

# Combinatorics of explicit substitutions

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# Outline

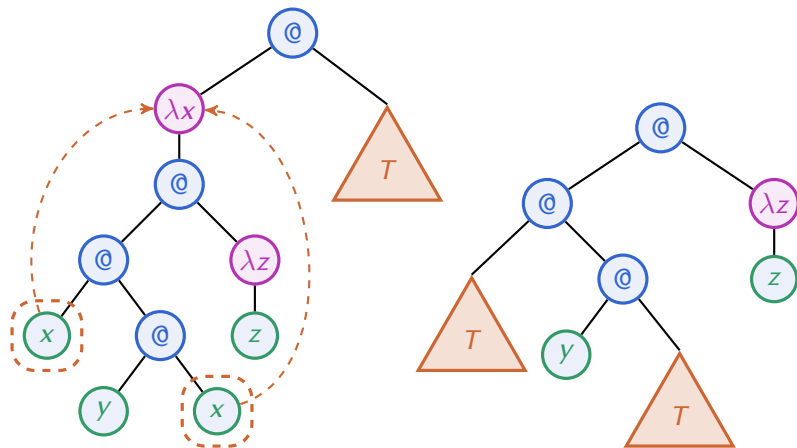
$\lambda$ -calculus and substitution resolution

$\lambda v$ -calculus and explicit substitutions

Our contribution

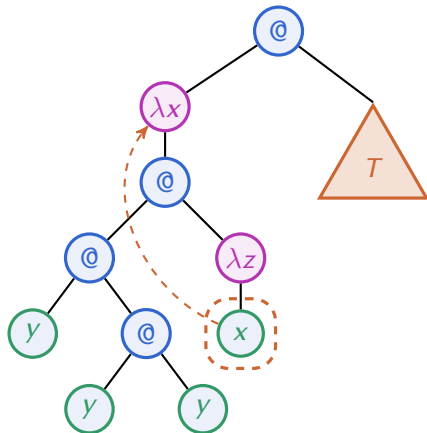
## $\beta$ -reduction in $\lambda$ -calculus

Substitution of terms for variables forms the essence of  $\beta$ -reduction in  $\lambda$ -calculus. For instance,  $(\lambda x.x(yx)(\lambda z.z))T \rightarrow_{\beta} T(yT)(\lambda z.z)$ :



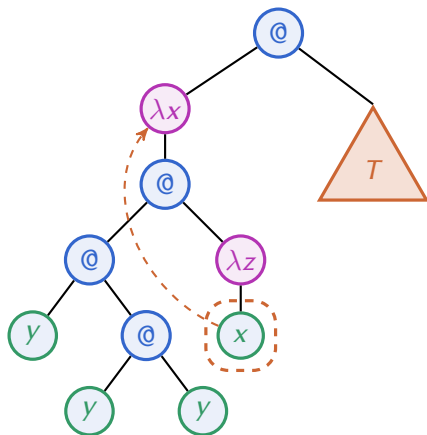
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However, what if we substitute  $T$  with *free variables* under an abstraction? For instance, what if  $z$  occurs freely in  $T$ , as in the following example:



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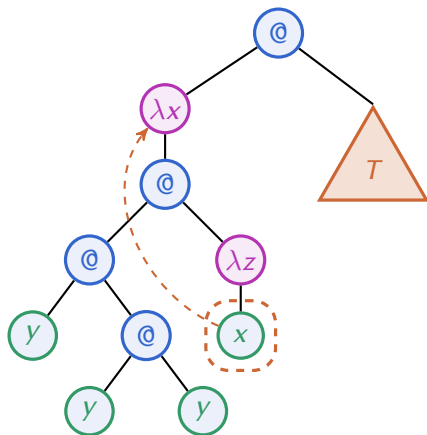
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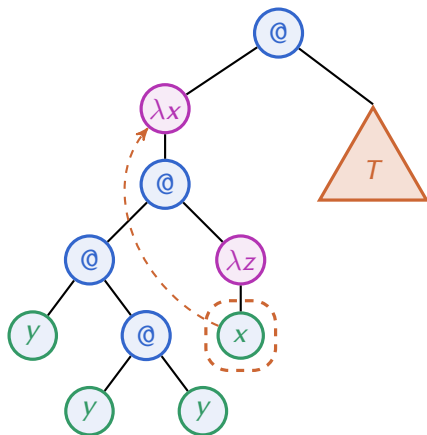
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- ▶ We want to avoid the *capture* of variable  $z$  in  $T$ ;
- ▶ Requires keeping track of variable names and (sometimes) their *renaming*;
- ▶ In principle feasible, but *in practice* it is not a trivial operation to execute.

