

$\lambda$  calculus,  
reduction strategies ,  
and abstract machines

CS245 — Fall 2019

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# The Lambda Calculus

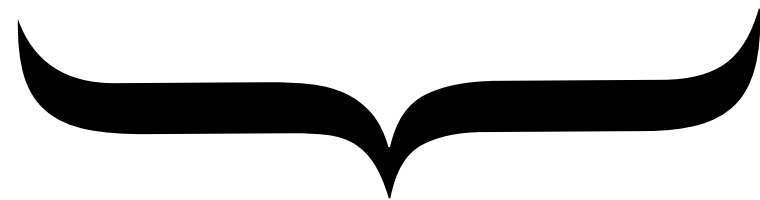
*lambdas* are just anonymous functions!

$e \in \mathbf{Exp} ::= (\lambda (x) e)$	$\lambda$ -abstraction
$\quad \quad \quad   (e e)$	function application
$\quad \quad \quad   x$	variable reference

$x \in \mathbf{Var} ::= \langle \mathbf{variables} \rangle$

**Textual substitution.** This says:  
*replace every  $x$  in  $E_0$  with  $E_1$ .*

$$((\lambda (x) E_0) E_1) \rightarrow_{\beta} E_0[x \leftarrow E_1]$$



redex

(**re**ducible **ex**pression)

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

$$\beta$$
$$x [x \leftarrow (\lambda (x) x)]$$

# Free variables

$$\mathbf{FV} : \mathbf{Exp} \rightarrow \mathcal{P}(\mathbf{Var})$$

$$\mathbf{FV}(x) \triangleq \{x\}$$

$$\mathbf{FV}((\lambda (x) e_b)) \triangleq \mathbf{FV}(e_b) \setminus \{x\}$$

$$\mathbf{FV}(e_f e_a) \triangleq \mathbf{FV}(e_f) \cup \mathbf{FV}(e_a)$$

# The problem with (naive) textual substitution

$((\lambda (a) (\lambda (a) a)) (\lambda (b) b))$

$\downarrow \beta$

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$$((\lambda (a) (\lambda (a) a)) (\lambda (b) b))$$
$$\downarrow \beta$$
$$(\lambda (a) a) [a \leftarrow (\lambda (b) b)]$$

# The problem with (naive) textual substitution

$((\lambda (a) (\lambda (a) a)) (\lambda (b) b))$

$\downarrow \beta$

$(\lambda (a) (\lambda (b) b))$





# Capture-avoiding substitution

$$E_0 [x \leftarrow E_1]$$

$$x[x \leftarrow E] = E$$

$$y[x \leftarrow E] = y \text{ where } y \neq x$$

$$(E_0 \ E_1)[x \leftarrow E] = (E_0[x \leftarrow E] \ E_1[x \leftarrow E])$$

$$(\lambda \ (x) \ E_0)[x \leftarrow E] = (\lambda \ (x) \ E_0)$$

$$(\lambda \ (y) \ E_0)[x \leftarrow E] = (\lambda \ (y) \ E_0[x \leftarrow E])$$

where  $y \neq x$  and  $y \notin FV(E)$

$\beta$ -reduction cannot occur when  $y \in FV(E)$  

# Capture-avoiding substitution

$((\lambda (a) (\lambda (a) a)) (\lambda (b) b))$

$\downarrow \beta$

$(\lambda (a) a)$



**Try an example.** How can you beta-reduce the following expression using capture-avoiding substitution?

$$\begin{aligned} & ((\lambda (y) \\ & \quad ((\lambda (z) (\lambda (y) (z\ y)))\ y)) \\ & (\lambda (x)\ x)) \end{aligned}$$

**Try an example.** How can you beta-reduce the following expression using capture-avoiding substitution?

$$\begin{aligned} & ((\lambda (y) \\ & \quad ((\lambda (z) (\lambda (y) (z\ y)))\ y)) \\ & (\lambda (x)\ x)) \end{aligned}$$

$\downarrow \beta$

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

**Try an example.** How can you beta-reduce the following expression using capture-avoiding substitution?

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

**Try an example.** How can you beta-reduce the following expression using capture-avoiding substitution?

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

**You cannot!** This redex would require:

$(\lambda (y) z) [z \leftarrow (\lambda (x) y)]$

(y is free here, so it would be captured)

**Try an example.** How can you beta-reduce the following expression using capture-avoiding substitution?

$$(\lambda \ (y) \ ((\lambda \ (z) \ (\lambda \ (y) \ z)) \ (\lambda \ (x) \ y)))$$
$$\rightarrow_{\alpha} (\lambda \ (y) \ ((\lambda \ (z) \ (\lambda \ (w) \ z)) \ (\lambda \ (x) \ y)))$$
$$\rightarrow_{\beta} (\lambda \ (y) \ (\lambda \ (w) \ (\lambda \ (x) \ y)))$$

