

THE λ -CALCULUS

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λ -CALCULUS: THE SIMPLEST PROGRAMMING LANGUAGE

$$M ::= x \quad | \quad \lambda x. M \quad | \quad M M$$

Variable Abstraction
(single-parameter function) Application

λ -ABSTRACTION IN PROGRAMMING LANGUAGES

`\x -> 2*x + 1 (Haskell)`

`x -> 2*x + 1 (Java)`

`x => 2*x + 1 (JavaScript, C#, Scala)`

`fun x -> 2*x + 1 (OCaml, F#)`

`{x in 2*x+1} (Swift)`

$\lambda x. (2x + 1)$

`-> $x{2*$x+1} (Perl)`

`[] (int x) { return 2*x+1; } (C++)`

`lambda x: 2*x + 1 (Python)`

`^(int x) { return 2*x+1; } (Objective-C)`

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$$M ::= x \quad | \quad \lambda x. M \quad | \quad M M$$

Variable Abstraction Application
(single-parameter function)

WHAT WILL WE COVER IN THESE LECTURES?

SYNTAX

Free/bound variables
 α -equivalence
Substitution

SEMANTICS

β -reduction
Confluence/normal forms
Reduction strategies

APPLICATIONS

Expressivity
Arithmetic, Data structures
Recursion

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FREE AND BOUND VARIABLES

$$M ::= x \mid \lambda x. M \mid M M$$

$\lambda x. x$

$\lambda x. y$

$\lambda x. \lambda y. \lambda z. x y$

Bound variables are in **red**, free variables are in **light blue**

FREE AND BOUND VARIABLES

$$M ::= x \mid \lambda x. M \mid M M$$

$\lambda x. x$

$\lambda x. y$

$\lambda xyz. x y$

Contraction

Bound variables are in **red**, free variables are in **light blue**

FREE AND BOUND VARIABLES

$$M ::= x \mid \lambda x. M \mid M M$$

$\lambda x. x$

$\lambda x. y$

$\lambda xyz. x y$

Closed term – no free variables

Bound variables are in **red**, free variables are in **light blue**

FREE AND BOUND VARIABLES

$$M ::= x \mid \lambda x. M \mid M M$$

$\lambda x. x$

$\lambda x. y$

$\lambda xyz. x y$

$((\lambda x. x y)(\lambda y. x y))(\lambda xy. x y z)$

Application is left-associative

Bound variables are in **red**, free variables are in **light blue**

FREE AND BOUND VARIABLES

$$M ::= x \mid \lambda x. M \mid M M$$

$\lambda x. x$

$\lambda x. y$

$\lambda xyz. x y$

$((\lambda x. x y)(\lambda y. x y))(\lambda xy. x y z)$

$(\lambda x. (\lambda y. x y) y)(\lambda z. z x)$

Bound variables are in **red**, free variables are in **light blue**

FREE VARIABLES, FORMALLY

$$M ::= x \mid \lambda x. M \mid M M$$

$$\text{FV}(x) = \{x\}$$

$$\text{FV}(\lambda x. M) = \text{FV}(M) \setminus \{x\}$$

$$\text{FV}(MN) = \text{FV}(M) \cup \text{FV}(N)$$

EXAMPLE: $\text{FV}((\lambda x. (\lambda y. x y)y)(\lambda z. z x)) = \{x, y\}$

TUTORIAL: FREE AND BOUND VARIABLES

1. (Free and bound variables.)

- (a) i. Circle all the binding occurrences of variables in this λ -term:

$$(\lambda x y . y (\lambda x . x y) z)(x (\lambda z x . x z y))$$

- ii. Circle all the bound occurrences of variables in this λ -term:

$$(\lambda x y . y (\lambda x . x y) z)(x (\lambda z x . x z y))$$

- iii. Circle all the free occurrences of variables in this λ -term:

$$(\lambda x y . y (\lambda x . x y) z)(x (\lambda z x . x z y))$$

- (b) Give the set of free variables for:

i. $(\lambda x. xy)(x\lambda y. yx)(\lambda yz. zy)$

ii. $(\lambda z. z(\lambda y. yzx)y)(\lambda xz. (\lambda y. zxy)x)$

ANSWER: FREE AND BOUND VARIABLES

(Free and bound variables.)

- (a) i. The binding occurrences of variables in this λ -term are:

$$(\lambda \textcircled{x} \textcircled{y}. y (\lambda \textcircled{x}. x y) z)(x (\lambda \textcircled{z} \textcircled{x}. x z y))$$

- ii. The bound occurrences of variables in this λ -term are:

$$(\lambda x y . \textcircled{y} (\lambda x . \textcircled{x} \textcircled{y}) z)(x (\lambda z x . \textcircled{x} \textcircled{z} y))$$

- iii. The free occurrences of variables in this λ -term are:

$$(\lambda x y . y (\lambda x . x y) \textcircled{z})(\textcircled{x} (\lambda z x . x z \textcircled{y}))$$

- (b) i. For $(\lambda x. x\textcolor{red}{y})(\textcolor{red}{x}\lambda y. y\textcolor{red}{x})(\lambda yz. zy)$: $FV = \{x, y\}$.

Notice that the x that is appearing twice in the second parentheses is free, as it is outside of the scope of the binding λx from the first parentheses.

- ii. For $(\lambda z. z(\lambda y. yz\textcolor{red}{x})\textcolor{red}{y})(\lambda xz. (\lambda y. zxy)x)$: $FV = \{x, y\}$.

You might be tempted to think that the z in $\lambda y. yzx$ is free, but it is, in fact, bound to the outside λz .

RENAMING BOUND VARIABLES: α -EQUIVALENCE

In programming languages: Bound variables \rightarrow **function parameters**.

function (**x**, **y**) { **return** **x** + **y**; } $\lambda xy. x\ y$

function (**a**, **b**) { **return** **a** + **b**; } $\lambda ab. a\ b$

$$\lambda xy. x\ y =_{\alpha} \lambda ab. a\ b$$

INTUITION: $M =_{\alpha} N$ if and only if one can be obtained from the other by renaming the bound variables

HINT: If $M =_{\alpha} N$, then they must have **the same set of free variables**

TUTORIAL: α -EQUIVALENCE

2. (α -Equivalence.)

(a) Which of the following λ -terms is α -equivalent to $(\lambda xy. y(\lambda x. xy)z)$?

i. $(\lambda xy. a(\lambda x. xa)a)$

v. $(\lambda xa. a(\lambda a. aa)z)$

ii. $(\lambda zy. y(\lambda x. xy)z)$

vi. $(\lambda xa. a(\lambda x. xa)a)$

iii. $(\lambda xy. y(\lambda z. zy)z)$

vii. $(\lambda xa. a(\lambda z. za)z)$

iv. $(\lambda xy. y(\lambda z. zy)a)$

viii. $(\lambda za. a(\lambda z. za)z)$

(b) Write down three λ -terms which are α -equivalent to $(\lambda y. (\lambda x. xy)zxy)$.

(c) For each of the three λ -terms you gave in part b, write down the set of free variables.

SOLUTION: α -EQUIVALENCE (PART)

(α -Equivalence.)

(a) Which of the following λ -terms is α -equivalent to $(\lambda xy. y(\lambda x. xy)z)$?

i. $(\lambda xy. a(\lambda x. xa)a)$ ✗

ii. $(\lambda zy. y(\lambda x. xy)z)$ ✗

iii. $(\lambda xy. y(\lambda z. zy)z)$ ✓

iv. $(\lambda xy. y(\lambda z. zy)a)$ ✗

v. $(\lambda xa. a(\lambda a. aa)z)$ ✗

vi. $(\lambda xa. a(\lambda x. xa)a)$ ✗

vii. $(\lambda xa. a(\lambda z. za)z)$ ✓

viii. $(\lambda za. a(\lambda z. za)z)$ ✗

α -EQUIVALENCE: EXAMPLES

STRATEGY: Are the terms of the same structure?

Do all of the free variables match?

Can you rename the bound variables so that they match?

$$\lambda x. x =_{\alpha} \lambda y. x y \quad \times$$

$$\lambda x. x (\lambda z. x z) y =_{\alpha} \lambda y. y (\lambda t. y t) x \quad \times$$

$$\lambda x. x (\lambda z. x z) y =_{\alpha} \lambda y. y (\lambda t. y t) y \quad \times$$

$$\lambda x. x (\lambda z. x z) y =_{\alpha} \lambda w. w (\lambda t. w t) y \quad \checkmark$$

$$(\lambda xy. z x (\lambda t. t y)) x =_{\alpha} (\lambda yw. z y (\lambda z. z w)) x \quad \checkmark$$

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$

$(x y)(y z) [y / x]$

$(\lambda z. xz) [y / x]$

$(\lambda x. xy) [y / x]$

$(\lambda y. xy) [y / x]$

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

No x to substitute for

$(x y)(y z) [y / x]$

$(\lambda z. xz) [y / x]$

$(\lambda x. xy) [y / x]$

$(\lambda y. xy) [y / x]$

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

$(x y)(y z) [y / x]$ equals $(y y)(y z)$

$(\lambda z. xz) [y / x]$ equals $\lambda z. yz$

$(\lambda x. xy) [y / x]$

$(\lambda y. xy) [y / x]$

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

$(x y)(y z) [y / x]$ equals $(y y)(y z)$

$(\lambda z. xz) [y / x]$ equals $\lambda z. yz$

$(\lambda x. xy) [y / x]$ equals $\lambda y. yy$ ❌

$(\lambda y. xy) [y / x]$ equals

Can't substitute for
a bound variable!

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

$(x y)(y z) [y / x]$ equals $(y y)(y z)$

$(\lambda z. xz) [y / x]$ equals $\lambda z. yz$

$(\lambda x. xy) [y / x]$ equals $\lambda x. xy$

$(\lambda y. xy) [y / x]$ equals

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

$(x y)(y z) [y / x]$ equals $(y y)(y z)$

$(\lambda z. xz) [y / x]$ equals $\lambda z. yz$

$(\lambda x. xy) [y / x]$ equals $\lambda x. xy$

$(\lambda y. xy) [y / x]$ equals $\lambda y. yy$ ❌

Can't substitute and bind a variable!

SUBSTITUTION BY EXAMPLE

$M[N / x]$

$x [y / x]$ equals y

$z [y / x]$ equals z

$(x y)(y z) [y / x]$ equals $(y y)(y z)$

$(\lambda z. xz) [y / x]$ equals $\lambda z. yz$

$(\lambda x. xy) [y / x]$ equals $\lambda x. xy$

$(\lambda y. xy) [y / x]$ equals $\lambda z. yz$

SUBSTITUTION, FORMALLY

$$M ::= x \mid \lambda x. M \mid M M$$

$$x[M/y] = \begin{cases} M & x = y \\ x & x \neq y \end{cases}$$

$$(\lambda x. N)[M/y] = \begin{cases} \lambda x. N & x = y \\ \lambda z. N[z/x][M/y] & x \neq y \end{cases}$$

where $z \notin (FV(N) \setminus \{x\}), z \notin FV(M), z \neq y$

$$(M_1 M_2)[M/y] = (M_1[M/y])(M_2[M/y])$$

TUTORIAL: SUBSTITUTION

3. (**Expression substitution.**) Give the result of each of the following λ -term substitutions:

(a) $(xy)[z/x]$

(b) $(xy)[\lambda x. xx/x]$

(c) $(\lambda x. xy)[z/y]$

(d) $(\lambda x. xy)[z/x]$

(e) $(\lambda x. xy)[x/y]$

(f) $(\lambda x. xx)[\lambda x. xx/x]$

(g) $(\lambda x. xy)[\lambda x. xy/y]$

(h) $(\lambda x. xy)[x(\lambda x. xy)/y]$

ANSWER: SUBSTITUTION

(Expression substitution.)

The results of the substitutions are as follows:

- | | |
|--|---|
| (a) $(xy)[z/x] = zy$ | Simple substitution. |
| (b) $(xy)[\lambda x. xx/x] = (\lambda x. xx)y$ | Simple substitution. |
| (c) $(\lambda x. xy)[z/y] = \lambda x. xz$ | Substitution under binder, no capture threat. |
| (d) $(\lambda x. xy)[z/x] = \lambda x. xy$ | No free x to be substituted, no effect. |
| (e) $(\lambda x. xy)[x/y] = \lambda z. zx$ | Must rename binding x to avoid capture. |
| (f) $(\lambda x. xx)[\lambda x. xx/x] = \lambda x. xx$ | No free x to be substituted, no effect. |
| (g) $(\lambda x. xy)[\lambda x. xy/y] = \lambda x. x(\lambda x. xy)$ | Substitution under binder, no capture threat. |
| (h) $(\lambda x. xy)[x(\lambda x. xy)/y] = \lambda z. z(x(\lambda x. xy))$ | Must rename binding x to avoid capture. |

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COMPUTATION: β -REDUCTION

Redex

$$\overline{(\lambda x. M)N} \longrightarrow_{\beta} M[N/x]$$

$$\frac{M \longrightarrow_{\beta} M'}{\lambda x. M \longrightarrow_{\beta} \lambda x. M'}$$

$$\frac{M \longrightarrow_{\beta} M'}{MN \longrightarrow_{\beta} M'N}$$

$$\frac{N \longrightarrow_{\beta} N'}{MN \longrightarrow_{\beta} MN'}$$

$$\frac{M =_{\alpha} M' \quad M' \longrightarrow_{\beta} N' \quad N' =_{\alpha} N}{M \longrightarrow_{\beta} N}$$