## $\beta$ -reduction and computational effectiveness

Postulate (essentially due to de Bruijn '78)

The number of  $\beta$ -reductions required to normalise a given term (in other words, evaluate the encoded computation) *does not* quite reflect the computational effort required to *carry out* the computation.



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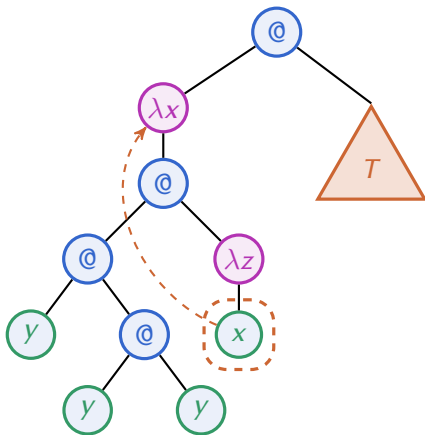
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... and that is due to the epitheoretic substitution operation.

## $\beta$ -reduction and computational effectiveness (ii)

### Issue I

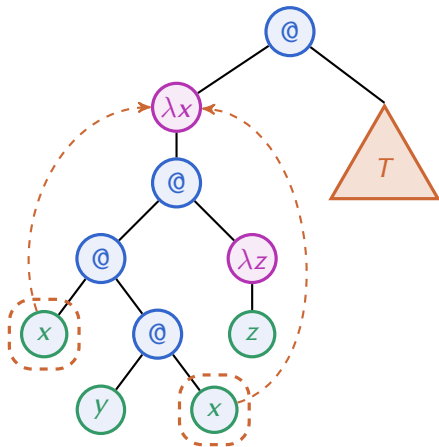
$\beta$ -reduction hides the non-trivial *details* of capture-avoiding substitution. Variable renaming can take time linear in the term size.



# $\beta$ -reduction and computational effectiveness (iii)

## Issue II

$\beta$ -reduction does not reflect the cost of *substitution resolution*.  
Variable search can take time linear in the term size.



# $\beta$ -reduction and computational effectiveness (iv)

## Issue III

$\beta$ -reduction hides the details of *evaluation strategies*. What if the substitution is carried out non-strictly, e.g. it is suspended and evaluated *on demand* (perhaps even never)?

*Real-life*<sup>1</sup> example of an infinite lists of Fibonacci numbers:

```
1 fibs = 0 : 1 : next fibs
2   where
3     next (a : b : xs) = (a + b) : next (b : xs)
```

---

<sup>1</sup>Is this the *real life*? Is this just fantasy? (. . .) [Mercury et al. '75]

## Effectuation of substitution

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### Quest

Investigate quantitative aspects of substitution. For instance,

- ▶ What is the average-case cost of resolving substitutions in computations (terms) of size  $n$ ? How does it change depending on the assumed evaluation strategy? What contributes to its execution time?
- ▶ What is the *average-case complexity* of abstract machines executing (terminating) computations of considered calculi? Is it possible to optimise them based on the structure of typical computations?

# Reflections on combinatory logic

## Normal-order reduction

If a term (combinator)  $T$  is normalisable, then the iterative contraction of the leftmost-outermost redex leads to the (unique) normal form of  $T$ .

$$\begin{aligned} Sxyz \rightarrow xz(yz) \quad R_0 &= S \oplus K \oplus KR_0 \oplus SR_0 \oplus SR_0R_0 \\ Kxy \rightarrow x \quad R_1 &= SR_1 \oplus KR_1 \oplus SR_0R_1 \oplus SR_1R_0 \oplus KR_0C \oplus \\ &KSCR_0 \oplus KKCR_0 \oplus KSCR_0R_0 \oplus K(SR_0)CR_0 \\ &\oplus SSSR_0 \oplus SSKR_0 \oplus SS(SR_0)R_0 \\ R_2 &= \dots \end{aligned}$$

**Figure:** Rewriting rules of  $SK$ -combinators and the corresponding normal-order reduction grammars.

## Reflections on combinatory logic (ii)

### Theorem (B., Grygiel and Zaionc '17)

For each  $k \geq 1$ , the asymptotic density  $\mu(R_k/C)$  of combinators reducing in  $k$  normal-order reduction steps in the set of all combinators is *positive*.

