

Cálculo de Programas T10 (cont.)

(a) Trees with data in their leaves :

$$T = \text{LTree } A \quad \begin{cases} F X = A + X^2 \\ F f = id + f^2 \end{cases} \quad \text{in} = [\text{Leaf}, \text{Fork}]$$

Haskell: `data LTree a = Leaf a | Fork (LTree a, LTree a)`

(b) Trees whose data of type A are stored in their nodes:

$$T = \text{BTree } A \quad \begin{cases} F X = 1 + A \times X^2 \\ F f = id + id \times f^2 \end{cases} \quad \text{in} = [\underline{\text{Empty}}, \text{Node}]$$

Haskell: `data BTree a = Empty | Node (a, (BTree a, BTree a))`

(c) Full trees — data in both leaves and nodes:

$$T = \text{FTree } B A \quad \begin{cases} F X = B + A \times X^2 \\ F f = id + id \times f^2 \end{cases} \quad \text{in} = [\text{Unit}, \text{Comp}]$$

Haskell: `data FTree b a = Unit b | Comp (a, (FTree b a, FTree b a))`

(d) Expression trees:

$$T = \text{Expr } V O \quad \begin{cases} F X = V + O \times X^* \\ F f = id + id \times \text{map } f \end{cases} \quad \text{in} = [\text{Var}, \text{Term}]$$

Haskell: `data Expr v o = Var v | Term (o, [Expr v o])`

(a) Trees with data in their leaves :

$$T = \text{LTree } A \quad \left\{ \begin{array}{l} \text{B } (X, Y) = X + Y^2 \\ \text{B } (g, f) = g + f^2 \end{array} \right. \quad \text{in} = [\text{Leaf}, \text{Fork}]$$

Haskell: `data LTree a = Leaf a | Fork (LTree a, LTree a)`

(b) Trees whose data of type A are stored in their nodes:

$$T = \text{BTree } A \quad \left\{ \begin{array}{l} \text{B } (X, Y) = 1 + X \times Y^2 \\ \text{B } (g, f) = id + g \times f^2 \end{array} \right. \quad \text{in} = [\underline{\text{Empty}}, \text{Node}]$$

Haskell: `data BTree a = Empty | Node (a, (BTree a, BTree a))`

(c) Full trees — data in both leaves and nodes:

$$T = \text{FTree } B \ A \quad \left\{ \begin{array}{l} \text{B } (Z, X, Y) = Z + X \times Y^2 \\ \text{B } (h, g, f) = h + g \times f^2 \end{array} \right. \quad \text{in} = [\text{Unit}, \text{Comp}]$$

Haskell: `data FTree b a = Unit b | Comp (a, (FTree b a, FTree b a))`

(d) Expression trees:

$$T = \text{Expr } V \ O \quad \left\{ \begin{array}{l} \text{B } (Z, X, Y) = Z + X \times Y^* \\ \text{B } (h, g, f) = h + g \times \text{map } f \end{array} \right. \quad \text{in} = [\text{Var}, \text{Term}]$$

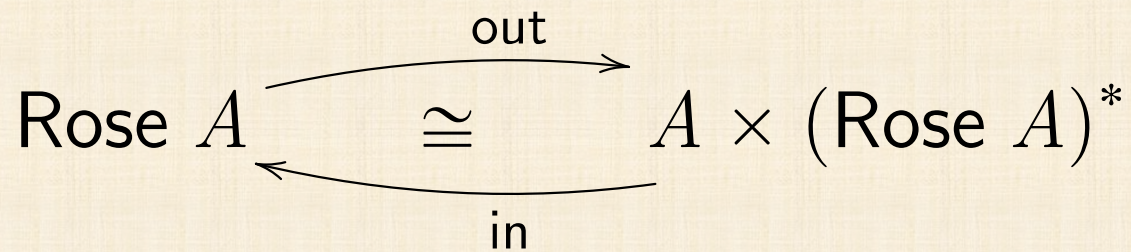
Haskell: `data Expr v o = Var v | Term (o, [Expr v o])`