β -REDUCTION: EXAMPLE

$$(\lambda x. x x)((\lambda x. y)z)$$

β -REDUCTION: EXAMPLE

$$(\lambda \underline{x} . x \ x) (\underline{(\lambda x . y) z})$$

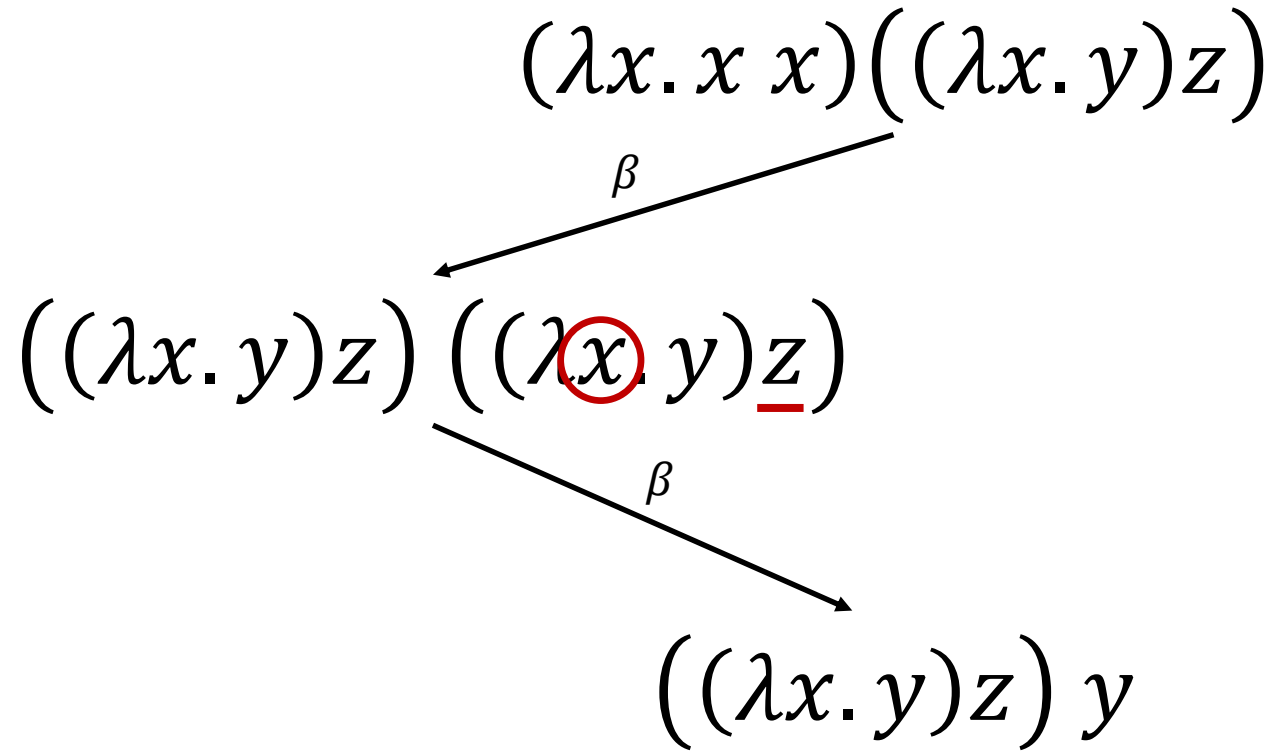
β -REDUCTION: EXAMPLE

$$\begin{array}{c} (\lambda x. x x) (\underline{(\lambda x. y) z}) \\ \swarrow \beta \\ ((\lambda x. y) z) ((\lambda x. y) z) \end{array}$$

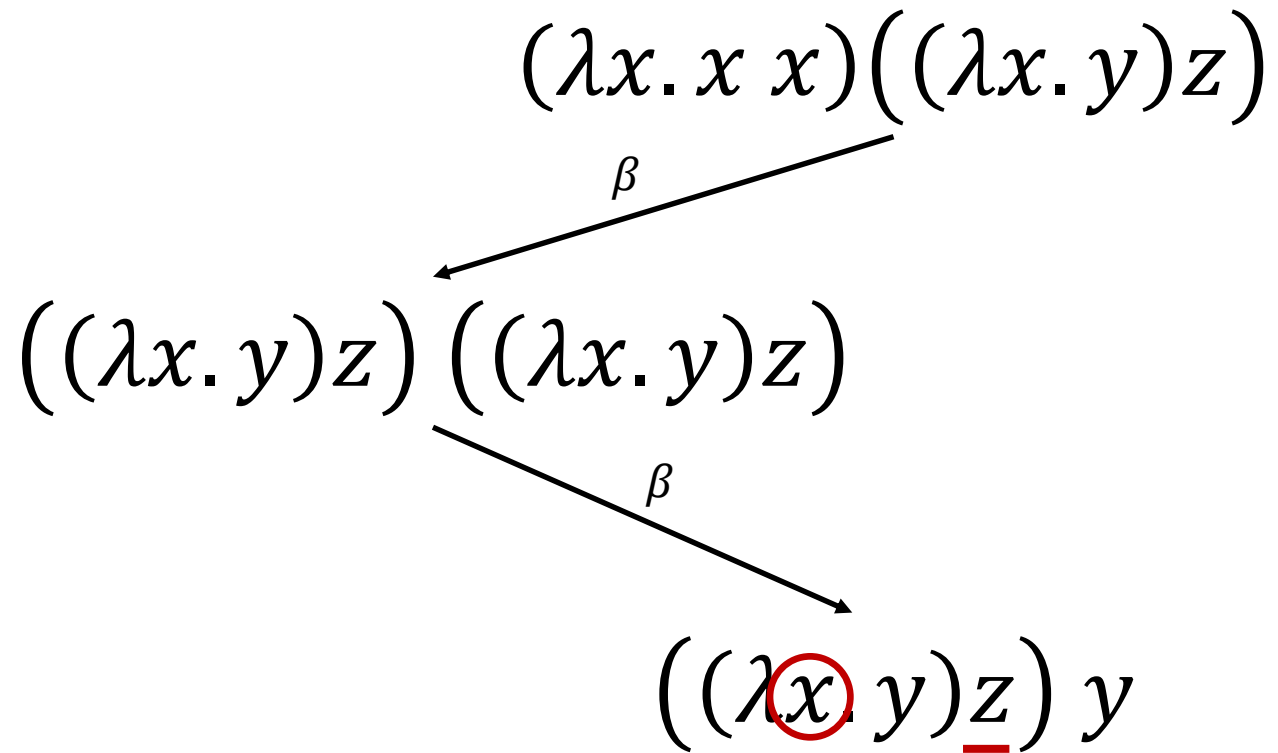
β -REDUCTION: EXAMPLE

$$\begin{array}{c} (\lambda x. x x) ((\lambda x. y) z) \\ \swarrow \beta \\ ((\lambda x. y) z) ((\lambda \textcircled{x}. y) \underline{z}) \end{array}$$