In particular, we have:

$k$	$\mu(R_k/C)$
0	0.
1	0.08961
2	0.06417
3	0.05010
4	0.04131
5	0.03570
6	0.03119
7	0.02798

### Problem

How to *port* these results to the realm of  $\lambda$ -calculus having an *external* substitution?

... use *explicit substitutions*!

# Outline

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$\lambda v$ -calculus and explicit substitutions

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# $\lambda v$ -calculus (lambda upsilon calculus)

A simplistic calculus of explicit substitutions due to Lescanne '94.

$\mathcal{T} ::= \mathcal{N} \mid \lambda \mathcal{T} \mid \mathcal{T}\mathcal{T} \mid \mathcal{T}[\mathcal{S}]$	$(\lambda a)b \rightarrow a[b/]$	(Beta)
$\mathcal{S} ::= \mathcal{T} / \mid \uparrow (\mathcal{S}) \mid \uparrow$	$(ab)[s] \rightarrow a[s](b[s])$	(App)
$\mathcal{N} ::= \underline{0} \mid \mathbf{S}\mathcal{N}.$	$(\lambda a)[s] \rightarrow \lambda(a[\uparrow (s)])$	(Lambda)
	$\underline{0}[a/] \rightarrow a$	(FVar)
	$(\mathbf{S}\underline{n})[a/] \rightarrow \underline{n}$	(RVar)
	$\underline{0}[\uparrow (s)] \rightarrow \underline{0}$	(FVarLift)
	$(\mathbf{S}\underline{n})[\uparrow (s)] \rightarrow \underline{n}[s][\uparrow]$	(RVarLift)
	$\underline{n}[\uparrow] \rightarrow \mathbf{S}\underline{n}.$	(VarShift)

Figure: Terms of  $\lambda v$ -calculus.

Figure: Rewriting rules.



## $\lambda v$ -calculus (ii)

Consider the term  $K = \lambda x. \lambda y. x$ ; denoted as  $\lambda \lambda \underline{1}$ . Certainly,  $Kab \rightarrow_{\beta} a$  for each term  $a$  (in one step). Note however, that with explicit substitutions we have

$$\begin{aligned}(\lambda \lambda \underline{1})a &\rightarrow (\lambda \underline{1})[a/] \\ &\rightarrow \lambda(\underline{1}[\uparrow(a/)]) \\ &\rightarrow \lambda(\underline{0}[a/][\uparrow]) \\ &\rightarrow \lambda(a[\uparrow]).\end{aligned}$$

The final shift operator guarantees that (potential) free indices are aptly incremented so to avoid potential variable captures. If  $a$  is closed, then  $a[\uparrow]$  resolves simply to  $a$ , as intended.

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# Enumerative results

## Proposition

Let  $T(z)$  and  $S(z)$  denote the generating functions corresponding to  $\lambda\nu$ -terms and substitutions, respectively. Then,

$$T(z) = \frac{1 - \sqrt{1 - 4z}}{2z} - 1 \quad \text{whereas} \quad S(z) = \frac{1 - \sqrt{1 - 4z}}{2z} \left( \frac{z}{1 - z} \right).$$

In consequence

$$[z^n]T(z) = \begin{cases} 0, & \text{for } n = 0 \\ \frac{1}{n+1} \binom{2n}{n}, & \text{otherwise} \end{cases}$$

$$[z^n]S(z) = \begin{cases} 0, & \text{for } n = 0 \\ \sum_{k=0}^{n-1} \frac{1}{k+1} \binom{2k}{k} & \text{otherwise.} \end{cases}$$

## Enumerative results – explicit bijection

$$\varphi \left( \begin{array}{c} \bullet \\ \diagdown \\ R \end{array} \right) = \lambda \varphi(R) \qquad \varphi(\bullet) = \underline{0}$$

$$\varphi \left( \begin{array}{c} \bullet \\ \diagup \\ L \end{array} \right) = \underline{S_n} \qquad \varphi \left( \begin{array}{c} \bullet \\ \diagup \diagdown \\ \bullet \\ \diagdown \\ R \end{array} \right) = \varphi(R)[\uparrow]$$