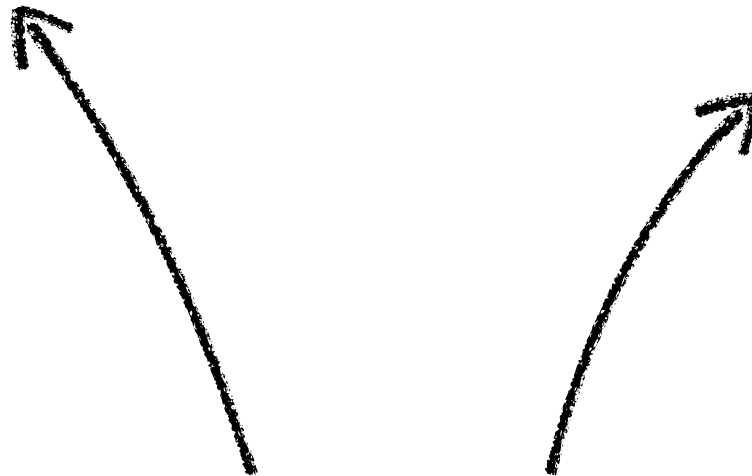
**Instead we alpha-convert first.**



# $\alpha$ - renaming

$(\lambda (x) (\lambda (y) x))$

$(\lambda (a) (\lambda (b) a))$



These two expressions are equivalent—they only differ by their variable names ( $x = a$ ;  $y = b$ )

# $\alpha$ - renaming

$$(\lambda (x) E_\theta) \rightarrow_\alpha (\lambda (y) E_\theta[x \leftarrow y])$$

$=_\alpha$



$\alpha$  renaming/conversions can be run backward,  
so you might think of it as an equivalence relation

# $\alpha$ - renaming

$\alpha$  renaming/conversions can be used to implement capture-avoiding substitution

Rename variables that would break naive substitution!

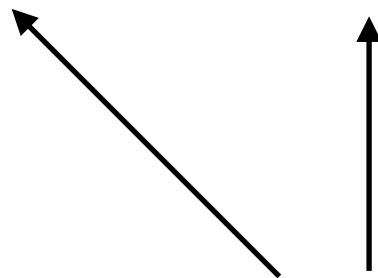
$$((\lambda (x) (\lambda (x) x)) (\lambda (y) y))$$

# $\alpha$ - renaming

$\alpha$  renaming/conversions can be used to implement capture-avoiding substitution

Rename variables that would break naive substitution!

$((\lambda (x) (\lambda (x) x)) (\lambda (y) y))$




Can't perform naive substitution w/o capturing x.

# $\alpha$ - renaming

$\alpha$  renaming/conversions can be used to implement capture-avoiding substitution

Rename variables that would break naive substitution!

$((\lambda (x) (\lambda (x) x)) (\lambda (y) y))$




Fix by  $\alpha$  renaming to  $z$

# $\alpha$ - renaming

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



Fix by  $\alpha$  renaming to  $z$

# $\alpha$ - renaming

$\alpha$  renaming/conversions can be used to implement capture-avoiding substitution

Rename variables that would break naive substitution!

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



Could now perform beta-reduction with naive substitution

# $\eta$ - reduction

$$(\lambda (x) (E_0 x)) \rightarrow_{\eta} E_0 \text{ where } x \notin FV(E_0)$$

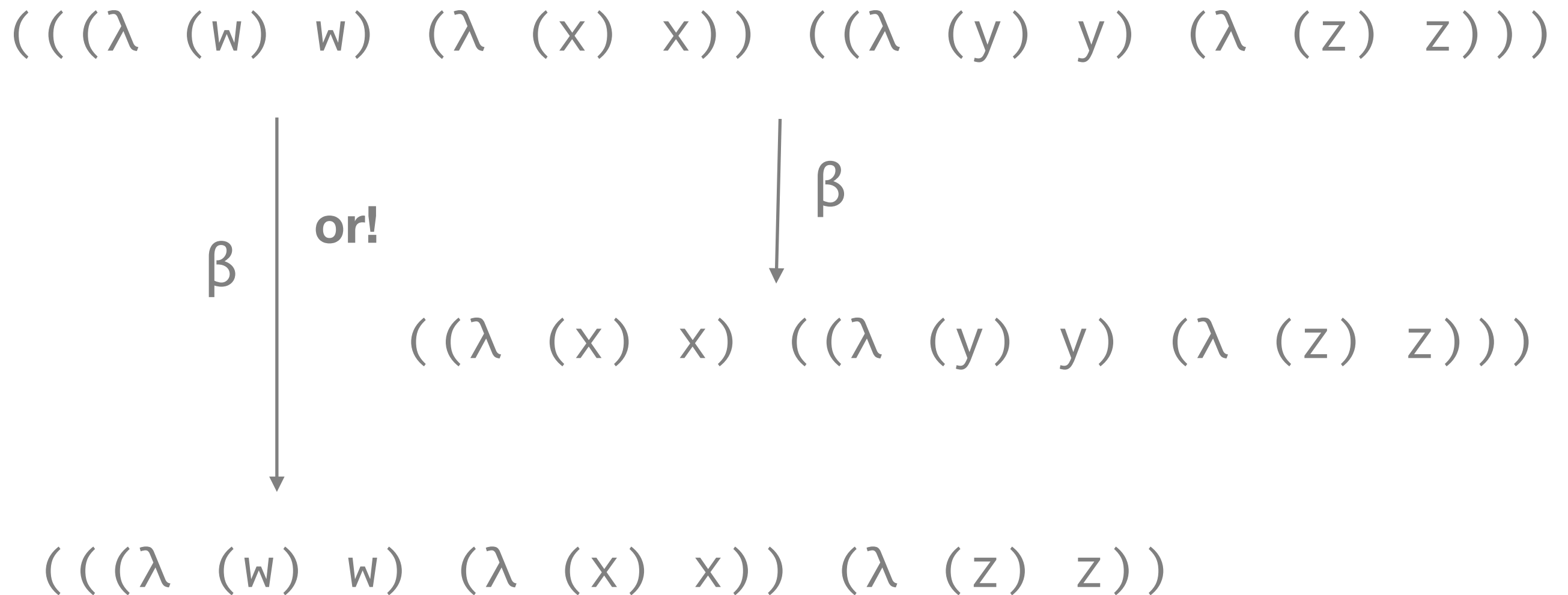


# $\eta$ - expansion

$$E_0 \rightarrow_{\eta} (\lambda (x) (E_0 x)) \text{ where } x \notin FV(E_0)$$

# Earlier...

Evaluation with  $\beta$  reduction is nondeterministic!