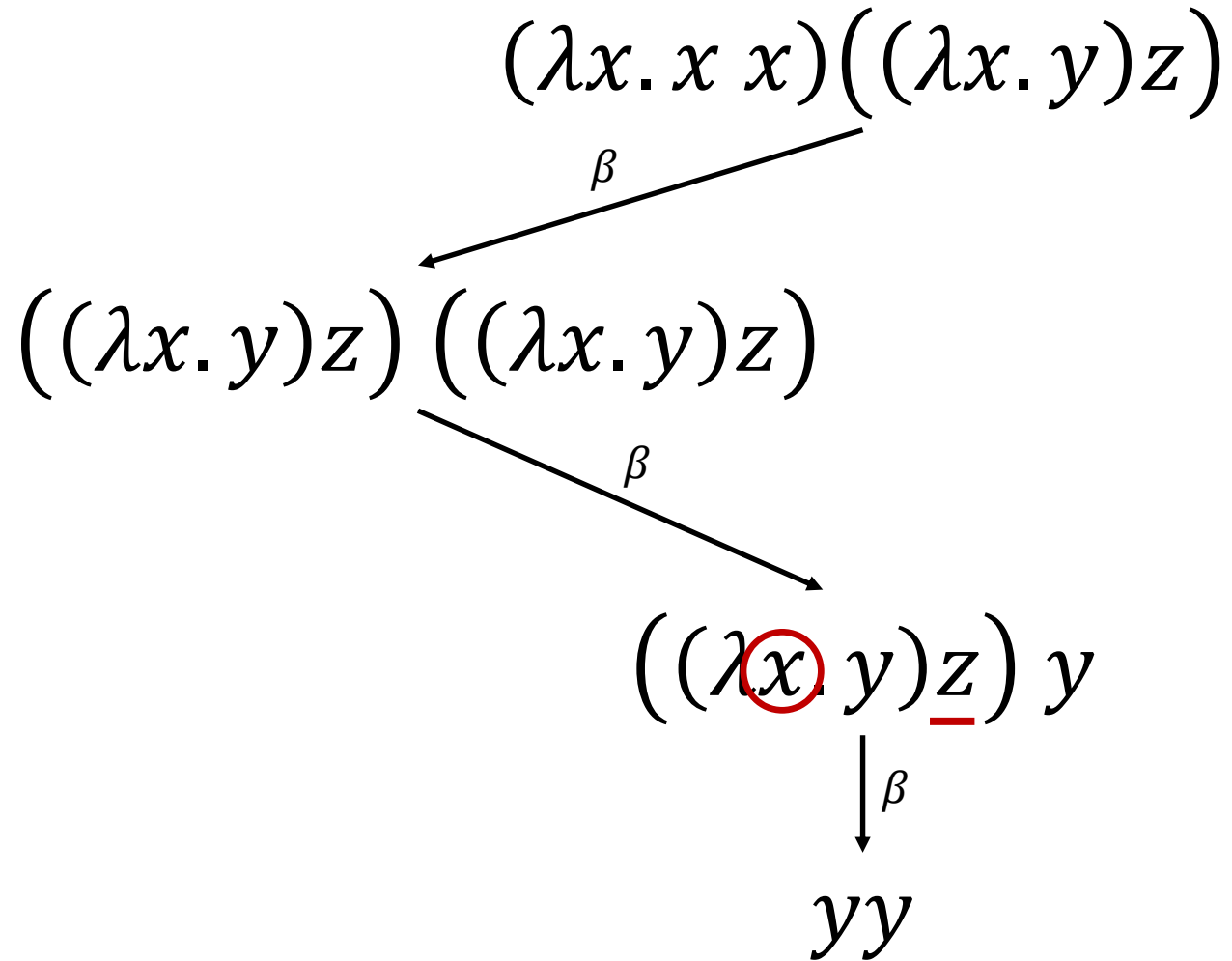
β -REDUCTION: EXAMPLE



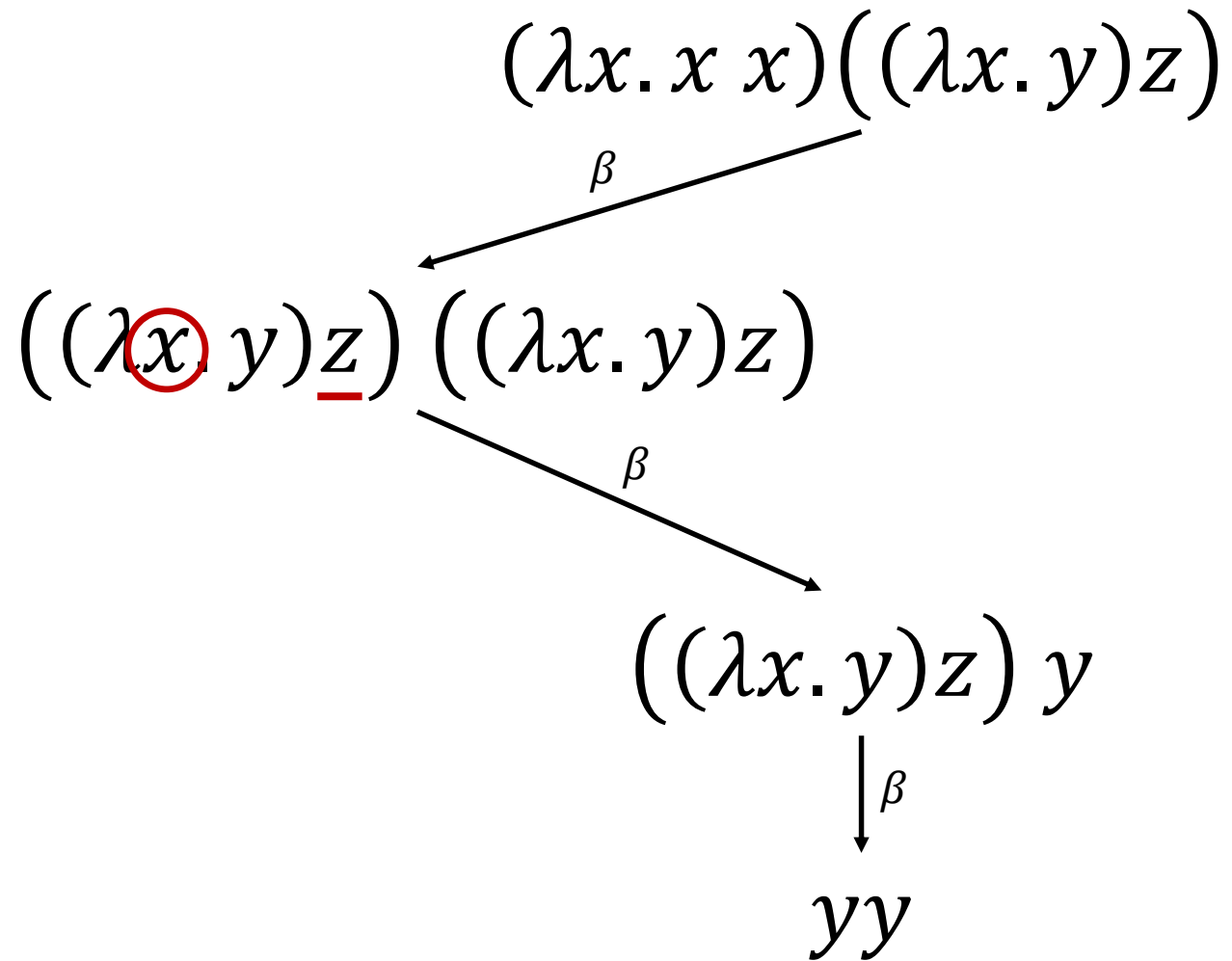
β -REDUCTION: EXAMPLE



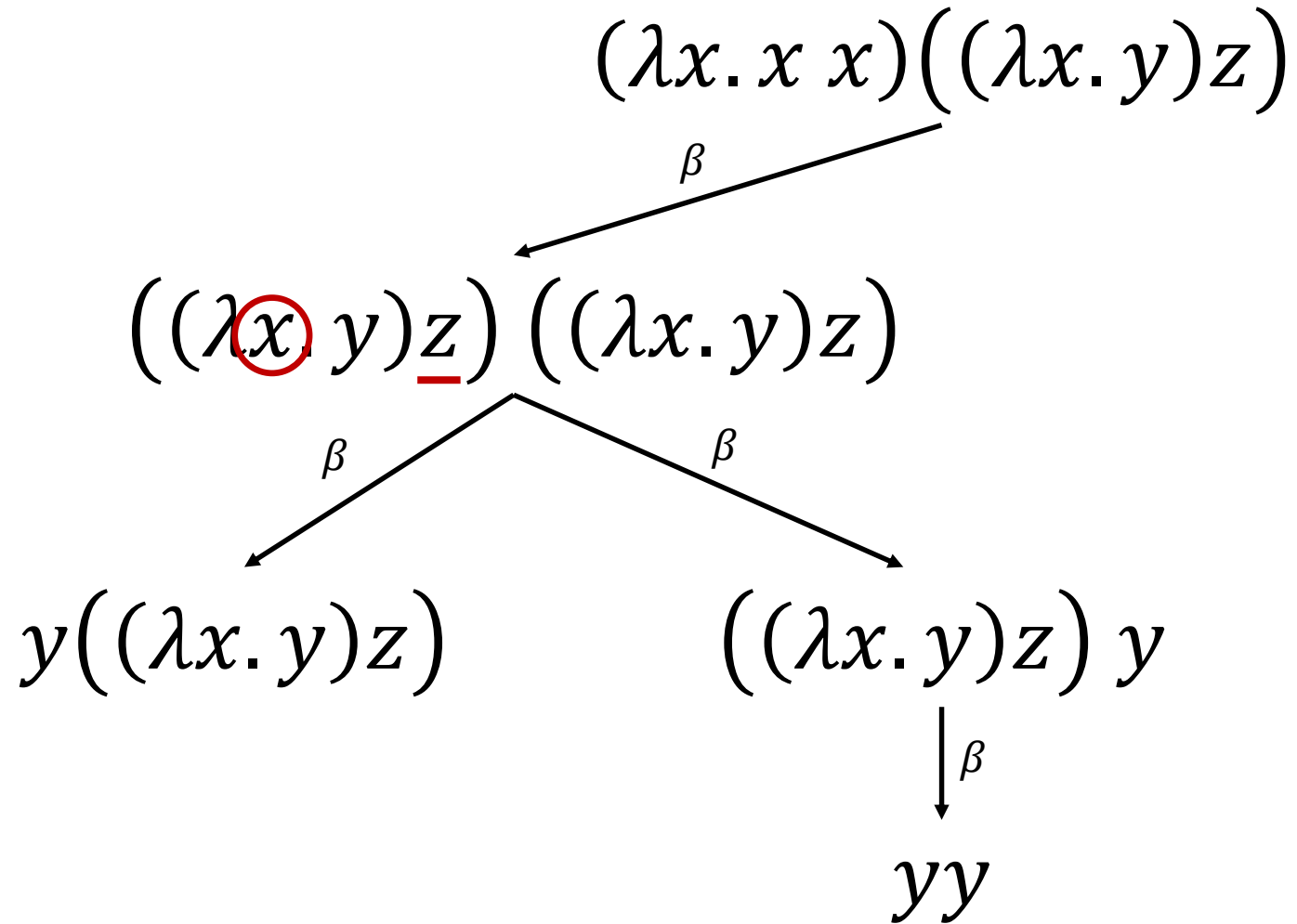
β -REDUCTION: EXAMPLE



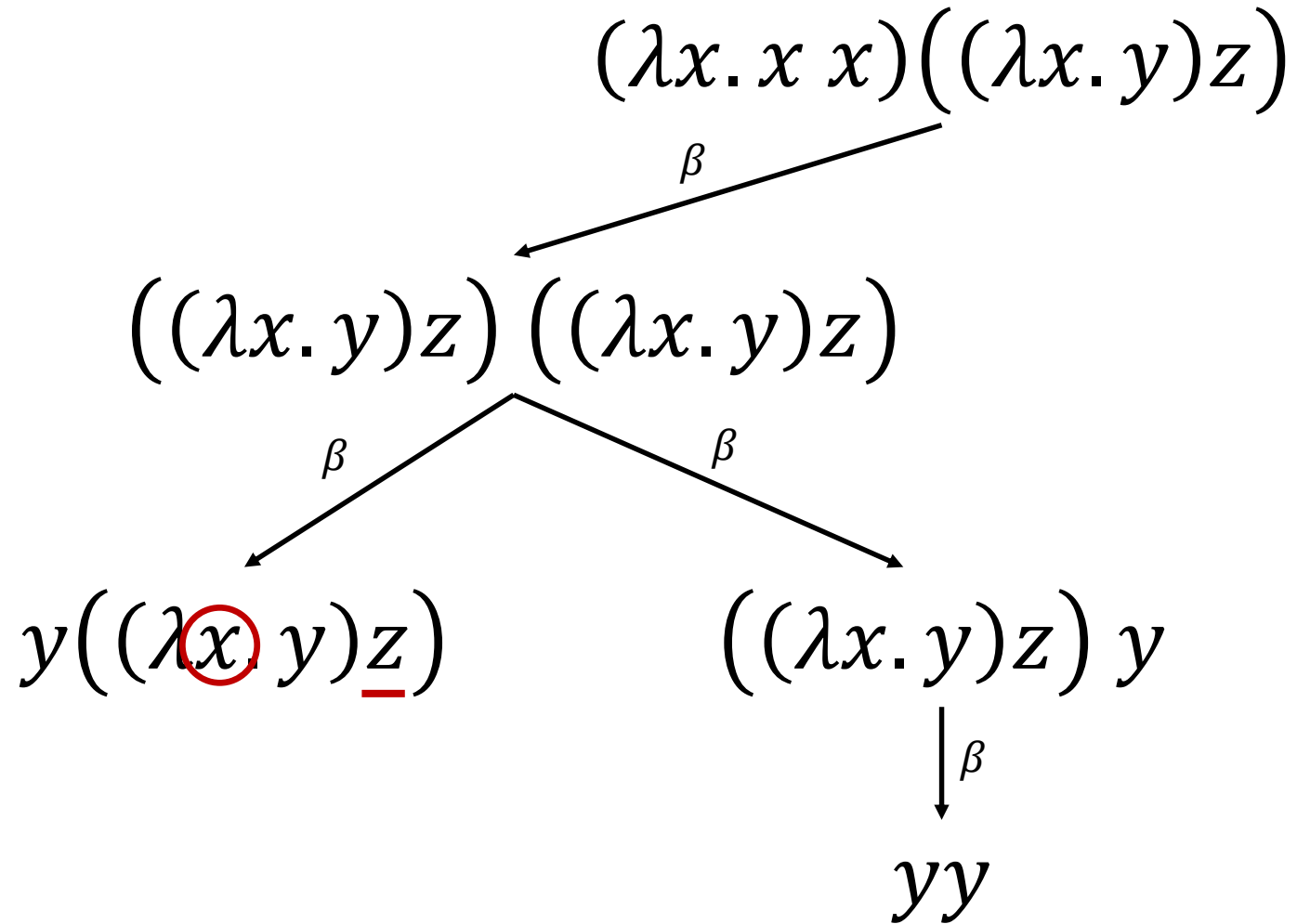
β -REDUCTION: EXAMPLE



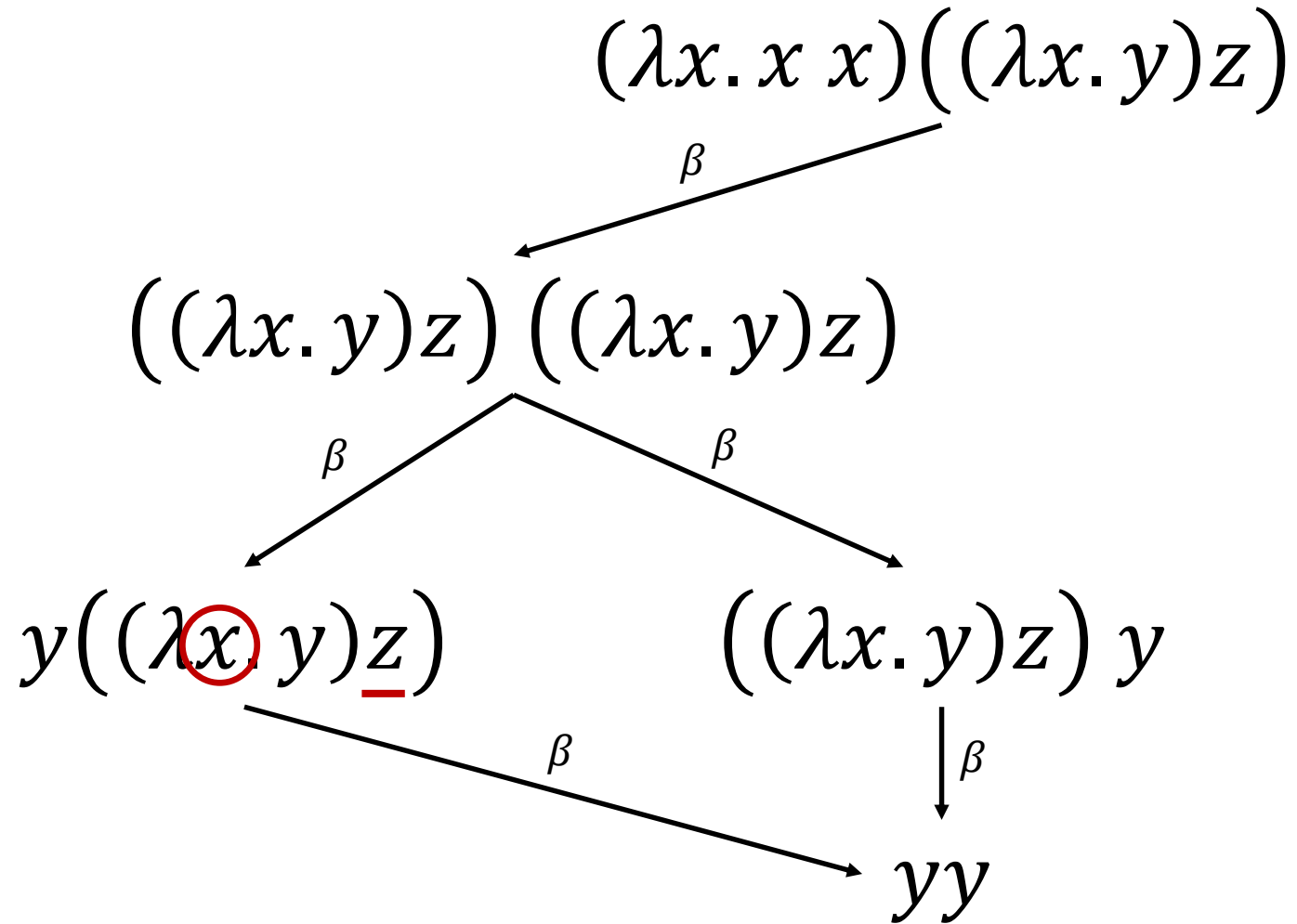
β -REDUCTION: EXAMPLE



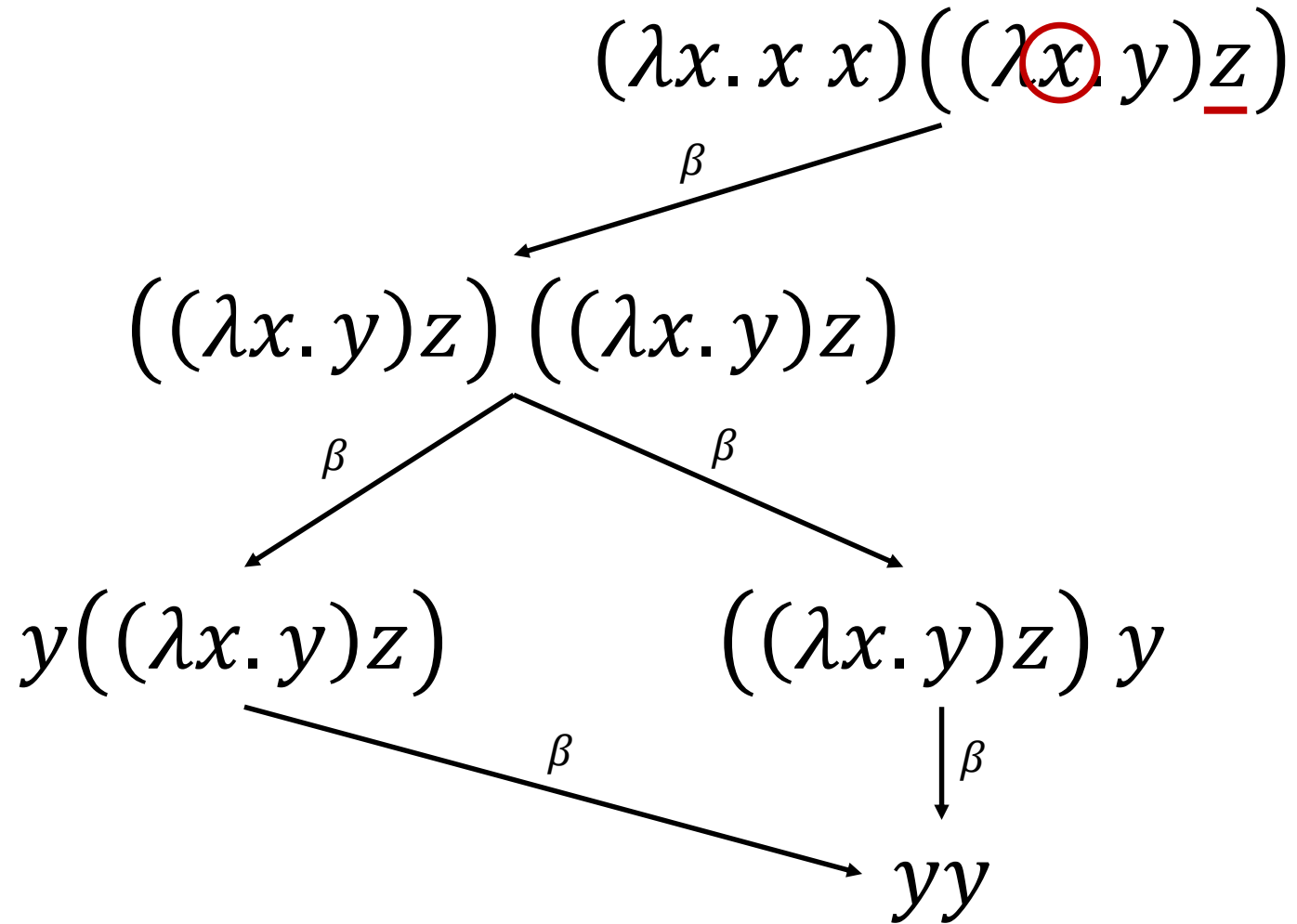
β -REDUCTION: EXAMPLE



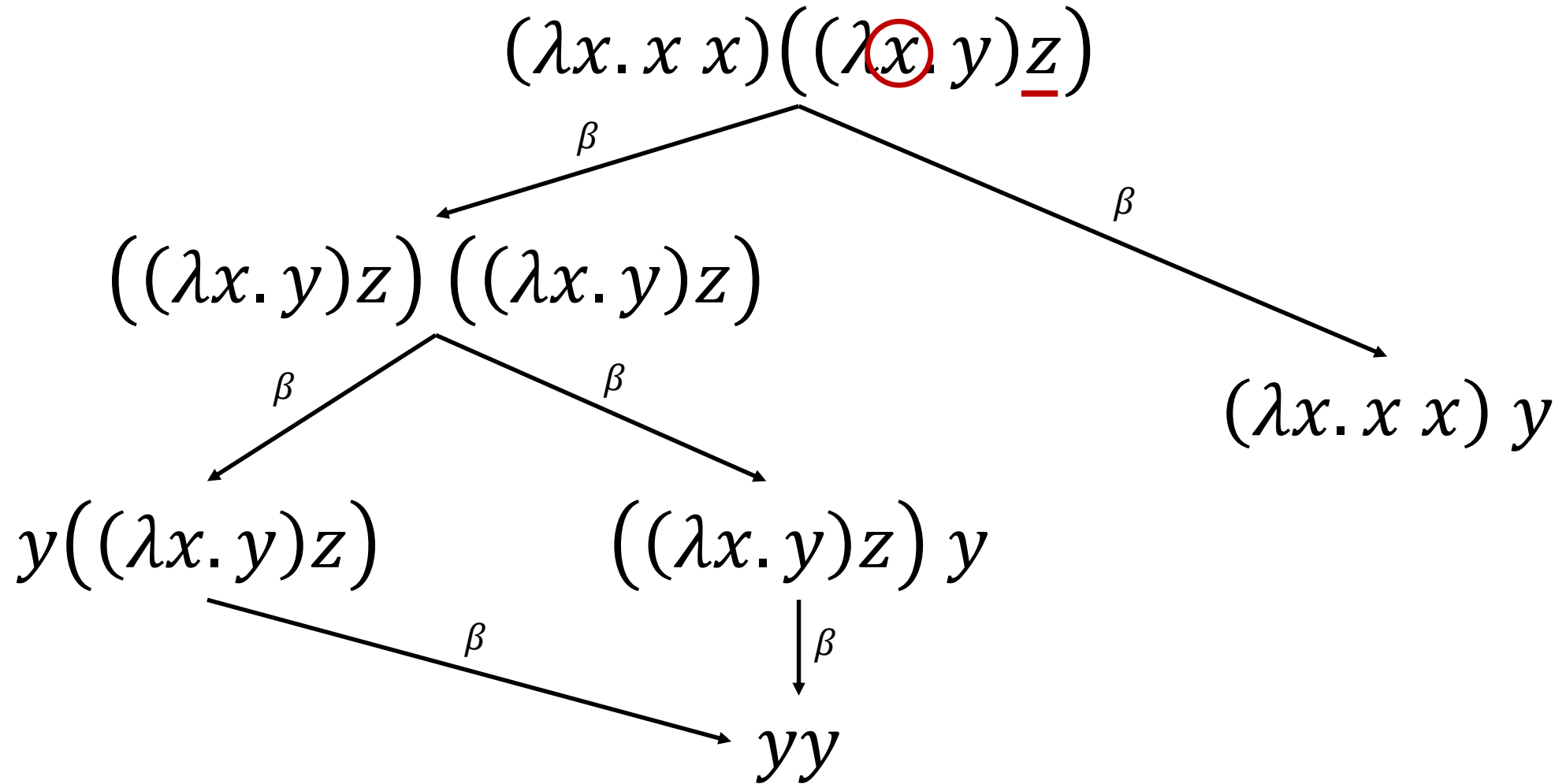
β -REDUCTION: EXAMPLE



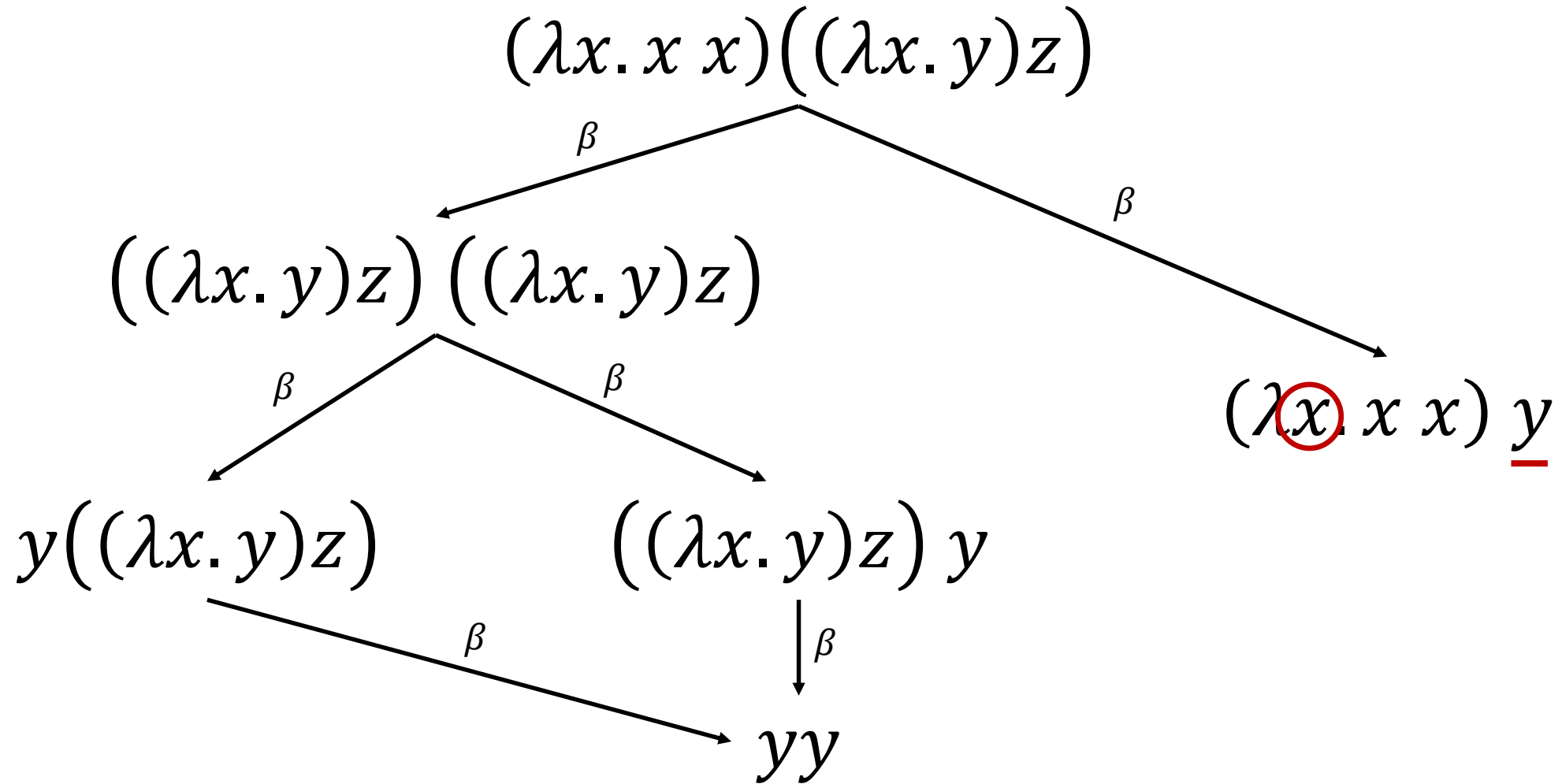
β -REDUCTION: EXAMPLE



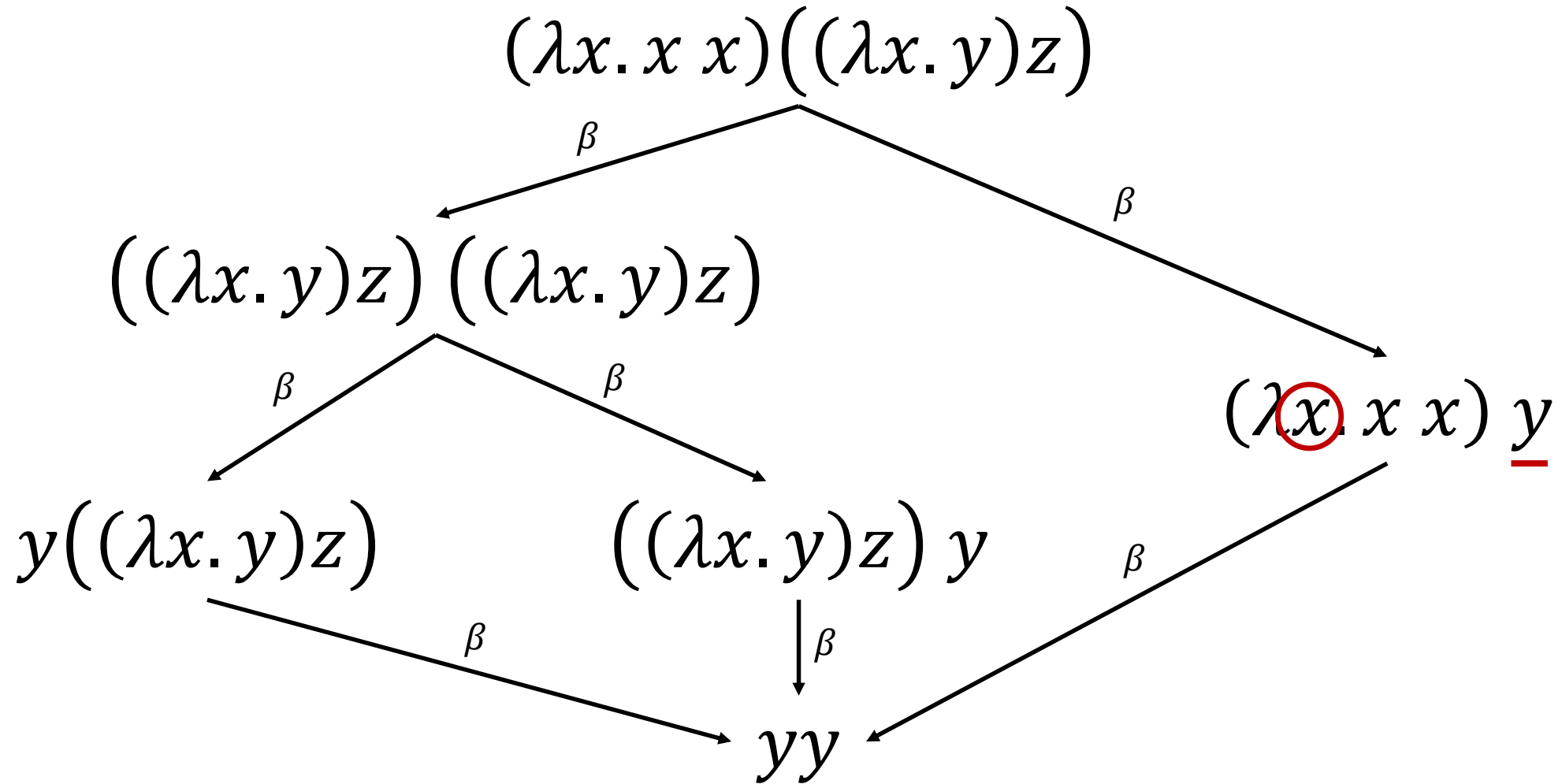
β -REDUCTION: EXAMPLE



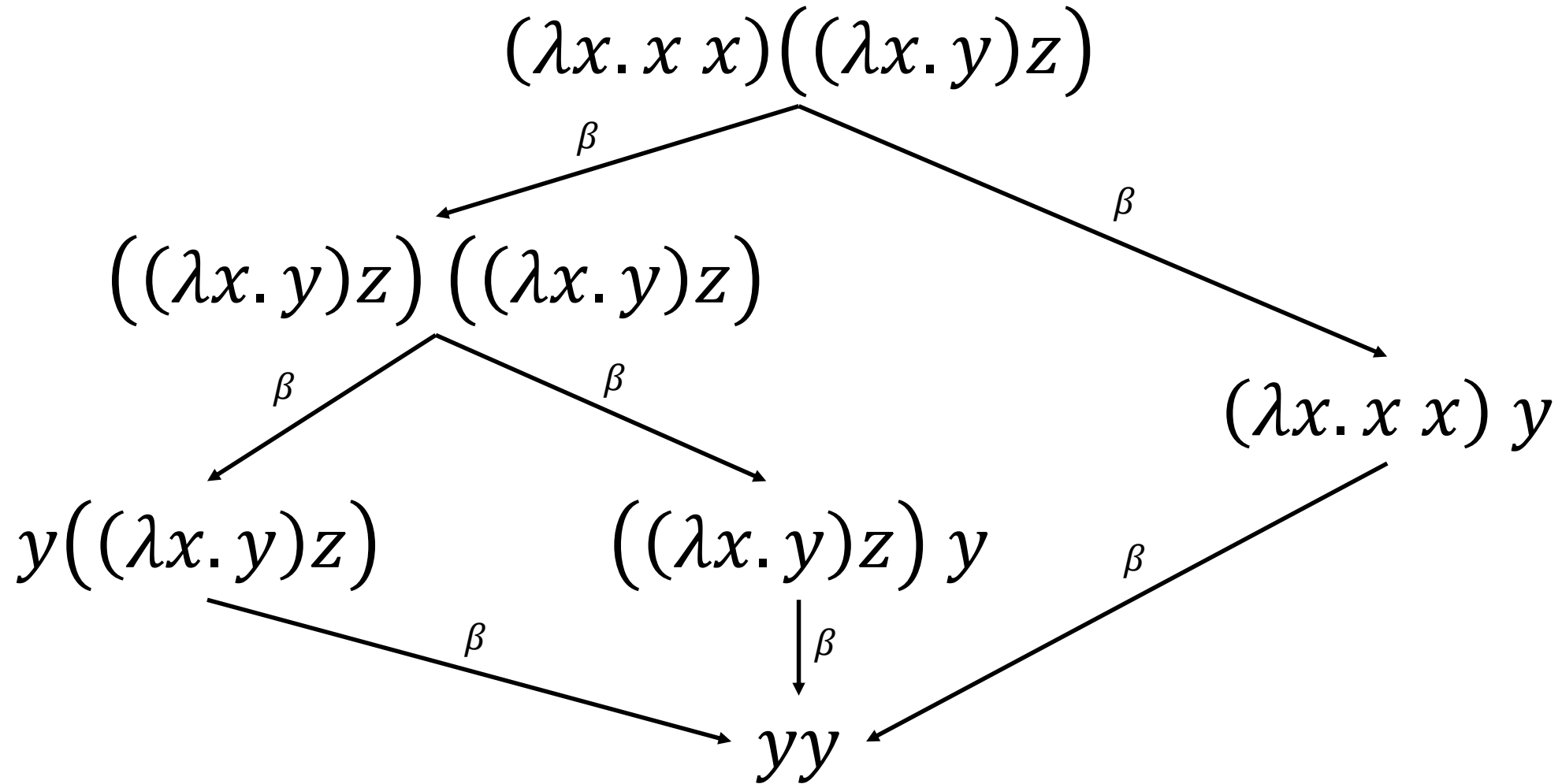
β -REDUCTION: EXAMPLE



β -REDUCTION: EXAMPLE



β -REDUCTION: EXAMPLE



TUTORIAL: β -REDUCTION

4. (β -reduction.)

(a) For each of the following λ -terms, perform a single β -reduction step and give the entire derivation tree for this step.

→ i. $(\lambda x. x)y$

iii. $(\lambda x. \lambda y. xy)z$

→ ii. $(\lambda x. \lambda y. xy)y$

→ iv. $\lambda x. x((\lambda x. x)y)$

→ (b) Find distinct λ -terms M, N such that M and N are *not* α -equivalent and:

$$((\lambda x. x)(\lambda x. xx))((\lambda x. x)(\lambda x. xx)) \rightarrow M$$

$$((\lambda x. x)(\lambda x. xx))((\lambda x. x)(\lambda x. xx)) \rightarrow N$$

(c) What happens if you continue reducing M and N ?

(d) Let $T \triangleq \lambda x. xxx$. Perform some β -reduction steps on TT . There is no need to give full derivation trees. What do you observe?

SOLUTION: β -REDUCTION (PART)

iv.