'Chasing' the base functor

```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```



$$\text{Rose } A \begin{array}{c} \xrightarrow{\text{out}} \\ \cong \\ \xleftarrow{\text{in}} \end{array} A \times (\text{Rose } A)^*$$

$$\mathbf{B} (X, Y) = X \times Y^*$$

$$\mathbf{B} (f, g) = f \times g^*$$

$$\begin{array}{c} A \times Y^* \\ X \times Y^* \end{array}$$



```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```

$$\mathbf{B} (X, Y) = X \times Y^*$$

$$\mathbf{B} (f, g) = f \times g^*$$

f >< map g





```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```



```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```

```
baseRose f g = f >< map g
```

```
recRose g = baseRose id g
```




```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```

```
baseRose f g = f >< map g
```

```
recRose g = baseRose id g
```

```
cataRose g = g . (recRose (cataRose g)) . outRose
```



```
data Rose a = Rose a [Rose a] deriving Show
```

```
inRose = uncurry Rose
```

```
outRose (Rose a x) = (a,x)
```

```
baseRose f g = f >< map g
```

```
recRose g = baseRose id g
```

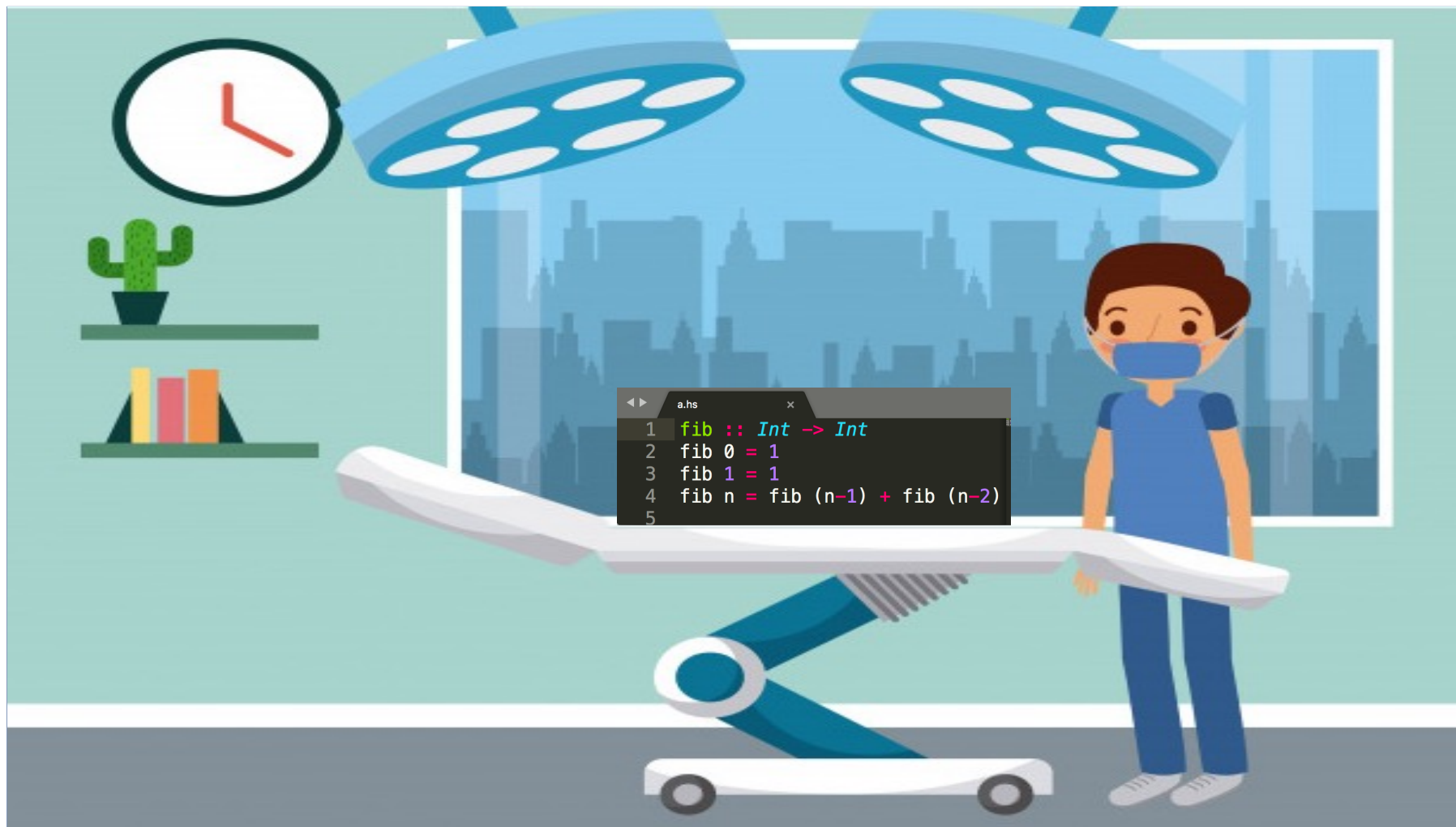
```
cataRose g = g . (recRose (cataRose g)) . outRose
```

