

# A Characterization of Lambda-terms Transforming Numbers

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# Representing numbers in $\lambda$ -terms

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In this talk we consider simply-typed  $\lambda$ -calculus (sorts are of the form  $\tau \rightarrow \sigma$  constructed out of a base sort  $o$ ).

The sort of “numbers” is  $\mathbb{N} = (o \rightarrow o) \rightarrow o \rightarrow o$ .

In fact every closed  $\beta$ -normalized term of this sort represents some number.

## Higher-order functions on numbers

We can construct higher-order functions operating on numbers,  
for example:

$$g(f) = n_1 + f(n_2 + f(n_3 + f(\dots + f(n_k) \dots)))$$

Goal of this work: characterize all such functions.

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What if it is enough to approximate the result?

We can take

$$g'(f) = n_1 + f(m) \quad \text{where } m = n_2 + \dots + n_k \quad (\text{assume } n_i > 0)$$

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e.g. for  $f(x) = 2 * x$  we have  $g'(f) \leq g(f) \leq g'(f) * 2^{g'(f)}$

We have similar relationship for each fixed  $f$  (depending on  $f$ , but not on the numbers used in  $g/g'$ ).

## Contribution

We prove that for every sort, eg.  $((((0 \rightarrow 0) \rightarrow 0 \rightarrow 0) \rightarrow ((0 \rightarrow 0) \rightarrow 0 \rightarrow 0)) \rightarrow ((0 \rightarrow 0) \rightarrow 0 \rightarrow 0))$  there are finitely many types (shapes) of functions, each of them using a fixed amount of natural numbers.

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## Compositionality

types( $M$ ), types( $N$ )  $\longrightarrow$  types( $M\ N$ ), linear transformation  $L$

$\text{vec}(M\ N) = L(\text{vec}(M), \text{vec}(N))$

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$\text{vec}(M N) = L(\text{vec}(M), \text{vec}(N))$

For a term  $M$  of sort  $\text{IN} = (o \rightarrow o) \rightarrow o \rightarrow o$  representing a number  $n$ , a number  $m$  in  $\text{vec}(M)$  approximates  $n$ :

$$m \leq H(n) \text{ and } n \leq H(m)$$

for a fixed (but fast-growing) function  $H$

Remark: Our result holds for every representation of natural numbers in lambda-terms

## Consequences: representing tuples

We can represent pairs of numbers (in terms of type  $(\mathbb{N} \rightarrow \mathbb{N} \rightarrow \mathbb{N}) \rightarrow \mathbb{N}$ ):

$$[(n_1, n_2)] = \lambda f. f [n_1] [n_2]$$

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constructor of pairs:

$$\text{pair} = \lambda n_1. \lambda n_2. \lambda f. f n_1 n_2$$

extractors:

$$\text{ext}_1 = \lambda p. p (\lambda x. \lambda y. x)$$

$$\text{ext}_2 = \lambda p. p (\lambda x. \lambda y. y)$$

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it holds:

$$\text{ext}_1 (\text{pair } n_1 n_2) \rightarrow_{\beta} n_1$$

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In a similar way we can represent triples, quadruples, ...

But (with such standard representation) for tuples of bigger arities we need to use terms of a more complicated sorts.

**Natural question:**

Maybe in terms of some sort  $\tau$  we can represent arbitrarily long tuples (arrays) of integers?

## Consequences: representing tuples

### Natural question:

Maybe in terms of some sort  $\tau$  we can represent arbitrarily long tuples (arrays) of integers?

What would it mean?

Of course we can represent  $k$  numbers in this way:

$$[(n_1, n_2, \dots, n_k)] = \lambda f. f n_1 (f n_2 (\dots (f n_{k-1} n_k) \dots))$$

but the numbers cannot be extracted...

## Consequences: representing tuples

### Natural question:

Maybe in terms of some sort  $\tau$  we can represent arbitrarily long tuples (arrays) of integers?

It would mean that:

For each  $k$  there exist closed terms

$$ktuple : \mathbb{N} \rightarrow \mathbb{N} \rightarrow \dots \rightarrow \mathbb{N} \rightarrow \tau$$

$$kext_1, \dots, kext_k : \tau \rightarrow \mathbb{N}$$

such that

$$\forall i \quad kext_i (ktuple \ n_1 \ n_2 \ \dots \ n_k) \rightarrow_{\beta} n_i$$

## Consequences: representing tuples

### Natural question:

Maybe in terms of some sort  $\tau$  we can represent arbitrarily long tuples (arrays) of integers?

It would mean that (a weaker statement):

For each  $k$  there exist closed terms

$$kext_1, \dots, kext_k : \tau \rightarrow \mathbb{N}$$

and for all  $n_1, n_2, \dots, n_k \in \mathbb{N}$  there exists a closed term  $T$  of type  $\tau$  (a representation of this tuple) such that

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### Theorem 1

The answer is NO – such type  $\tau$  does not exist.