$$\frac{\frac{\overline{(\lambda x. x)y \rightarrow y}}{x((\lambda x. x)y) \rightarrow xy}}{\lambda x. x((\lambda x. x)y) \rightarrow \lambda x. xy}$$

MULTI-STEP β -REDUCTION: $\longrightarrow_{\beta}^*$

Reflexive-transitive closure of β -reduction under α -conversion

Reflexivity, α -conversion:
$$\frac{M =_{\alpha} M'}{M \longrightarrow_{\beta}^* M'}$$

Transitivity:
$$\frac{M \longrightarrow_{\beta} M'' \quad M'' \longrightarrow_{\beta}^* M'}{M \longrightarrow_{\beta}^* M'}$$

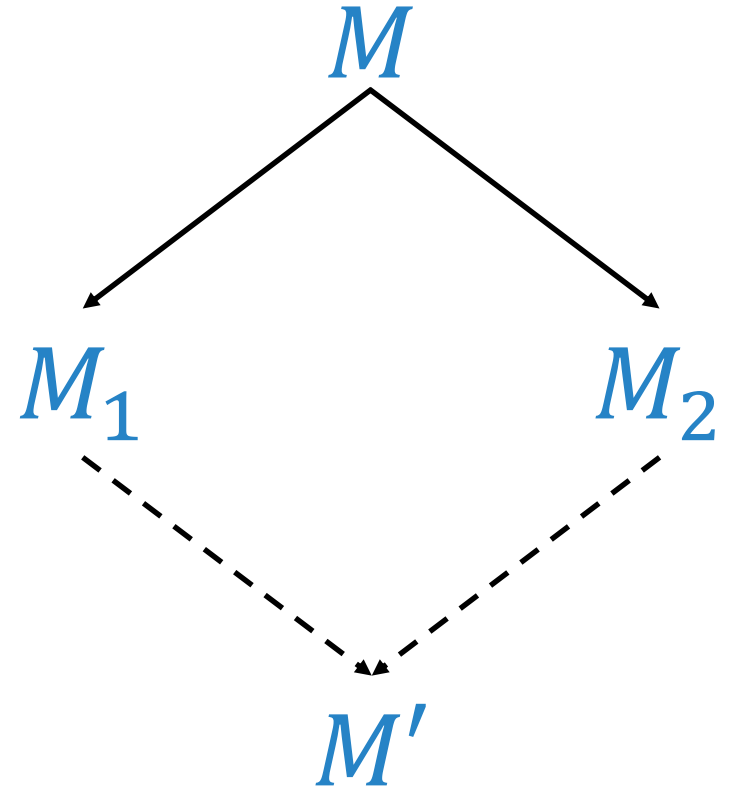
CONFLUENCE

THEOREM (CHURCH-ROSSER)

$\forall M, M_1, M_2.$

$$M \longrightarrow_{\beta}^* M_1 \wedge M \longrightarrow_{\beta}^* M_2 \implies$$

$$\exists M'. M_1 \longrightarrow_{\beta}^* M' \wedge M_2 \longrightarrow_{\beta}^* M'$$



β -NORMAL FORMS

λ -terms are in β -normal form if they contain no redexes.

$$\text{is_in_nf}(M) \stackrel{\text{def}}{=} \forall M'. M \not\rightarrow_{\beta} M'$$

$$\text{has_nf}(M) \stackrel{\text{def}}{=} \exists M'. M \rightarrow_{\beta}^* M' \wedge \text{is_in_nf}(M')$$

THEOREM (UNIQUENESS OF β -NORMAL FORMS)

$$\forall M, N_1, N_2. M \rightarrow_{\beta}^* N_1 \wedge M \rightarrow_{\beta}^* N_2 \wedge$$

$$\text{is_in_nf}(N_1) \wedge \text{is_in_nf}(N_2) \implies N_1 =_{\alpha} N_2$$

β -NORMAL FORMS

THEOREM (UNIQUENESS OF β -NORMAL FORMS)

$$\forall M, N_1, N_2. M \longrightarrow_{\beta}^* N_1 \wedge M \longrightarrow_{\beta}^* N_2 \wedge \\ \text{is_in_nf}(N_1) \wedge \text{is_in_nf}(N_2) \implies N_1 =_{\alpha} N_2$$