If we wanted to define *perform- $\beta$*  (a function that performs a single  $\beta$ -reduction), with this type, what would the problem be?

$$\mathbf{perform}\text{-}\beta : e \rightarrow e$$

**Hint:** Consider how it would execute on...

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

If we wanted to define *perform-β* (a function that performs a single β-reduction), with this type, what would the problem be?

$$\mathbf{perform-\beta} : e \rightarrow e$$

**Answer:** possibly more than one redex! Therefore, multiple possible outputs for single input

$$\mathbf{perform-\beta} : e \rightarrow \wp(e)$$

Instead, would go to a **set** of next exprs

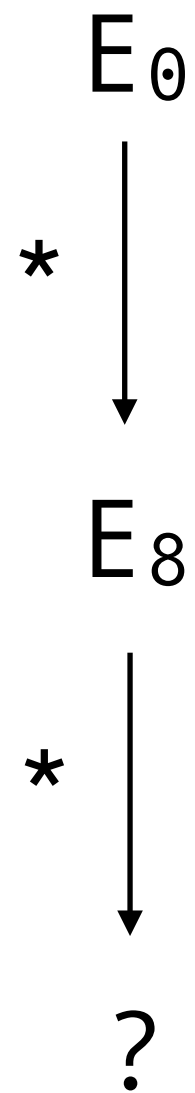
# Reduction

$$(\rightarrow) = (\rightarrow_{\beta}) \cup (\rightarrow_{\alpha}) \cup (\rightarrow_{\eta})$$

$$(\rightarrow^*)$$

reflexive/transitive closure

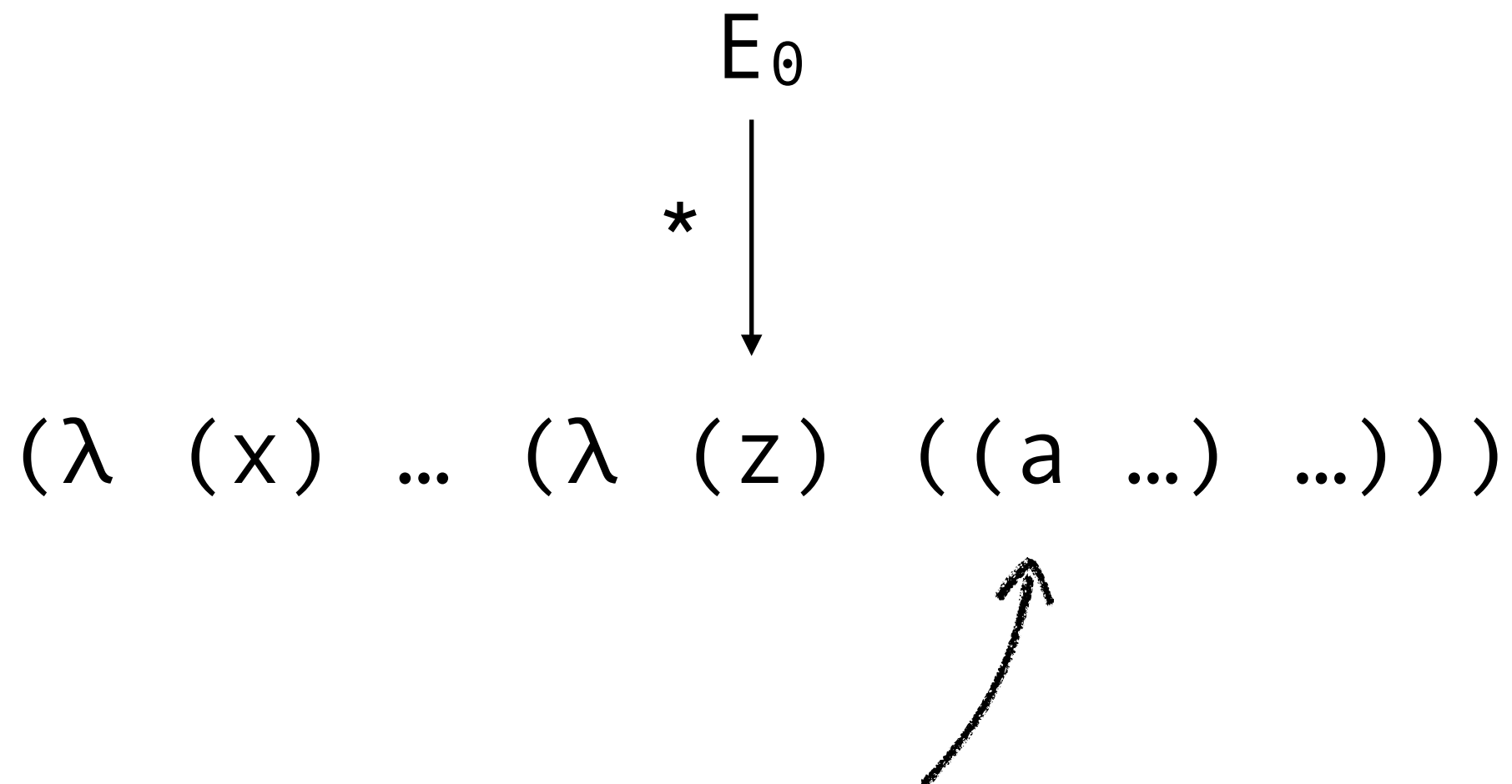
# Evaluation



# Evaluation to *normal form*

$$\begin{array}{c} E_{\theta} \\ \downarrow * \\ (\lambda \ (x) \ \dots) \end{array}$$