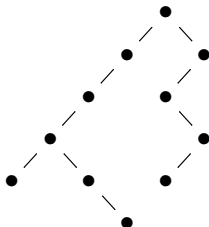
**when**  $\varphi(L) = \underline{n}$

$$\varphi \left( \begin{array}{c} \bullet \\ \diagup \\ L \end{array} \right) = a[\uparrow^{n+1}(s)] \qquad \varphi \left( \begin{array}{c} \bullet \\ \diagup \diagdown \\ \bullet \\ \diagdown \\ R \end{array} \right) = \varphi(L)[\varphi(R)/]$$

**when**  $\varphi(L) = a[\uparrow^n(s)]$   $\varphi \left( \begin{array}{c} \bullet \\ \diagup \diagdown \\ L \end{array} \right) = \varphi(L) \varphi(R)$

# Enumerative results – correspondence example

For instance,  $0[\uparrow (\lambda 0/)] \ 1[\uparrow]$  corresponds to



# Statistical properties

## Strict substitution forms

A  $\lambda v$ -term  $t$  is in *strict substitution form* if there exist two pure (i.e. without explicit substitutions) terms  $a, b$  and a sequence  $t_1, \dots, t_n$  of  $\lambda v$ -terms such that

$$a[b/] \rightarrow t_1 \rightarrow \dots \rightarrow t_n = t$$

and none of the above reductions is (Beta).

Otherwise,  $t$  is said to be in *lazy substitution form*.

## Theorem

Asymptotically almost all  $\lambda v$ -terms are in *lazy substitution form*.

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## Proof.

Idea: Consider the class of terms without *nested closures*. □

## Statistical properties (ii)

### Substitution suspension

Let  $s$  be a substitution and  $t$  be a  $\lambda v$ -term. Then,  $s$ , all its subterms, and all the constructors it contains are said to be *suspended in  $t$*  if  $t$  contains a subterm in form of  $[s]$ ; in other words, when  $s$  occurs under a closure in  $t$ .

### Theorem

Let  $X_n$  be a random variable denoting the number of constructors not suspended under a closure in a random  $\lambda v$ -term of size  $n$ . Then, the expectation  $\mathbb{E}(X_n)$  satisfies

$$\mathbb{E}(X_n) \xrightarrow{n \rightarrow \infty} \frac{316}{3} \approx 105.33.$$



## Statistical properties (iii)

### Proposition

Let  $R$  be a redex in the  $\lambda v$ -calculus and  $X_n$  be the corresponding random variable denoting the number of occurrences of  $R$  in a random term of size  $n$ . Then, after standardisation,  $X_n$  admits a limiting Gaussian law.

In particular, we obtain:

Redex	(limit) mean	(limit) variance
(Beta)	$0.046875n$	$0.037354n$
(App)	$0.031250n$	$0.021973n$
(Lambda)	$0.031250n$	$0.025879n$
(VarShift)	$0.015625n$	$0.013916n$
(FVar)	$0.011719n$	$0.011124n$
(FVarLift)	$0.007812n$	$0.007355n$
(RVar)	$0.003906n$	$0.003799n$
(RVarLift)	$0.002604n$	$0.002557n$

# Conclusions

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- ▶ Standard analytic methods provide insight into the structure of random  $\lambda v$ -terms, in particular *substitution resolution*;
- ▶ Typical computations are in a strong sense *lazy*. Substitutions are evaluated non-strictly. In fact, almost all of the computation content is *suspended*;
- ▶ Substitution primitives have, on average, an uneven contribution in typical terms. We can exploit that in *micro optimisations* of abstract machines.

## Future work

- ▶ What is the cost distribution of substitution resolution, given a random term of size  $n$ ? What primitives are its main contributors?

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- ▶ What is the cost distribution of substitution resolution, given a random term of size  $n$ ? What primitives are its main contributors?
- ▶ Does normal-order reduction (think of non-strict functional programming languages) has a similar, average-case "distribution shape" as the one for combinatory logic?

Thank you

Thank you for your attention!  
(Strict questions and lazy answers)