PROOF. From Church-Rosser, obtain N , such that $N_1 \longrightarrow_{\beta}^* N$ and $N_2 \longrightarrow_{\beta}^* N$. However, since N_1 and N_2 are in normal form, we have that $N_1 =_{\alpha} N =_{\alpha} N_2$.

TUTORIAL: β -NORMAL FORMS

5. (**β -normal-forms.**) For each of the following λ -terms, find its normal form, if it exists.

(a) $(\lambda x. x)y$

(b) $y(\lambda x. x)$

(c) $(\lambda x. x)(\lambda y. y)$

(d) $(\lambda x. xx)(\lambda x. xx)$

(e) $(\lambda x. xx)(\lambda x. x)$

(f) $(\lambda x. x)(\lambda x. xx)$

SOLUTION: β -NORMAL FORMS

(β -normal-forms.)

- (a) $(\lambda x. x)y$ has nf y : $(\lambda x. x)y \rightarrow_{\beta} y$, no further reduction possible (nfrp).
- (b) $y(\lambda x. x)$ is already in nf, as no reductions can be done at all.
- (c) $(\lambda x. x)(\lambda y. y)$ has nf $\lambda y. y$: $(\lambda x. x)(\lambda y. y) \rightarrow_{\beta} \lambda y. y$, nfrp.
- (d) $(\lambda x. xx)(\lambda x. xx)$ has no normal form, as it keeps reducing to itself.
- (e) $(\lambda x. xx)(\lambda x. x)$ has nf $(\lambda x. x)$: $(\lambda x. xx)(\lambda x. x) \rightarrow_{\beta} (\lambda x. x)(\lambda x. x) \rightarrow_{\beta} (\lambda x. x)$, nfrp.
- (f) $(\lambda x. x)(\lambda x. xx)$ has nf $(\lambda x. xx)$: $(\lambda x. x)(\lambda x. xx) \rightarrow_{\beta} (\lambda x. xx)$, nfrp.

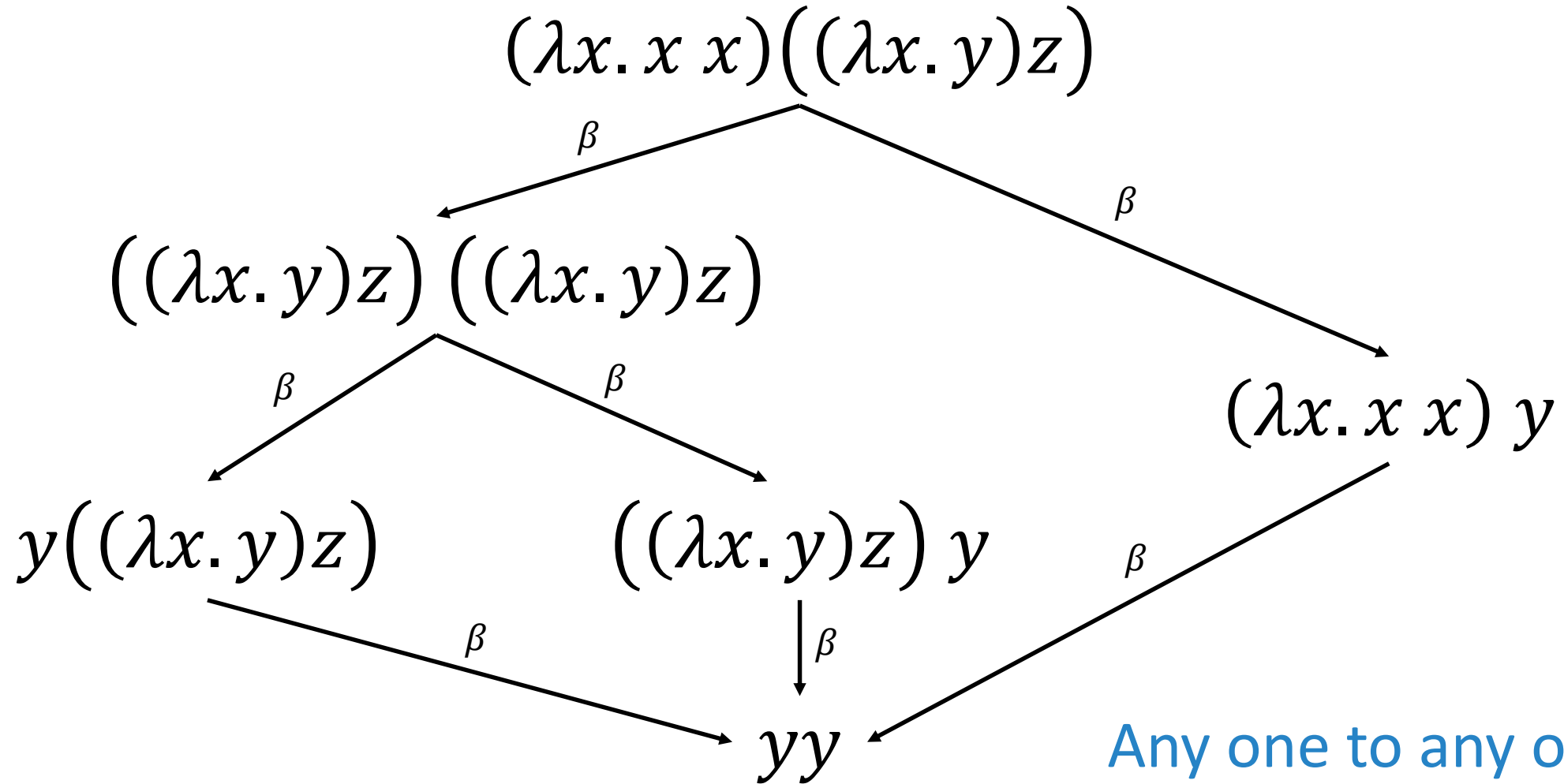
β -EQUIVALENCE: $=_{\beta}$

❖ Smallest equivalence relation containing \rightarrow_{β} ; or

❖ \rightarrow_{β}^* + symmetry; or

❖ $M_1 =_{\beta} M_2 \iff \exists M'. M_1 \rightarrow_{\beta}^* M' \wedge M_2 \rightarrow_{\beta}^* M'$

WHICH OF THESE SIX λ -TERMS ARE β -EQUIVALENT?