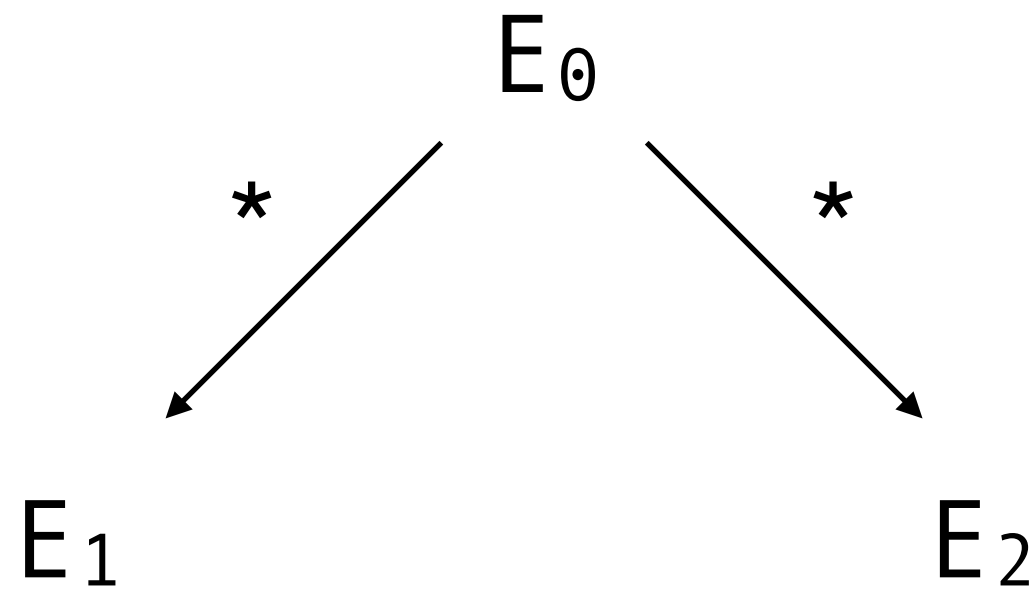
# Evaluation to *normal form*



In ***normal form***, no function position can be a lambda;  
this is to say: *there are no unreduced redexes left!*



# Evaluation Strategy



# Evaluation Strategy

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

$\rightarrow_{\eta} ((\lambda (y) y) (\lambda (z) z))$

$\rightarrow_{\beta} (\lambda (z) z)$

# Evaluation Strategy

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

$\rightarrow_{\beta} ((\lambda (y) y) (\lambda (z) z))$

$\rightarrow_{\beta} (\lambda (z) z)$

# Evaluation Strategy

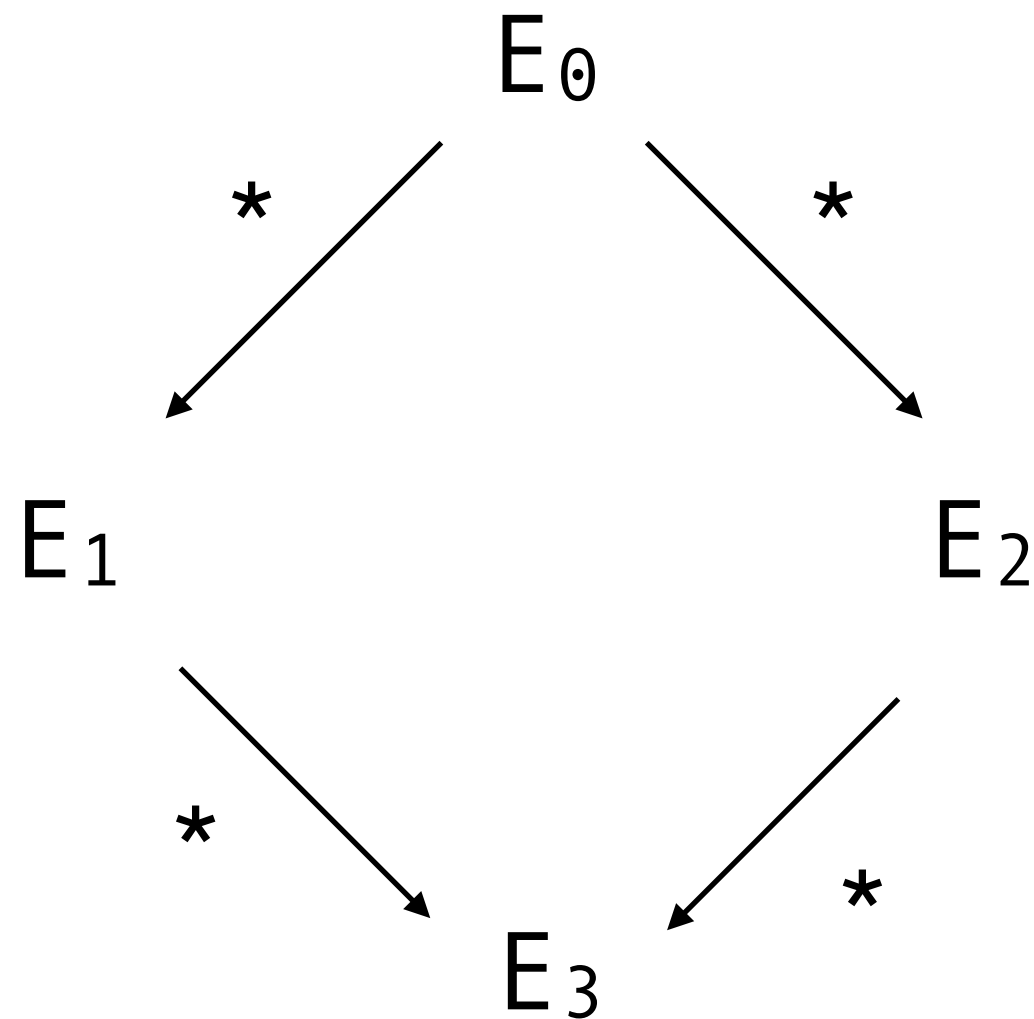
$((\lambda (x) ((\lambda (y) y) x)) (\lambda (z) z))$