## Another point of view

Consider the equivalence relation  $\sim$  on terms of the same sort  $\tau \rightarrow \mathbb{N}$ :

$K \sim L$  if for each sequence  $N_1, N_2, \dots$  of terms of sort  $\tau$ ,

seq.  $KN_1, KN_2, \dots$  is bounded  $\Leftrightarrow$  seq.  $LN_1, LN_2, \dots$  is bounded

e.g.  $(\lambda n. n)$  and  $(\lambda n. \text{add } n \ n)$  are equivalent.

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### **Theorem 2.**

For each sort  $\tau$  the relation  $\sim$  has finitely many equivalence classes.

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### **Theorem 2.**

For each sort  $\tau$  the relation  $\sim$  has finitely many equivalence classes.

Theorem 1 follows immediately from Theorem 2: the extractors cannot be equivalent, so length of representable tuples is not greater than the number of equivalence classes of  $\sim$ .

(Longer tuples cannot be represented even when we allow approximate extraction, up to some error).

## Another point of view

Consider the equivalence relation  $\sim$  on terms of the same sort  $\tau \rightarrow \mathbb{N}$ :

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### Theorem 2.

For each sort  $\tau$  the relation  $\sim$  has finitely many equivalence classes.

Proof of Theorem 2: if  $\text{types}(K) = \text{types}(L)$ , then  $K \sim L$ .

Take  $K, L$  such that  $\text{types}(K) = \text{types}(L)$ , and take  $N_1, N_2, \dots$  such that seq.  $KN_1, KN_2, \dots$  is bounded. Goal: seq.  $LN_1, LN_2, \dots$  is bounded.

W.l.o.g.  $\text{types}(N_1) = \text{types}(N_2) = \dots$

value of  $KN_j \approx$  a number in  $\text{vec}(KN_j)$ ,

value of  $LN_j \approx$  a number in  $\text{vec}(LN_j)$ ,

$\text{vec}(KN_j) = \text{Lin}(\text{vec}(K), \text{vec}(N_j)) \approx \text{Lin}(\text{vec}(L), \text{vec}(N_j)) = \text{vec}(LN_j)$

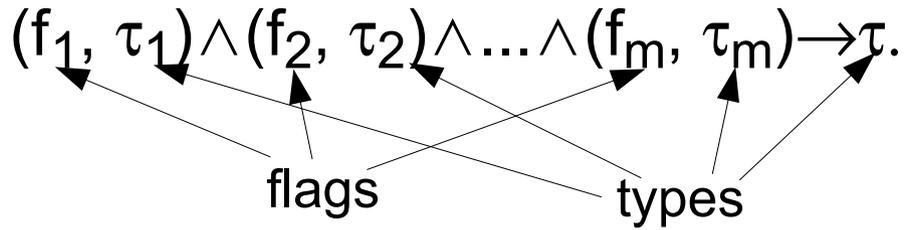
(where  $\text{Lin}$  is determined by  $\text{types}(K)$  and  $\text{types}(N_1)$  – the same for each  $j$ )

Thus  $LN_1, LN_2, \dots$  is bounded.

# Techniques used

Intersection type system:

- Intersection types refine sorts (simple types).
- To a term we assign a pair (flag, type), where  $\text{flag} \in \{\text{pr}, \text{np}\}$  (“productive”, “nonproductive”).
- One base type:  $\text{o}$ .
- The types are of the form  $(f_1, \tau_1) \wedge (f_2, \tau_2) \wedge \dots \wedge (f_m, \tau_m) \rightarrow \tau$ .



To one term we may assign multiple pairs (flag, type).

## Intersection types

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The diagram illustrates the structure of the type expression  $(f_1, \tau_1) \wedge (f_2, \tau_2) \wedge \dots \wedge (f_m, \tau_m) \rightarrow \tau$ . The word "flags" is positioned below the expression, with three arrows pointing to the function symbols  $f_1$ ,  $f_2$ , and  $f_m$ . The word "types" is also positioned below the expression, with four arrows pointing to the type symbols  $\tau_1$ ,  $\tau_2$ ,  $\tau_m$ , and the final result type  $\tau$ .

When a term  $M$  has such type, it means that if to the argument of the function  $M$  we can assign all pairs  $(f_1, \tau_1)$ ,  $(f_2, \tau_2)$ , ...,  $(f_m, \tau_m)$ , then the result has type  $\tau$ .

Moreover  $M$  is required to use its argument in each of these types (we have type  $\top \rightarrow \tau$  (with  $m=0$ ) when the argument is not used at all).

Thus we know precisely which arguments are used and with which types.

## Intersection types

Beside of a type, to a term  $M$  we also assign a flag.

Flag “productive” means that  $M$  adds something to the resulting value (in addition to the value supported by the arguments):

–  $M$  is productive when it uses some of its productive arguments more than once (we look at the derivation tree, not at the term itself).

e.g.  $F = (\lambda f. \lambda x. f (f x))$  is productive for productive  $f$

because if  $f$  adds 1, then  $(F f x)$  is bigger than  $(f x)$

but  $F = (\lambda f. \lambda x. f x)$  is nonproductive (even when  $f$  is productive),  
because  $(F (F (F f))) = f$ .

To one term we may assign multiple pairs (flag, type).