```
instance Functor Rose
```

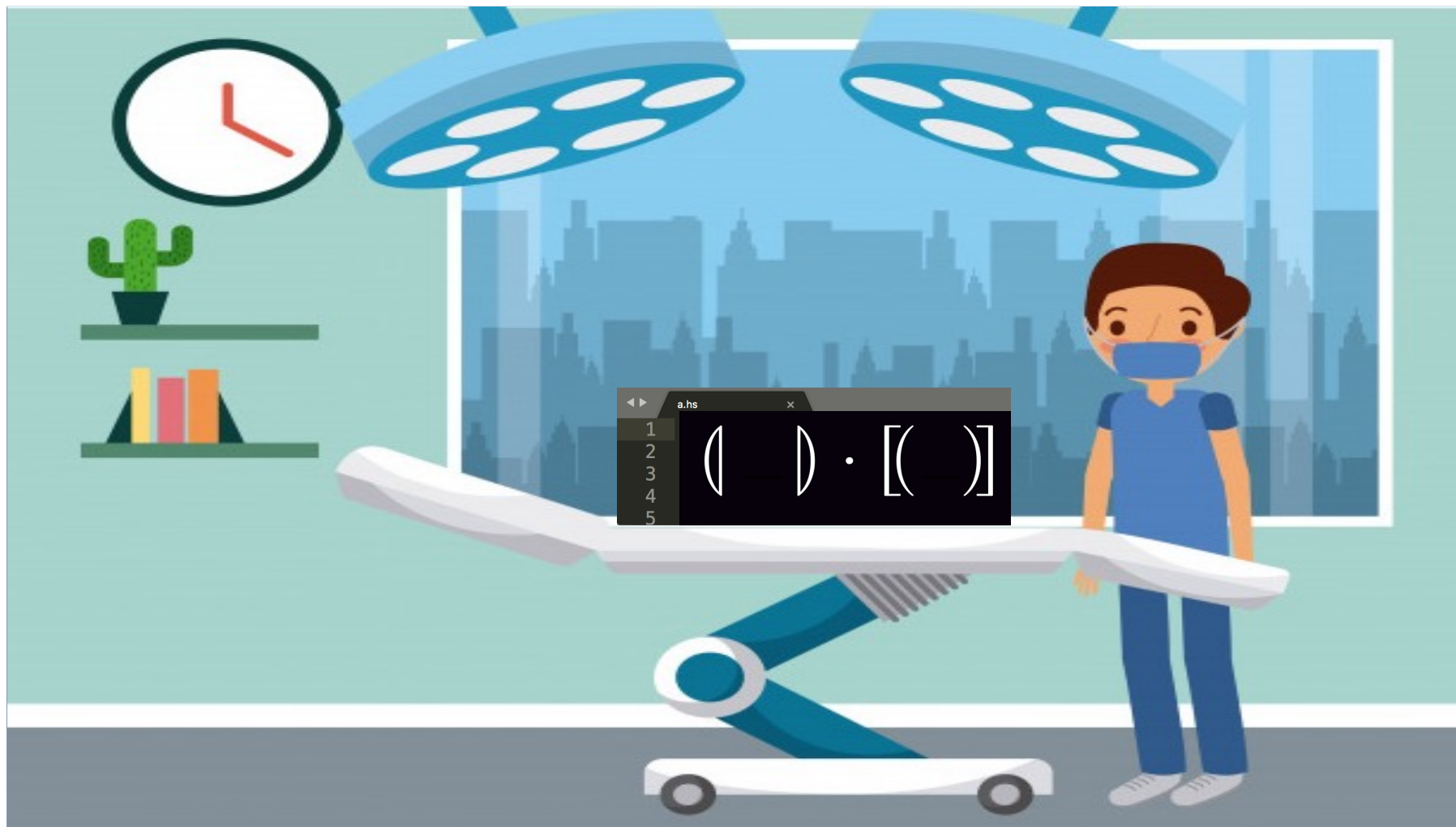
```
  where fmap f = cataRose ( inRose . baseRose f id )