$\rightarrow_{\beta} ((\lambda (x) x) (\lambda (z) z))$

$\rightarrow_{\beta} (\lambda (z) z)$

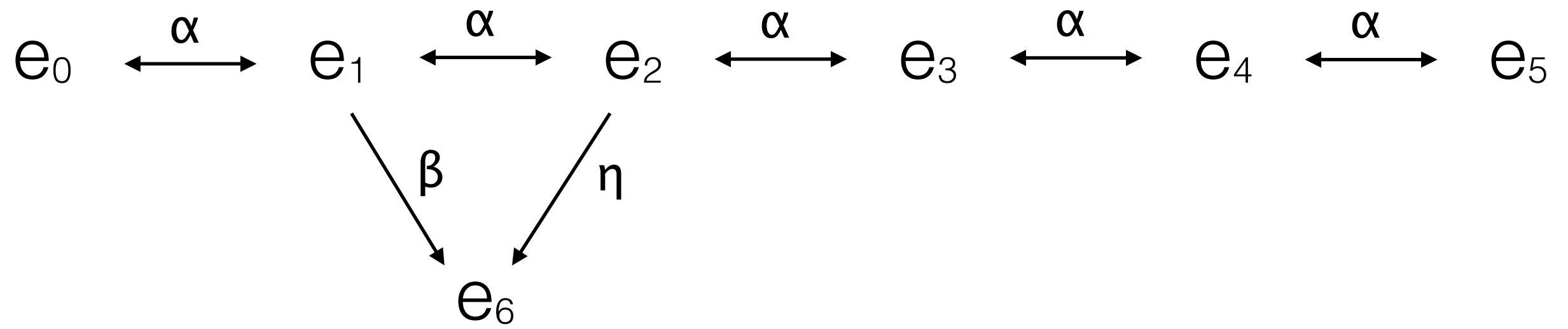
# Confluence

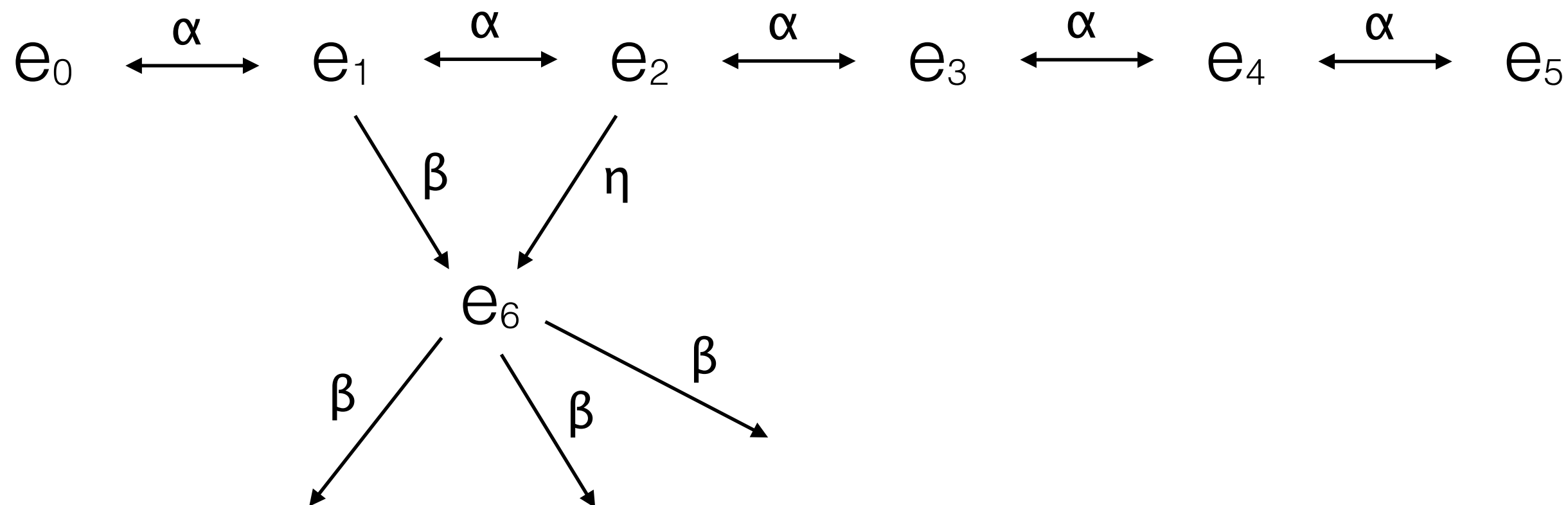
Diverging paths of evaluation must eventually join back together.