# Typing rules

$$\frac{\alpha = \overbrace{o \rightarrow \cdots \rightarrow o}^k \rightarrow o}{\emptyset \vdash \mathbf{c}^\alpha : (\text{pr}, \underbrace{(\text{pr}, o) \rightarrow \cdots \rightarrow (\text{pr}, o)}_k \rightarrow o)} \quad x : (f, \tau) \vdash x : (\text{np}, \tau)$$

$$\frac{\Gamma \cup \{x : (f_i, \tau_i) \mid i \in I\} \vdash M : (f, \tau) \quad x \notin \text{dom}(\Gamma)}{\Gamma \vdash \lambda x.M : (f, \bigwedge_{i \in I} (f_i, \tau_i) \rightarrow \tau)} \quad (\lambda)$$

$$\frac{\Gamma \vdash M : (f', \bigwedge_{i \in I} (f_i^\bullet, \tau_i) \rightarrow \tau) \quad \Gamma_i \vdash N : (f_i^\circ, \tau_i) \text{ for each } i \in I}{\Gamma \cup \bigcup_{i \in I} \Gamma_i \vdash MN : (f, \tau)} \quad (@)$$

where in the (@) rule we assume that

- each pair  $(f_i^\bullet, \tau_i)$  is different (where  $i \in I$ ), and
- for each  $i \in I$ ,  $f_i^\bullet = \text{pr}$  if and only if  $f_i^\circ = \text{pr}$  or  $\Gamma_i \upharpoonright_{\text{pr}} \neq \emptyset$ , and
- $f = \text{pr}$  if and only if  $f' = \text{pr}$ , or  $f_i^\circ = \text{pr}$  for some  $i \in I$ , or  $|\Gamma \upharpoonright_{\text{pr}}| + \sum_{i \in I} |\Gamma_i \upharpoonright_{\text{pr}}| > |(\Gamma \cup \bigcup_{i \in I} \Gamma_i) \upharpoonright_{\text{pr}}|$ .

## Typing rules - example

$$b_x = x : (\text{pr}, o)$$

$$b_y = y : (\text{pr}, (\text{pr}, o) \rightarrow o)$$

$$\frac{b_y \vdash y : (\text{np}, (\text{pr}, o) \rightarrow o) \quad b_x \vdash x : (\text{np}, o)}{b_x, b_y \vdash y x : (\text{np}, o)} \text{ (@)}$$
$$\frac{b_x, b_y \vdash y (y x) : (\text{pr}, o)}{b_y \vdash \lambda x. y (y x) : (\text{pr}, (\text{pr}, o) \rightarrow o)} \text{ (\lambda)}$$
$$\frac{b_y \vdash \lambda x. y (y x) : (\text{pr}, (\text{pr}, o) \rightarrow o)}{\vdash \lambda y. \lambda x. y (y x) : (\text{pr}, (\text{pr}, (\text{pr}, o) \rightarrow o) \rightarrow (\text{pr}, o) \rightarrow o)} \text{ (\lambda)}$$

$$b'_y = y : (\text{pr}, (\text{pr}, o) \rightarrow o)$$

$$\frac{b'_y \vdash y : (\text{np}, (\text{pr}, o) \rightarrow o) \quad b_x \vdash x : (\text{np}, o)}{b_x, b'_y \vdash y x : (\text{np}, o)} \text{ (@)}$$
$$\frac{b_x, b'_y \vdash y (y x) : (\text{np}, o)}{b'_y \vdash \lambda x. y (y x) : (\text{np}, (\text{pr}, o) \rightarrow o)} \text{ (\lambda)}$$
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## Techniques used

Step 2: count “how much a term is productive”.

To each typed term  $M$  (in fact to a derivation tree for  $M:(f,\tau)$ ) we assign a number  $\text{val}(M,\tau)$ , which counts:

- the number of application subterms  $KL$  such that a productive variable is used both in  $K$  and in  $L$ .

Easy observation – compositionality:

For closed terms it holds

$$\text{val}(KL,\tau) = \text{val}(K,(f_1, \tau_1) \wedge \dots \wedge (f_m, \tau_m) \rightarrow \tau) + \text{val}(L, \tau_1) + \dots + \text{val}(L, \tau_m).$$

Quite difficult lemma:

For closed terms  $M \rightarrow_{\beta} N$  of base sort it holds

$$\text{val}(M,o) \leq \text{val}(N,o) \leq 2^{\underbrace{2^{\dots 2}}_{\text{val}(M,o)}} \text{val}(M,o)$$

## Techniques used

Quite difficult lemma:

For closed terms  $M \rightarrow_{\beta} N$  of base sort it holds

$$\text{val}(M,0) \leq \text{val}(N,0) \leq 2^{2^{\dots 2^{\text{val}(M,0)}}}$$

To prove this lemma, we need to:

- isolate closed subterms in  $M$ ,
- replace the tower of  $2^2$  by an appropriately defined  $\text{high}(M)$ ,
- perform the head  $\beta$ -reduction first (closed subterms remain closed), and prove that  $\text{val}(M)$  increases and  $\text{high}(M)$  decreases.

Thank you.