β -REDUCTION: NORMALISATION

$$(\lambda x. x x)(\lambda x. x x)$$

Must all λ -terms necessarily
have a normal form?

No, they needn't.

β -REDUCTION: NORMALISATION

$$(\lambda \textcircled{x} x x)(\lambda \underline{x}. x x)$$

Must all λ -terms necessarily
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No, they needn't.

β -REDUCTION: NORMALISATION

$$(\lambda x. x x)(\lambda x. x x)$$



$$(\lambda x. x x)(\lambda x. x x)$$

Must all λ -terms necessarily
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No, they needn't.

β -REDUCTION: NORMALISATION

$$(\lambda x. x x)(\lambda x. x x)$$
 β
$$(\lambda x. x x)(\lambda x. x x)$$
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Must all λ -terms necessarily have a normal form?

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β -REDUCTION: NORMALISATION

Must all λ -terms necessarily have a normal form?

No, they needn't.

$(\lambda x. x x)(\lambda x. x x)$

β

$(\lambda x. x x)(\lambda x. x x)$

β

$(\lambda x. x x)(\lambda x. x x)$

β

...and so on...

DOES THE ORDER OF REDUCTION MATTER?

It matters... $(\lambda x. y)((\lambda x. x x)(\lambda x. x x))$

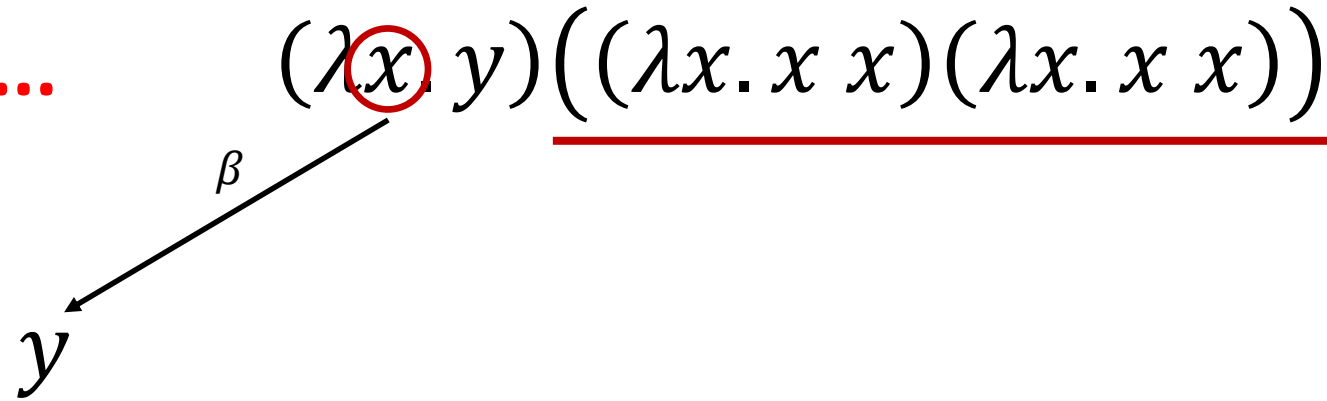
DOES THE ORDER OF REDUCTION MATTER?

It matters...

$$(\lambda x. y) \left(\underline{((\lambda x. x x) (\lambda x. x x))} \right)$$

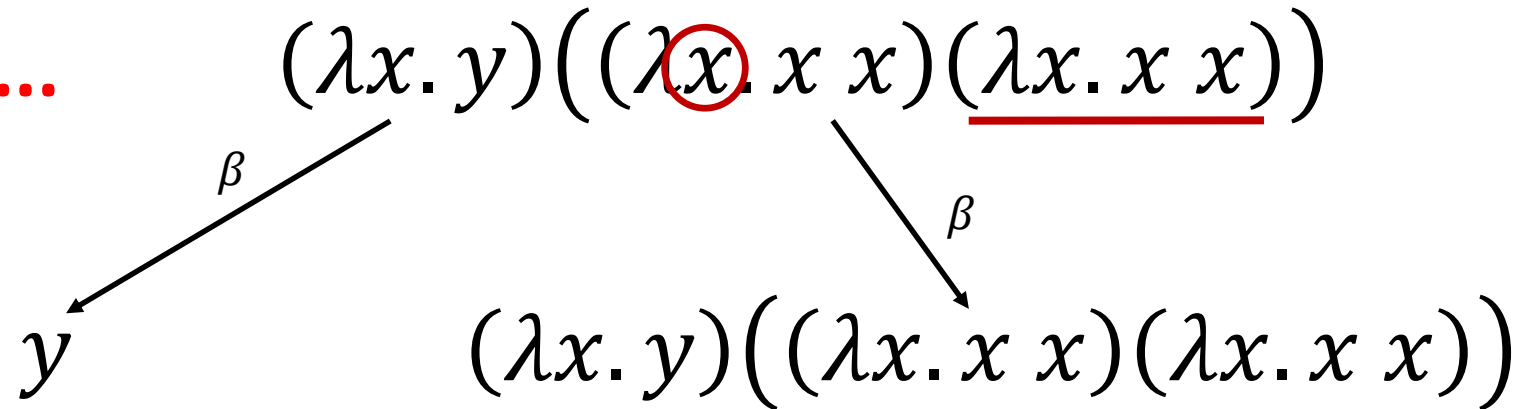
β

y



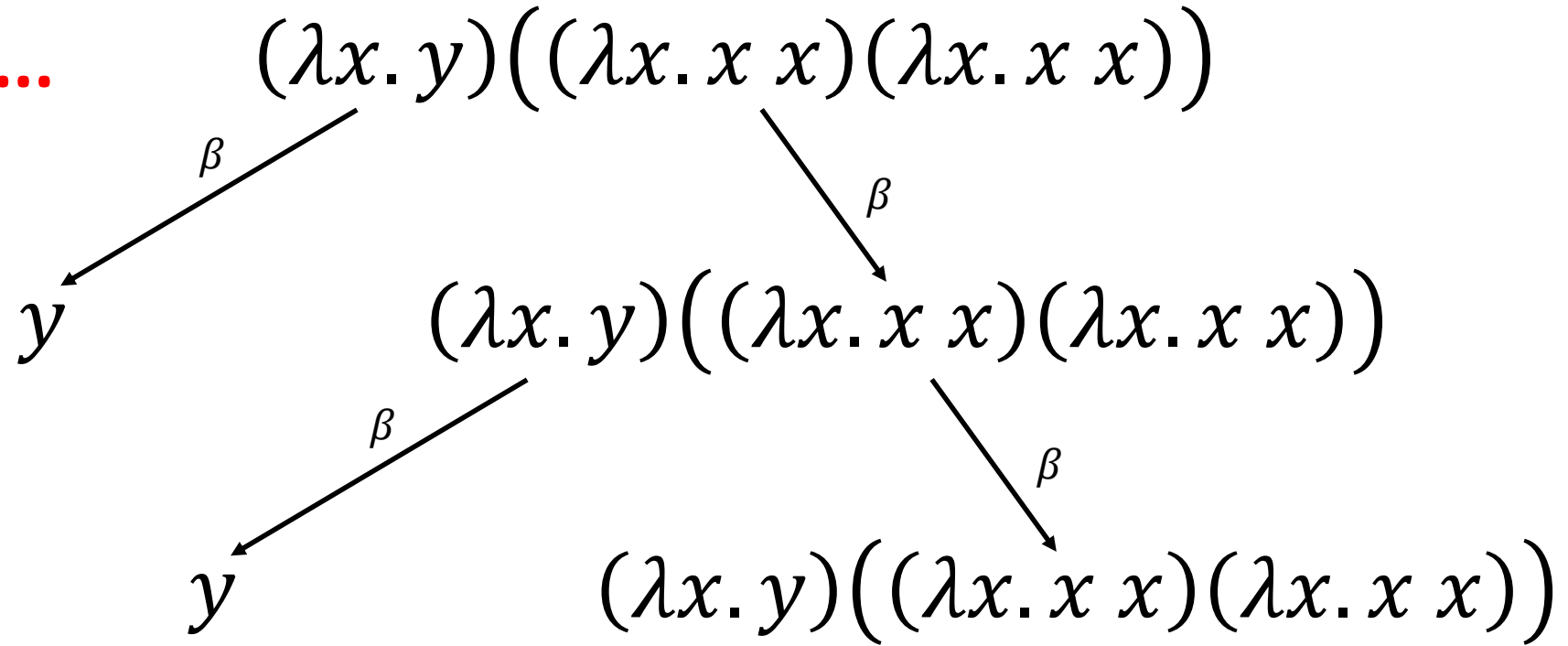
DOES THE ORDER OF REDUCTION MATTER?

It matters...



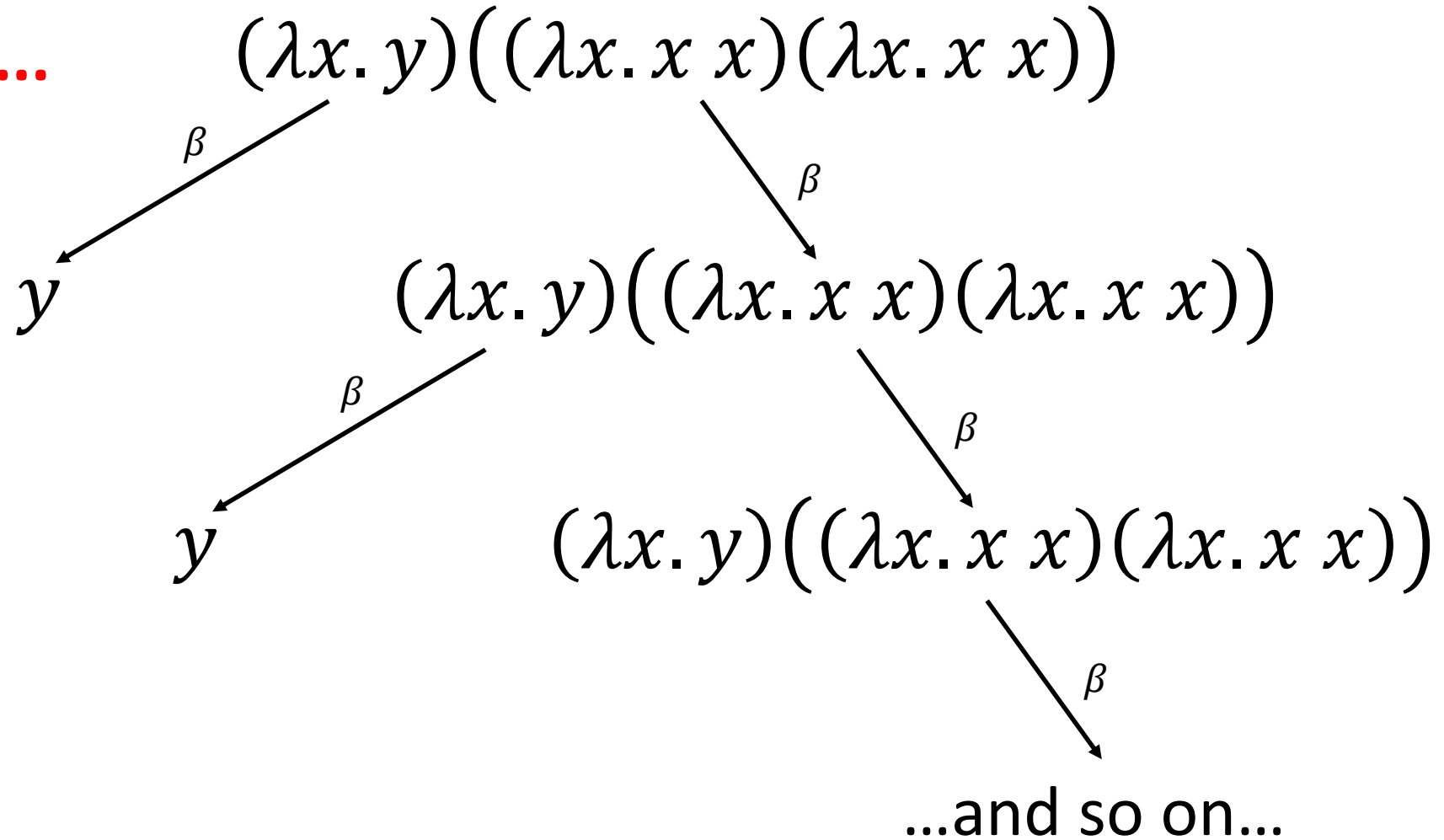
DOES THE ORDER OF REDUCTION MATTER?

It matters...



DOES THE ORDER OF REDUCTION MATTER?

It matters...



INNERMOST AND OUTERMOST REDEXES

TAKE A REDEX: $E = (\lambda x. M) N$

Any redex that is in M or in N is **inside** the redex E

The redex E is **outside** any redex that is in M or in N

A redex is **outermost** if there are no redexes outside it.

A redex is **innermost** if there are no redexes inside it.