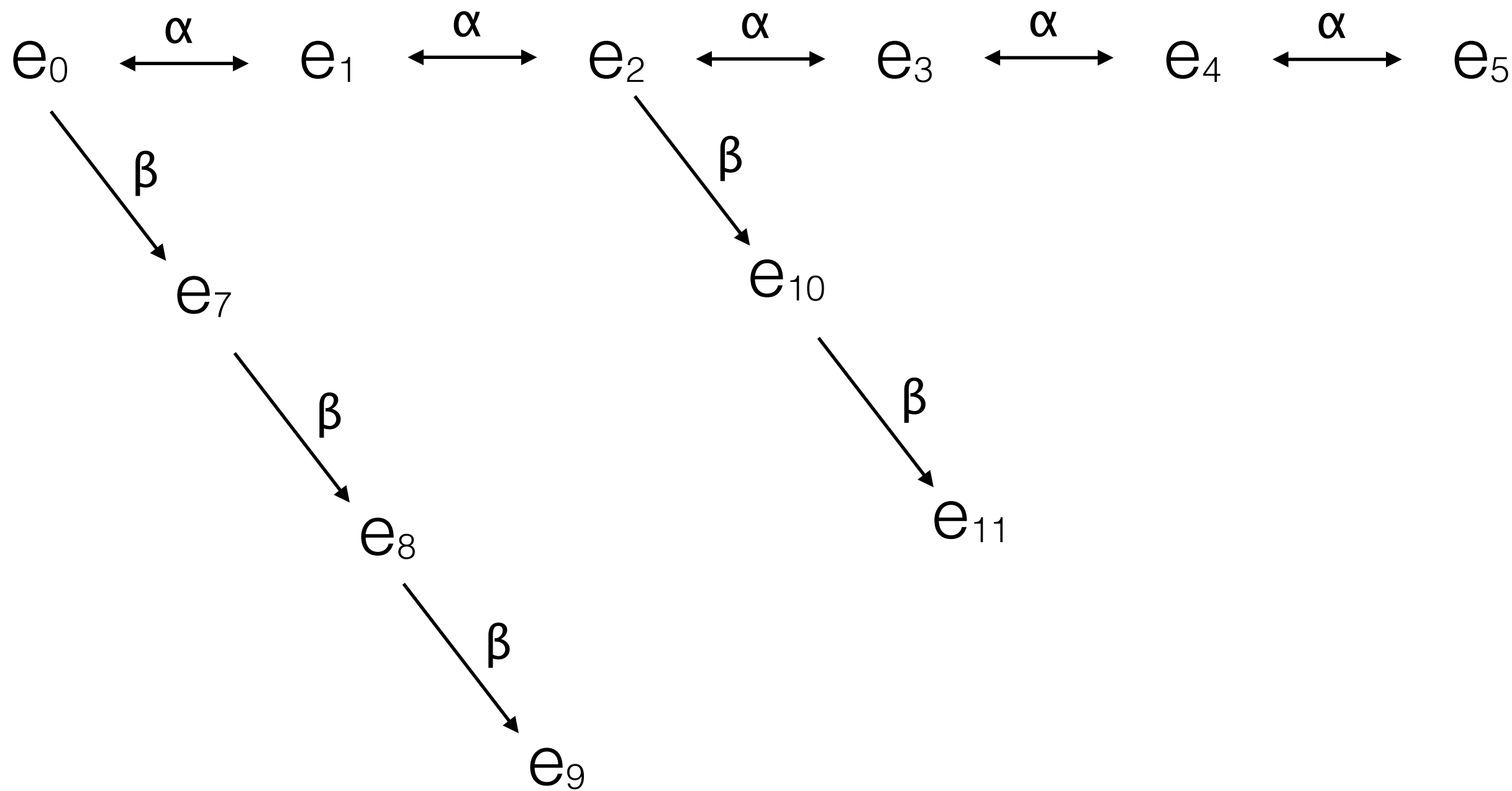
Church-Rosser Theorem

$$e_0 \xleftrightarrow{\alpha} e_1 \xleftrightarrow{\alpha} e_2 \xleftrightarrow{\alpha} e_3 \xleftrightarrow{\alpha} e_4 \xleftrightarrow{\alpha} e_5$$