```

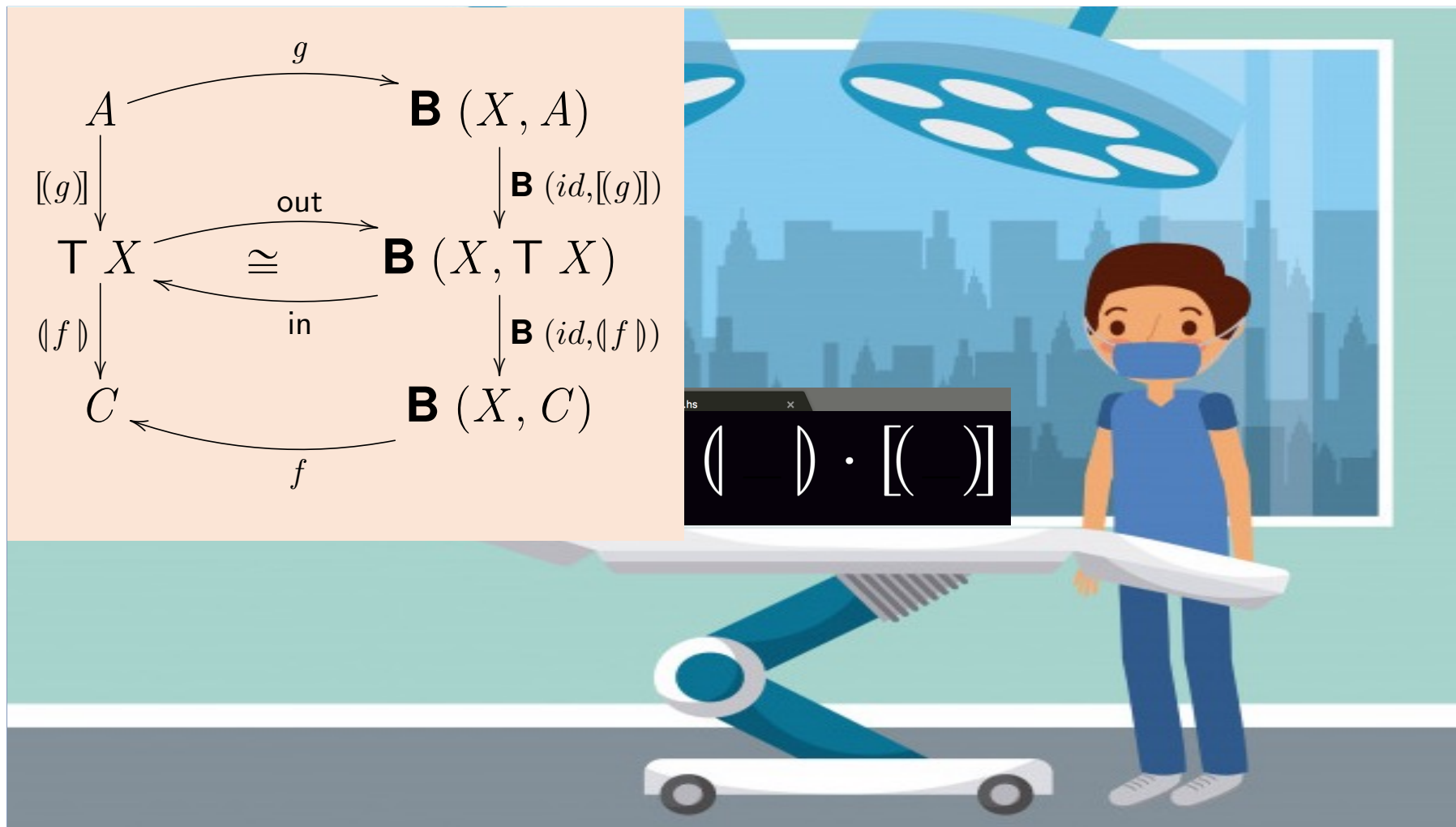
**Algorithmic *Hylo-*
Factorization (examples)**





