quad 1 \quad 0$

red.	$(\lambda x.xx (xx))(IK) \rightarrow (\lambda x.xx(xx))K \rightarrow KK(KK) \rightarrow (\lambda y.K)(KK) \rightarrow K$
min.pref.	$(\lambda x.xx _)(IK) \quad (\lambda x.xx _)K \quad KK _ \quad (\lambda y.K)_ _ \quad K$
@-size	$4 \quad 3 \quad 2 \quad 1 \quad 0$

reduction	$(\lambda x.xxx)(KI) \rightarrow (\lambda x.xxx)(\lambda y.I) \rightarrow (\lambda y.I)(\lambda y.I)(\lambda y.I) \rightarrow I(\lambda y.I) \rightarrow \lambda y.I$
min.pref.	$(\lambda x.x _ x)(KI) \quad (\lambda x.x _ x)(\lambda y.I) \quad (\lambda y.I)_ _ (\lambda y.I) \quad I(\lambda y.I) \quad \lambda y.I$
@-size	$4 \quad 3 \quad 2 \quad 1 \quad 0$

## Theorem

*Given a reduction  $\sigma : M \twoheadrightarrow N$ , where  $\sigma = R_0 R_1 \dots R_n$  and any term  $A$  produced by  $M$  (and  $N$ ), there exists a standard reduction  $\text{std}(\sigma) : M \xrightarrow{\text{st}} P$  such that  $P \approx_A N$  and*

$$|\text{std}(\sigma)| \leq (1 + \max\{m(R_1), 1\}) \dots (1 + \max\{m(R_n), 1\})$$

*where  $m(R_i)$  is the multiplicity of  $R_i : M_i \rightarrow M_{i+1}$  in  $\lfloor M_i \rfloor_A$  (that is, we only count the variables which are live for  $A$ ).*

## Lemma

Let  $\sigma : M \rightarrow N$  and let  $A$  be a rigid prefix of  $N$ . Then, for any variable  $x$  in  $M$ , if  $m(x)$  is its live multiplicity (for  $A$ ) we have

$$m(x) \leq |\sigma| + |A|_{\text{@}} + 1$$

## Theorem

Let  $\sigma : M \xrightarrow{\text{st}} N$  and let  $A$  be a rigid prefix of  $N$ . Then there exists a standard reduction  $\sigma_s : M \rightarrow B$  such that  $B \approx_A N$  and

$$|\sigma_s| \leq \frac{(|\sigma| + |A|_{\text{@}})!}{(1 + |A|_{\text{@}})!}$$

## Corollary

Let  $M$  be a term having  $N$  as a normal form. Let  $\sigma : M \xrightarrow{st} N$  be an arbitrary reduction. Then there exists a standard reduction  $\sigma_s : M \rightarrow N$  such

$$|\sigma_s| \leq \frac{(|\sigma| + |N|_{\text{⑥}})!}{(1 + |N|_{\text{⑥}})!}$$

The previous theorem is particularly significant when  $N$  is small:

## Corollary

If  $M$  is a term reducing to a variable or a boolean ( $\lambda x.\lambda y.x$  or  $\lambda x.\lambda y.y$ ), the length of the normal reduction  $\sigma_n$  is at worst a factorial of the length of the best reduction  $\sigma$ , that is

$$|\sigma_n| \leq (|\sigma|)!$$



# Conclusions

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## Preliminary considerations

- ▶ weak reduction is very similar to first order reduction;
- ▶ the **computational** interest of beta-reduction (if any) lies in deep reduction (need to *share* inside lambdas);
- ▶ we know examples of lambda terms where deep reduction works **exponentially** better than the **best** weak reduction strategy (see Asperti&Guerrini[4]);

By the results in this paper:

- ▶ either we cannot expect much better speed-ups
- ▶ or these cannot be observed sticking to the realm of lambda terms and its sequential reduction strategies (need more parallelisms/sharing).

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