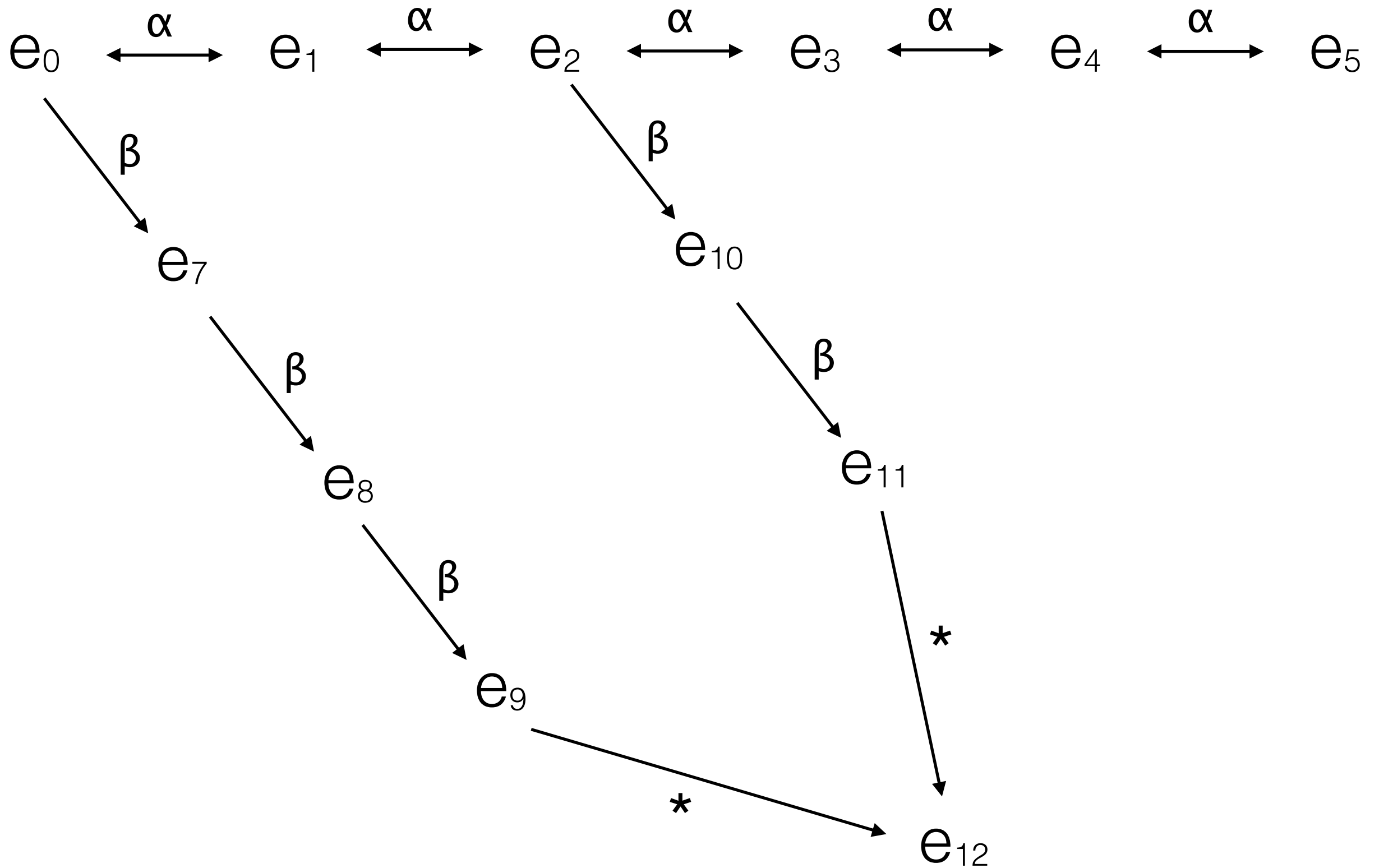








# Confluence (i.e., Church-Rosser Theorem)



## Applicative evaluation order

Always evaluates the *innermost* leftmost redex first.

## Normal evaluation order

Always evaluates the *outermost* leftmost redex first.

## Applicative evaluation order

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

## Normal evaluation order

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

## Call-by-value (CBV) semantics

Applicative evaluation order, *but not under lambdas*.

## Call-by-name (CBN) semantics

Normal evaluation order, *but not under lambdas*.

# Try an example.

Write a lambda term other than  $\Omega$  which also does not terminate

(Hint: think about using some form of self-application)

Write a lambda term other than  $\Omega$  which also does not terminate

$$\begin{aligned} & ((\lambda (y) ((\lambda (x) (y\ x))\ y))\ y) \\ & ((\lambda (y) ((\lambda (x) (y\ x))\ y))\ y) \end{aligned}$$
$$\begin{aligned} & ((\lambda (u) ((u\ u)\ u))\ u) \\ & ((\lambda (u) ((u\ u)\ u))\ u) \end{aligned}$$
$$\begin{aligned} & ((\lambda (x)\ x) \\ & ((\lambda (u) (u\ u))\ u) \\ & ((\lambda (u) (u\ u))\ u)) \end{aligned}$$

# Abstract Machines

- Imaginary computer (“machine”) meant to interpret a language
- Have some combination of features (instruction, stack, store/heap, etc...)
- We define **state space** (“configurations”) mathematically
- Also define **transitions** or “steps” between configurations
- Also need to know how to **inject** a program into the state space
  - I.e., how do we come up with an initial state?
- Machines typically named based on their components (C, CC, CK, CEK, CESK, CKS, etc...)



# CBV C Machine

Textual reduction semantics

$$\zeta \in \Sigma = \textit{Exp}$$

$$\rightsquigarrow : \Sigma \rightarrow \Sigma$$

$$\textit{inj} : \textit{Exp} \rightarrow \Sigma$$

State space of machine is just exprs

Need to define step fn

Need to define injection fn

Necessary components for abstract machine

For the “C Machine”, states will just be expressions (syntax),  
and injection (*inj*) will just be the identity function!