```
a.hs x
1 fib :: Int -> Int
2 fib 0 = 1
3 fib 1 = 1
4 fib n = fib (n-1) + fib (n-2)
5
```



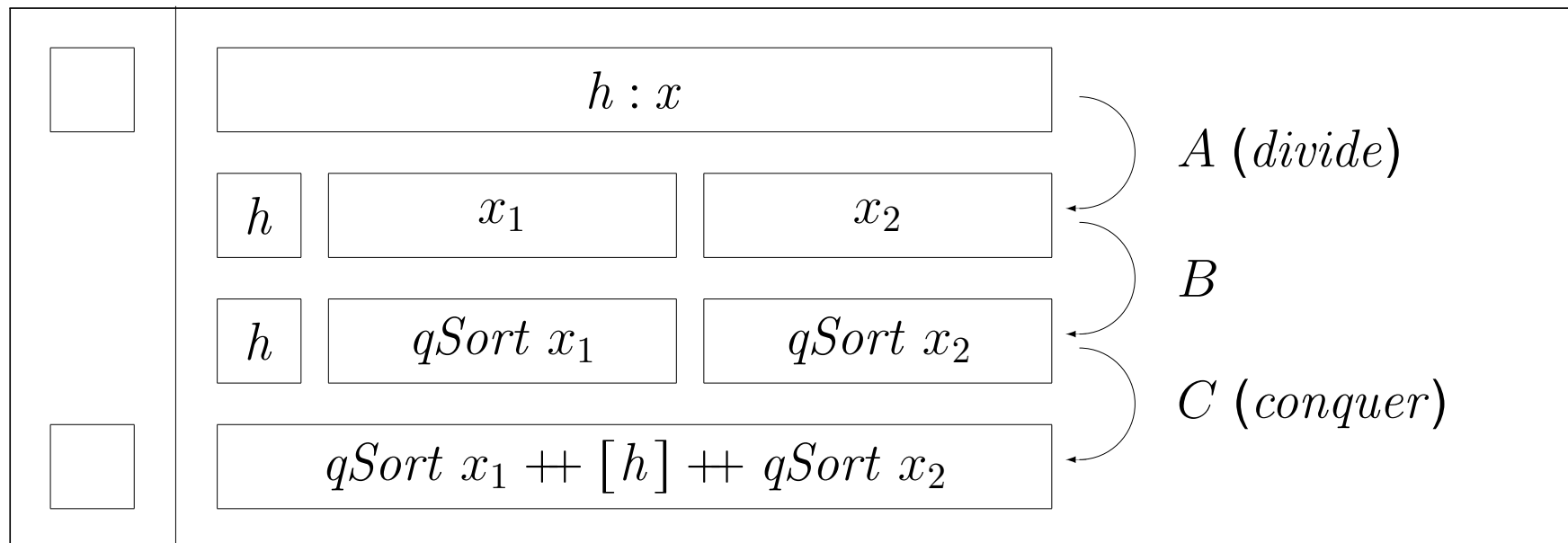


QUICKSORT