$((\lambda x y. x y x) t u) \left(\left(\lambda x y z. x ((\lambda x. x x) y) \right) v ((\lambda x. x y) w) \right)$

(leftmost) outermost

(leftmost) innermost

outermost

(rightmost) outermost

REDUCTION STRATEGIES

NORMAL ORDER

Reduces the **leftmost outermost** redex first

Always reduces a term to its normal form (if the normal form exists)

CALL BY NAME

Reduces the **leftmost outermost** redex first

Does not reduce inside λ -abstractions

Does not always reduce a term to its normal form

CALL BY VALUE

Reduces the **leftmost innermost** redex first

Does not reduce inside λ -abstractions

Does not always reduce a term to its normal form

REDUCTION STRATEGIES

NORMAL ORDER

- Can perform computations in unevaluated function bodies
- Is not used by any programming language

CALL BY NAME

- Passes the function parameters unevaluated into the function body
- Evaluates the passed function parameter on each use
- Is used, with some variations, by, for example, Algol60, Haskell, R, and LaTeX

CALL BY VALUE

- Evaluates the function parameters before passing them into the function body
- Terminates less often than call by name, but evaluates parameters only once
- Is used, with some variations, by, for example, C, Scheme, and OCaml

REDUCTION STRATEGIES

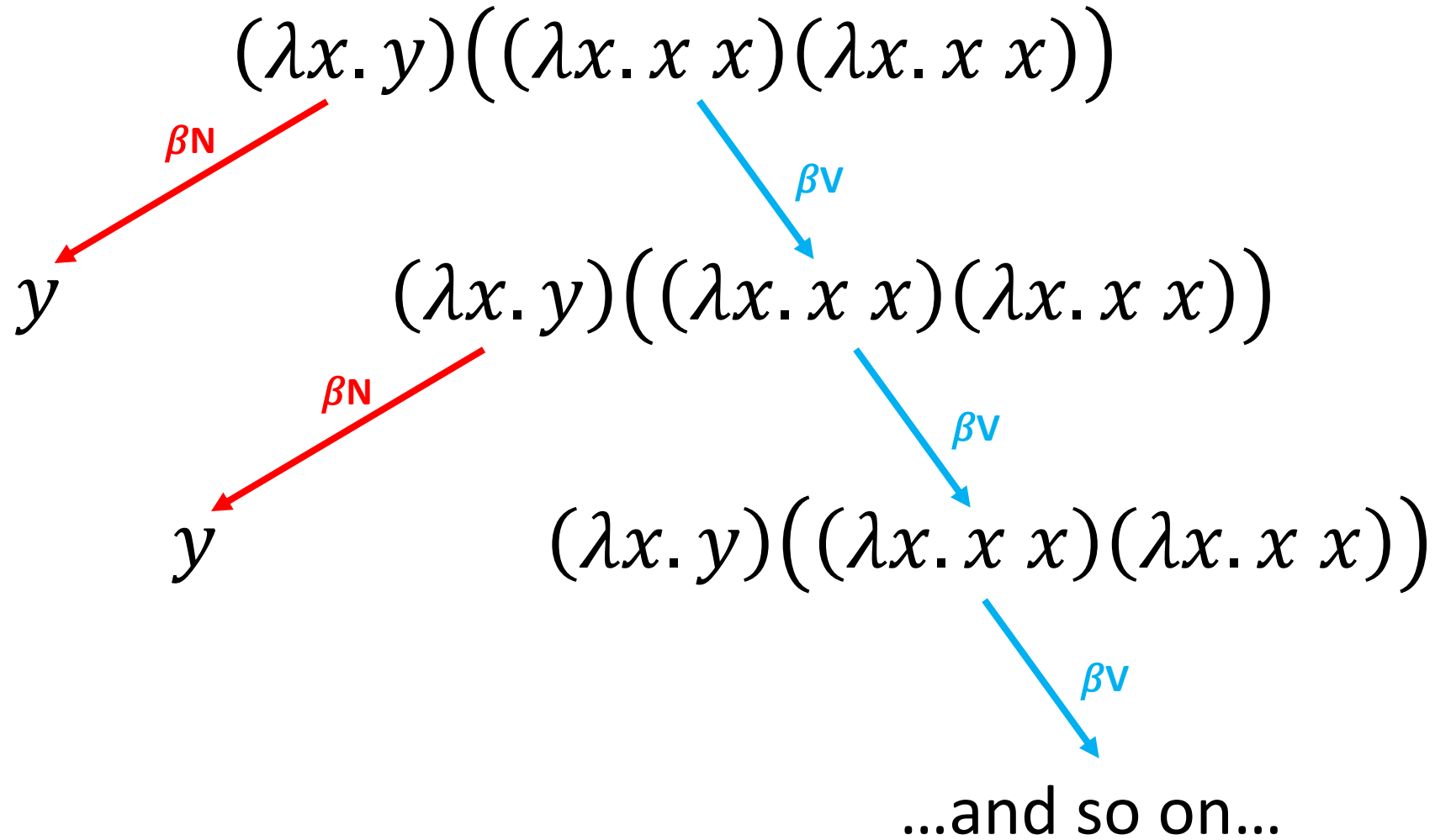
$$((\lambda x y. x y x) t u) \left(\left(\lambda x y z. x ((\lambda x. x x) y) \right) v ((\lambda x. x y) w) \right)$$

NORMAL ORDER: first second third fourth (twice)

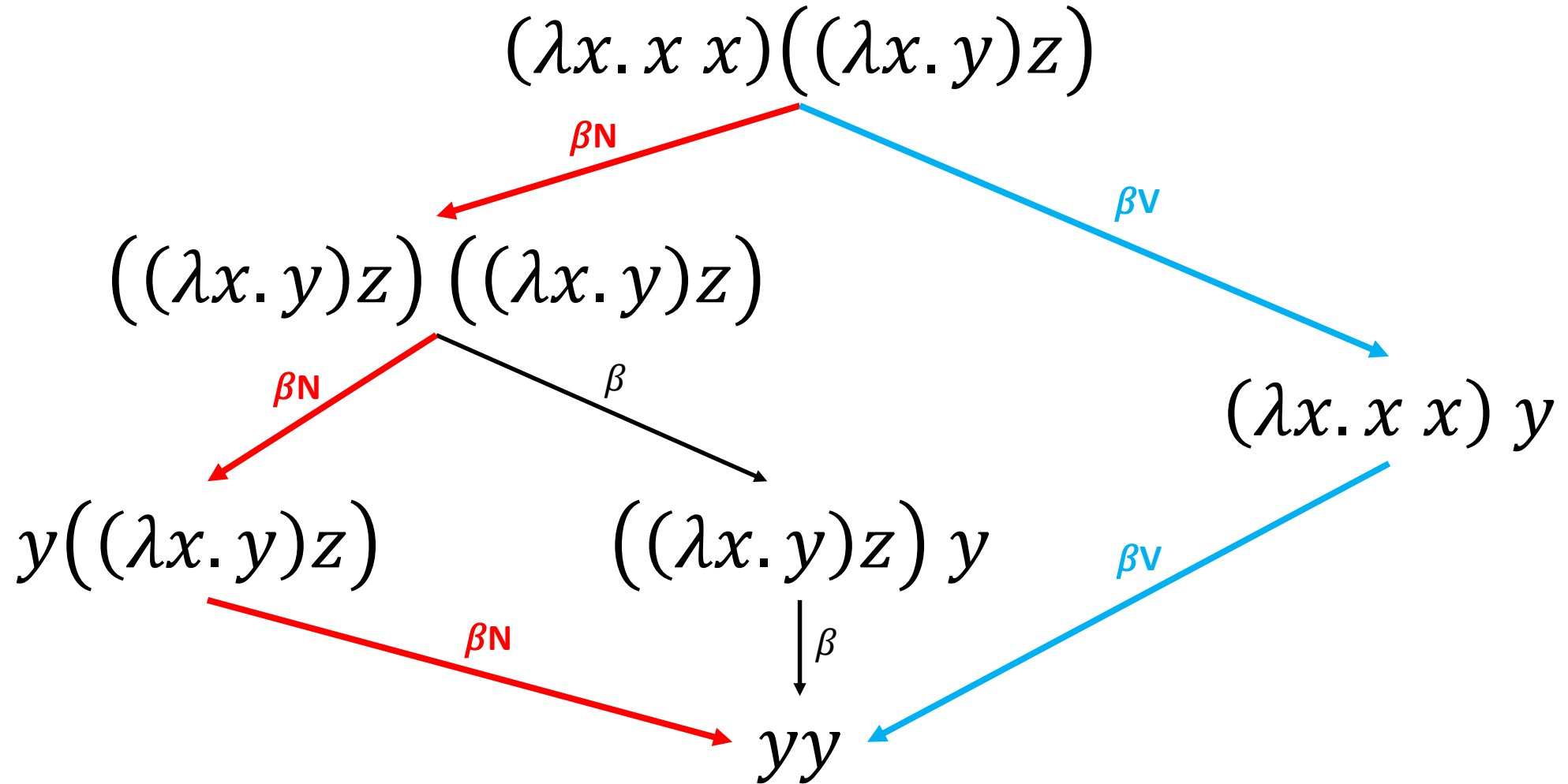
CALL-BY-NAME: first second never never

CALL-BY-VALUE: first second third never

REDUCTION STRATEGIES



REDUCTION STRATEGIES



TUTORIAL: REDUCTION STRATEGIES

6. (**Reduction strategies.**) Consider the λ -term:

$$((\lambda xy. x y x) t u)((\lambda xyz.x ((\lambda x. x x) y)) v ((\lambda x. x y) w))$$

Perform as many as possible reduction steps for this term, ignoring α -conversion and using:

- (a) the normal order reduction strategy;
- (b) the call by name reduction strategy;
- ➡ (c) the call by value reduction strategy;

For each step, underline the redex that is to be reduced in the next step. Comment on the differences that you observed.

SOLUTION: REDUCTION STRATEGIES

(b) Call by value: leftmost innermost redex first, no reduction under λ

$$\begin{aligned} & \frac{((\lambda xy. x y x) t u)}{((\lambda y. t y t) u)((\lambda xyz. x ((\lambda x. x x) y)) v ((\lambda x. x y) w))} \rightarrow_{\beta} \\ & \frac{((\lambda y. t y t) u)((\lambda xyz. x ((\lambda x. x x) y)) v ((\lambda x. x y) w))}{(t u t)((\lambda xyz. x ((\lambda x. x x) y)) v ((\lambda x. x y) w))} \rightarrow_{\beta} \\ & \frac{(t u t)((\lambda xyz. x ((\lambda x. x x) y)) v ((\lambda x. x y) w))}{(t u t)((\lambda yz. v ((\lambda x. x x) y)) ((\lambda x. x y) w))} \rightarrow_{\beta} \\ & \frac{(t u t)((\lambda yz. v ((\lambda x. x x) y)) (w y))}{(t u t)(\lambda z. v ((\lambda x. x x) (w y)))} \rightarrow_{\beta} \\ & (t u t)(\lambda z. v ((\lambda x. x x) (w y))). \end{aligned}$$

EXTENSIONALITY: η -EQUIVALENCE

$$(\lambda x. f \ x) \neq_{\beta} f \quad \text{but} \quad (\lambda x. f \ x) \textcolor{blue}{M} =_{\beta} f \ \textcolor{blue}{M}$$

$$\eta\text{-equivalence: } \frac{x \notin \text{FV}(\textcolor{blue}{M})}{(\lambda x. \textcolor{blue}{M} \ x) =_{\eta} \textcolor{blue}{M}}$$

$$\text{More general (but infinitary) rule: } \frac{\textcolor{blue}{M} \ N =_{\eta^+} \textcolor{blue}{M}' \ N, \text{ for all } N}{\textcolor{blue}{M} =_{\eta^+} \textcolor{blue}{M}'}$$

$=_{\beta\eta}$ and $=_{\beta\eta^+}$ capture “equality” better than just $=_{\beta}$

λ -CALCULUS: THE SIMPLEST PROGRAMMING LANGUAGE

$$M ::= x \quad | \quad \lambda x. M \quad | \quad M M$$

Variable Abstraction
(single-parameter function) Application

WHAT WILL WE COVER IN THESE LECTURES?

SYNTAX

Free/bound variables
 α -equivalence
Substitution

SEMANTICS

β -reduction
Confluence/normal forms
Reduction strategies

APPLICATIONS

Expressivity
Arithmetic, Data structures
Recursion

REGISTER MACHINES, TURING MACHINES: COMPUTABILITY

RM-computability. A partial function $f: \mathbb{N}^n \rightarrow \mathbb{N}$ is RM-computable *iff* there exists a register machine M with at least $n + 1$ registers, R_0, \dots, R_n , with the following property: starting M from the state in which $R_0 = 0, R_i = x_i \mid_{i=1}^n$, M halts *iff* $f(x_1, \dots, x_n) \downarrow$, and in that case $R_0 = y$, where $y = f(x_1, \dots, x_n)$.



Turing-computability. A partial function $f: \mathbb{N}^n \rightarrow \mathbb{N}$ is Turing-computable *iff* there exists a Turing machine M with the following property: starting M from its initial state, with tape head on the leftmost 0 of a tape coding $[x_1, \dots, x_n]$, M halts *iff* $f(x_1, \dots, x_n) \downarrow$, and in that case the final tape codes a list whose first element is y , where $y = f(x_1, \dots, x_n)$.