$$\rightsquigarrow: \Sigma \rightarrow \Sigma$$

We define **values** as lambda expressions

$$v \in Val = Lam$$

## Rules

$$((\lambda (x) e_0) v) \rightsquigarrow e_0[x \mapsto v]$$

$$e_0 \rightsquigarrow e' \implies (e_0 e_1) \rightsquigarrow (e' e_1)$$

$$e_1 \rightsquigarrow e' \implies (v e_1) \rightsquigarrow (v e')$$

**Actually writing the code...**

; Values (irreducible expressions) are just  $\lambda$ s

```
(define (value? e)
  (match e
    [`(λ (,x) ,body) #t]
    [else #f]))
```

```
; Free variables (need this for capture-avoiding substitution)
(define (free-vars e)
  (match e
    [( $\lambda$  (,x) ,body) (set-subtract (free-vars body) (set x))]
    [(? symbol? x) (set x)]
    [( $\lambda$  (,e0 ,e1) (set-union (free-vars e0) (free-vars e1))]))
```

```
; Return a fresh symbol that lies outside of the set s.
(define (fresh-var s)
  (let ([x (gensym)])
    (if (not (set-member? s x)) x
        (fresh-var s))))
```

```

; Perform capture-avoiding substitution from x to e1 within e.
;  $\alpha$ -conversion as necessary to avoid captures. This uses the
; fresh-var function above to perform  $\alpha$ -renaming
(define (capture-avoiding-subst e x e1)
  (match e
    [( $\lambda$  (,y) ,body)
     (if (equal? x y)
         ; Need to convert y to be something else
         ;
         ; Note that we use capture-avoiding-subst twice here: the
         ; innermost call is to perform the necessary  $\alpha$  conversion.
         (let ([z (fresh-var (free-vars body))])
           ( $\lambda$  (,z) ,(capture-avoiding-subst
                       (capture-avoiding-subst body y z)
                       x
                       e1)))
         ( $\lambda$  (,y) ,(capture-avoiding-subst body x e1)))]
    [(? symbol? y) (if (equal? x y) e1 y)]
    [( $\lambda$  (,e2 ,e3) ` (,(capture-avoiding-subst e2 x e1)
                                     ,(capture-avoiding-subst e3 x e1)))]))

```

**The step function itself is actually quite simple!**

```
; The step function
(define (→ state)
  (match state
    [ `( (λ (,x) ,body) ,(? value? v))
      (capture-avoiding-subst body x v)]
    [ `( ,(? value? v) ,e1)
      `( ,v ,(→ e1))]
    [ `( ,e0 ,e1)
      `( ,(→ e0) ,e1)])))
```

**To “fully evaluate” terms, we take transitive closure of step fn**

```
; Evaluate an entire expression (just the transitive closure of  $\rightarrow$ )  
(define (eval-c expr)  
  (let loop ([e expr])  
    (if (value? e) e (loop ( $\rightarrow$  e)))))
```



**Full code available here...**

<https://github.com/kmicinski/blog-stuff/blob/master/c-machine.rkt>

## Exercise: modify step fn to do CBN instead!

; The step function

```
(define (→ state)
```

```
  (match state
```

```
    [ `( (λ (,x) ,body) ,(? value? v))
```

```
      (capture-avoiding-subst body x v)]
```

```
    [ `( ,(? value? v) ,e1)
```

```
      `( ,v ,(→ e1))]
```

```
    [ `( ,e0 ,e1)
```

```
      `( ,(→ e0) ,e1)]))
```

# Machine components



# C

In this case, our state space is just an expression

# Machine components



C

In this case, our state space is just an expression

We call this “C” because it represents the “control string” (i.e., the instruction upon which machine operates)

# **Abstract Machine Zoo**

**C**      Term-rewriting Machine

# Evaluation contexts

Restrict the order in which we may simplify a program's redexes

$$\begin{array}{l} \mathcal{E} ::= (\mathcal{E} \ e) \\ \quad | \ (v \ \mathcal{E}) \\ \quad | \ \square \end{array}$$

**(left-to-right) CBV evaluation**

$$\begin{array}{l} \mathcal{E} ::= (\mathcal{E} \ e) \\ \quad | \ \square \end{array}$$

**(left-to-right) CBN evaluation**

$$v ::= (\lambda \ (x) \ e)$$

$$\begin{array}{l} e ::= (\lambda \ (x) \ e) \\ \quad | \ (e \ e) \\ \quad | \ x \end{array}$$

# Context and redex

For CBV a redex must be  $(v \ v)$   
 For CVN, a redex must be  $(v \ e)$

$$\mathcal{E}[\overbrace{(v \ v)}^r] =$$

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

$$\mathcal{E} = (\square (\lambda (w) w))$$

$$r = ((\lambda (x) ((\lambda (y) y) x)) (\lambda (z) z))$$

# Context and redex

$$\mathcal{E}[r] =$$

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

$$\mathcal{E} = (\square (\lambda (w) w))$$

$$\begin{aligned} r &= ((\lambda (x) ((\lambda (y) y) x)) (\lambda (z) z)) \\ &\quad \rightarrow_{\beta} ((\lambda (y) y) (\lambda (z) z)) \end{aligned}$$



Put the reduced redex back in its evaluation context...

$$\mathcal{E} = (\square \ (\lambda \ (w) \ w))$$

$$\begin{aligned} r &= ((\lambda \ (x) \ ((\lambda \ (y) \ y) \ x)) \ (\lambda \ (z) \ z)) \\ &\quad \rightarrow_{\beta} ((\lambda \ (y) \ y) \ (\lambda \ (z) \ z)) \end{aligned}$$

$$\downarrow \mathcal{E}[r]$$

$$(((\lambda \ (y) \ y) \ (\lambda \ (z) \ z)) \ (\lambda \ (w) \ w))$$

# Exercises — can you evaluate...

1)  $(((\lambda (y) y) (\lambda (z) z)) (\lambda (w) w))$

2)  $((\lambda (u) (u u)) (\lambda (x) (\lambda (x) x)))$

3)  $((\lambda (x) x) (\lambda (y) y))$   
 $((\lambda (u) (u u)) (\lambda (z) (z z)))$

# Abstract Machine Zoo

**C**      Term-rewriting Machine

**CC**      Context and Redex Machine

**CK**      Control / Continuation Machine

**Next time...**