```
a.hs
1 | qSort :: Ord a => [a] -> [a]
2 | qSort [] = []
3 | qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |     x1 = [ a | a <- x , a < h ]
6 |     x2 = [ a | a <- x , a >= h ]
7
```

QUICKSORT

```
a.hs
1 |qSort :: Ord a => [a] -> [a]
2 |qSort [] = []
3 |qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |       x1 = [ a | a <- x , a < h ]
6 |       x2 = [ a | a <- x , a >= h ]
7
```

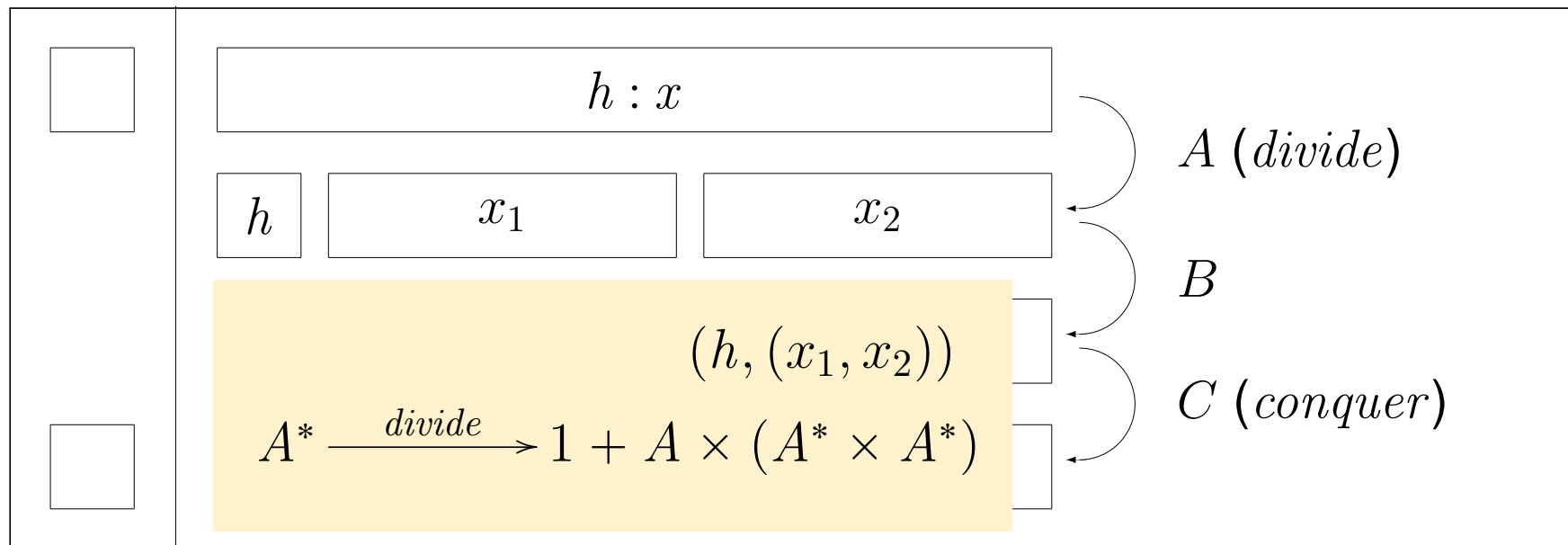


QUICKSORT