λ -CALCULUS: DEFINABILITY

A partial function $f: \mathbb{N}^n \rightarrow \mathbb{N}$ is **λ -definable** iff there exists a closed λ -term M with the following property:

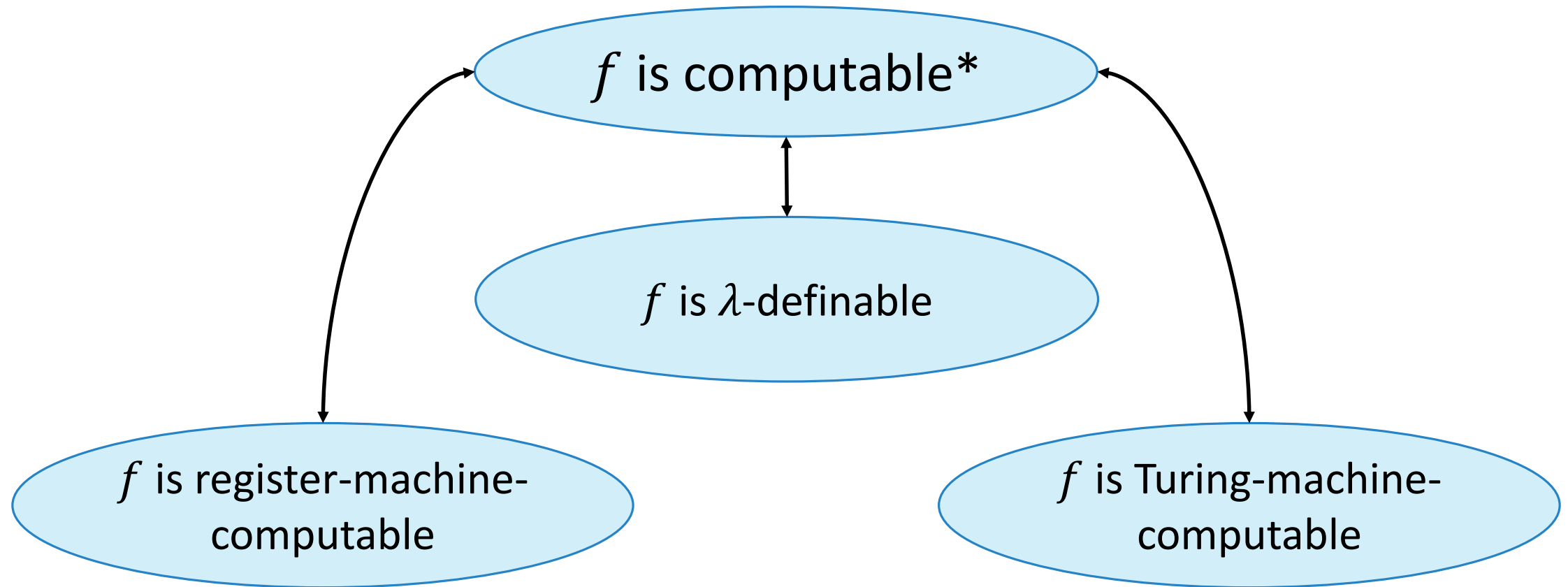
$$f(x_1, \dots, x_n) = y \quad \text{iff} \quad M \, \underline{x_1} \, \underline{x_2} \, \dots \, \underline{x_n} =_{\beta} \underline{y}$$

and

$$f(x_1, \dots, x_n) \uparrow \quad \text{iff} \quad M \, \underline{x_1} \, \underline{x_2} \, \dots \, \underline{x_n} \text{ has no normal form}$$

where \underline{n} denotes the encoding of the natural number n in the λ -calculus.

THE CHURCH-TURING THESIS



* by a human following an algorithm, ignoring resource limitations

λ -CALCULUS: ENCODING NATURAL NUMBERS

Church numerals: $\underline{n} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n$

Informally, a Church numeral n means:

“to do something n times”

$$\underline{0} \stackrel{\text{def}}{=} \lambda f. \lambda x. x$$

$$\underline{1} \stackrel{\text{def}}{=} \lambda f. \lambda x. f x$$

$$\underline{2} \stackrel{\text{def}}{=} \lambda f. \lambda x. f (f x)$$

$$\underline{3} \stackrel{\text{def}}{=} \lambda f. \lambda x. f (f (f x))$$

...

ENCODING ADDITION

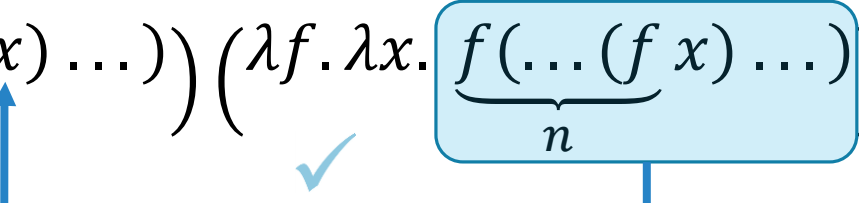
We have: $\underline{m} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m$ and $\underline{n} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n$

We need: $\text{plus } \underline{m} \underline{n} =_{\beta} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_{m+n}$

ENCODING ADDITION

We have: $\underline{m} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m$ and $\underline{n} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n$

plus $(\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m) (\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n) =_{\beta} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_{m+n}$



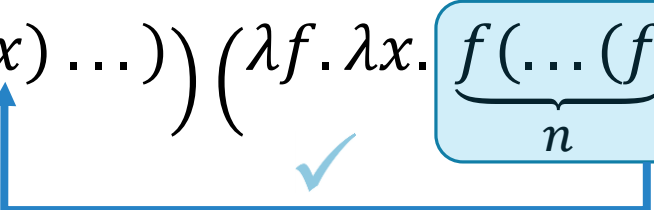
ENCODING ADDITION

We have: $\underline{m} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m$ and $\underline{n} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n$
 plus $(\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m) (\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n) =_{\beta} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_{m+n}$

- ❖ Obtain the body of \underline{n} : $\underline{n} f x =_{\beta} \underbrace{f(\dots(f x) \dots)}_n$
- ❖ Put this in the body of \underline{m} : $\underline{m} f (\underline{n} f x) =_{\beta} \underbrace{f(\dots(f x) \dots)}_{m+n}$
- ❖ Make this a Church numeral: $\lambda f. \lambda x. \underline{m} f (\underline{n} f x) =_{\beta} \underline{m + n}$
- ❖ Make this a function that accepts m and n: $\lambda m. \lambda n. \lambda f. \lambda x. m f (n f x)$

ENCODING ADDITION

We have: $\underline{m} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m$ and $\underline{n} \stackrel{\text{def}}{=} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n$
plus $(\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_m) (\lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_n) =_{\beta} \lambda f. \lambda x. \underbrace{f(\dots(f x) \dots)}_{m+n}$



plus $\equiv \lambda m. \lambda n. \lambda f. \lambda x. m f (n f x)$

Exercise: Evaluate “plus $\underline{2} \ \underline{3}$ ”.

TUTORIAL: ENCODING MULTIPLICATION

(Encoding Multiplication in the λ -calculus.) Recall the Church numerals:

$$\underline{n} = (\lambda f. \lambda x. \underbrace{f(\dots (f x) \dots)}_n).$$

Also, Recall the way in which we encoded addition:

$$\lambda m. \lambda n. \lambda f. \lambda x. m \ f \ (n \ f \ x).$$

Design a λ -term `mult` that encodes multiplication and test it by computing `mult 2 3`. Explain your thinking process in the design phase.

SOLUTION: ENCODING MULTIPLICATION (PART 1)

We have $\underline{m} = \lambda f. \lambda x. f^m x$ and $\underline{n} = \lambda f. \lambda x. f^n x$. From these two, we need to construct $f^{m \cdot n} x$. Informally, we can do that by replacing each of the m occurrences of f in m with \underline{n} applications of f . We could try in the same way as for the addition, taking $(n \ f \ x)$ and going for $m \ (n \ f \ x)$, since now we have to substitute for f , not for x . However, this produces:

$$\begin{aligned} m \ (n \ f \ x) &= (\lambda f. \lambda x. \underbrace{f(\dots(f \ x) \dots)}_m) (n \ f \ x) &= (\lambda f. \lambda x. \underbrace{f(\dots(f \ x) \dots)}_m) (f^n \ x) \\ &&\rightarrow_{\beta} (\lambda x. \underbrace{((f^n \ x) \dots ((f^n \ x) \ x) \dots)}_m) \end{aligned}$$

but we cannot β -reduce this further. We need to be able to propagate the inside x .

SOLUTION: ENCODING MULTIPLICATION (PART 2)

Let's try with $(n\ f)$ instead of $(n\ f\ x)$:

$$\begin{aligned} m\ (n\ f) &= (\lambda f. \lambda x. \underbrace{f(\dots (f\ x) \dots)}_m) (n\ f) \\ &= (\lambda f. \lambda x. \underbrace{f(\dots (f\ x) \dots)}_m) (\lambda x. f^n\ x) \\ &=_{\beta} (\lambda x. \underbrace{((\lambda x. f^n\ x) \dots ((\lambda x. f^n\ x)\ x) \dots)}_m) \\ &\rightarrow_{\beta} (\lambda x. \underbrace{((\lambda x. f^n\ x) \dots ((\lambda x. f^n\ x)(f^n\ x)) \dots)}_m) \\ &\rightarrow_{\beta} (\lambda x. \underbrace{((\lambda x. f^n\ x) \dots ((\lambda x. f^n\ x)(f^{2 \cdot n}\ x)) \dots)}_{m-1}) \\ &\rightarrow_{\beta}^* (\lambda x. \underbrace{f^{m \cdot n}\ x}_{m-2}) \end{aligned}$$

What remains is to wrap $m\ (n\ f)$ so that it is a function that takes two Church numerals (an additional $\lambda m. \lambda n$ and returns a Church numeral (an additional λf , like we did for the addition:

$$\text{mult} \equiv \lambda m. \lambda n. \lambda f. m\ (n\ f).$$

SOME MORE ENCODINGS WITH NATURAL NUMBERS

Exponentiation:

$$\underline{m}^n \stackrel{\text{def}}{=} \lambda m. \lambda n. n \ m$$

Conditional: if $(m = 0)$ then x_1 else x_2

$$\text{ifz} \stackrel{\text{def}}{=} \lambda m. \lambda x_1. \lambda x_2. m \ (\lambda z. x_2) \ x_1$$

Exercise: define the successor and predecessor functions!

TUTORIAL: ENCODING PAIRS

3. (**Pairs.**)

Given two λ -terms, v_1, v_2 , the pair of the two terms can be expressed in the λ -calculus as $\lambda p. p \ v_1 \ v_2$ (where p does not occur free in v_1 or v_2). Define the following functions as λ -terms:

- (a) **pair**, which takes two λ -terms and constructs the pair of them;
- (b) **fst**, which returns the first value in a pair;
- (c) **snd**, which returns the second value in a pair.

SOLUTION: ENCODING PAIRS

(a)

$$\text{pair} \stackrel{\text{def}}{=} \lambda v_1 v_2. (\lambda p. p v_1 v_2)$$

(b) Given the pair $\lambda p. p v_1 v_2$, we have

$$\begin{aligned} (\lambda p. p v_1 v_2)(\lambda w_1 w_2. w_1) &\rightarrow (\lambda w_1 w_2. w_1) v_1 v_2 \\ &\rightarrow (\lambda w_2. v_1) v_2 \\ &\rightarrow v_1 \end{aligned}$$

(up to alpha conversion) so we want `fst` to be a function that applies its argument (the pair) to the term $(\lambda w_1 w_2. w_1)$:

$$\text{fst} \stackrel{\text{def}}{=} \lambda q. q(\lambda w_1 w_2. w_1)$$

(c)

$$\text{snd} \stackrel{\text{def}}{=} \lambda q. q(\lambda w_1 w_2. w_2)$$

INTERLUDE: COMBINATORS

Combinators: closed λ -terms.

$$I \stackrel{\text{def}}{=} \lambda x. x$$

$$K \stackrel{\text{def}}{=} \lambda xy. x$$

$$S \stackrel{\text{def}}{=} \lambda xyz. xz(yz)$$

$$T \stackrel{\text{def}}{=} \lambda xy. yx$$

$$C \stackrel{\text{def}}{=} \lambda xyz. xzy$$

$$V \stackrel{\text{def}}{=} \lambda xyz. zxy$$

$$B \stackrel{\text{def}}{=} \lambda xyz. x(yz)$$

$$B' \stackrel{\text{def}}{=} \lambda xyz. y(xz)$$

$$W \stackrel{\text{def}}{=} \lambda xy. xyy$$

SKI and application are all we need to define **any computable function**, meaning that we can even get rid of the λ -abstraction.

This is called the SKI-combinator calculus.

TUTORIAL: COMBINATORS

4. (SKI Combinators.)

Let $S \stackrel{\text{def}}{=} \lambda xyz.(xz)(yz)$ and $K \stackrel{\text{def}}{=} \lambda xy.x$. Reduce SKK to normal form. (Hint: This can be messy if you are not careful. Keep the abbreviations S and K around as long as you can and replace them with their corresponding λ -terms only if you need to. This makes it much easier)

SOLUTION: COMBINATORS

(SKI Combinators.)

$$\begin{aligned} & SKK \\ &= (\lambda xyz. (xz)(yz))KK \\ &\rightarrow (\lambda yz. (Kz)(yz))K \\ &\rightarrow \lambda z. (Kz)(Kz) \\ &= \lambda z. ((\lambda xy. x)z)(Kz) \\ &\rightarrow \lambda z. (\lambda y. z)(Kz) \\ &\rightarrow \lambda z. z \end{aligned}$$

Notice that we shown that SKK is α -equivalent to I . Given our definitions of S and K , we could define $I \stackrel{\text{def}}{=} SKK$ (or indeed $I \stackrel{\text{def}}{=} SKS$ – can you see why?)

RECURSION: FACTORIAL

Factorial: $\text{fact } n \stackrel{\text{def}}{=} \text{if } (n = 0) \text{ then } 1 \text{ else } n * \text{fact}(n-1)$

Encoding: $\text{fact} =_{\beta} \lambda n. \text{ifz } n \ \underline{1} \left(\text{mult } n \left(\text{fact } (\text{pred } n) \right) \right)$

$$\text{fact} =_{\beta} \underbrace{\left(\lambda f. \lambda n. \text{ifz } n \ \underline{1} \left(\text{mult } n \left(f \left(\text{pred } n \right) \right) \right) \right)}_F \text{fact}$$

This means that fact is a **fixpoint** of F

Can we define the fixpoint operator in the λ -calculus?

RECURSION: THE Y COMBINATOR

$$Y \stackrel{\text{def}}{=} \lambda f. (\lambda x. f (x x)) (\lambda x. f (x x))$$

After one step of β -reduction: $Y f \rightarrow_{\beta} f (Y f)$

This means that, for any f , $Y f$ is the fixpoint of f ,
that is, that Y is the fixpoint operator.

RECURSION: FACTORIAL REVISITED

Factorial: $\text{fact } n \stackrel{\text{def}}{=} \text{if } (n = 0) \text{ then } 1 \text{ else } n * \text{fact}(n-1)$

Encoding: $\text{fact} \stackrel{\text{def}}{=} Y \left(\lambda f. \lambda n. \text{ifz } n \ \underline{1} \left(\text{mult } n \left(f(\text{pred } n) \right) \right) \right)$

Exercise: Evaluate “fact 2”.