```

a.hs
1 |qSort :: Ord a => [a] -> [a]
2 |qSort [] = []
3 |qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |       x1 = [ a | a <- x , a < h ]
6 |       x2 = [ a | a <- x , a >= h ]
7

```

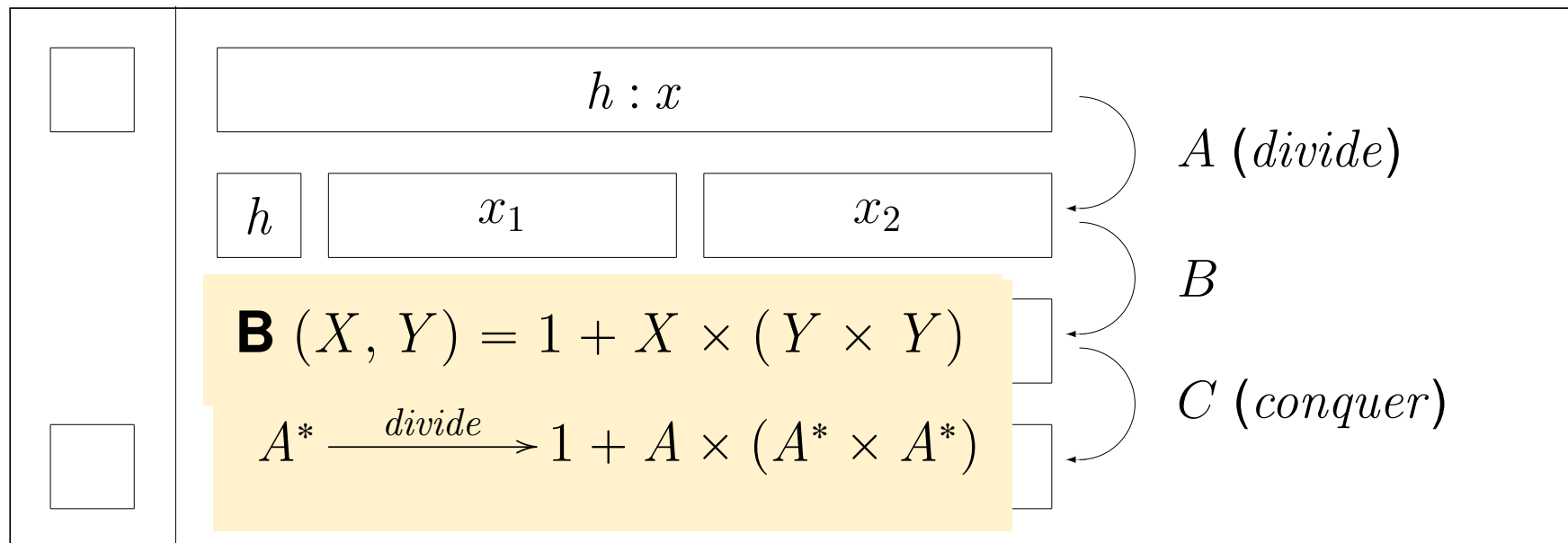


QUICKSORT

```

a.hs
1 |qSort :: Ord a => [a] -> [a]
2 |qSort [] = []
3 |qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |       x1 = [ a | a <- x , a < h ]
6 |       x2 = [ a | a <- x , a >= h ]
7

```



QUICKSORT

$$\mathbf{B}(X, Y) = 1 + X \times (Y \times Y)$$

Description	$T X$	$B(X, Y)$	$B(id, f)$	$B(f, id)$
"Right" Lists	List X	$1 + X \times Y$	$id + id \times f$	$id + f \times id$
"Left" Lists	LList X	$1 + Y \times X$	$id + f \times id$	$id + id \times f$
Non-empty Lists	NList X	$1 + X \times Y$	$id + id \times f$	$f + f \times id$
Binary Trees	BTree X	$1 + X \times Y^2$	$id + id \times f^2$	$id + f \times id$
"Leaf" Trees	LTree X	$X + Y^2$	$id + f^2$	$f + id$



QUICKSORT

```
a.hs
1 |qSort :: Ord a => [a] -> [a]
2 |qSort [] = []
3 |qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |       x1 = [ a | a <- x , a < h ]
6 |       x2 = [ a | a <- x , a >= h ]
7
```

$$\begin{cases} qSort \cdot \text{nil} = \text{nil} \\ qSort \cdot \text{cons} = f_2 \cdot (\text{id} \times (qSort \times qSort)) \cdot g_2 \end{cases}$$

$$f_2 (h, (y_1, y_2)) = y_1 ++ [h] ++ y_2$$

$$g_2 (h, x) = (h, (x_1, x_2))$$

where

$$x_1 = [a \mid a \leftarrow x, a < h]$$

$$x_2 = [a \mid a \leftarrow x, a \geq h]$$

QUICKSORT

$$\mathbf{B} (X, Y) = 1 + X \times (Y \times Y)$$

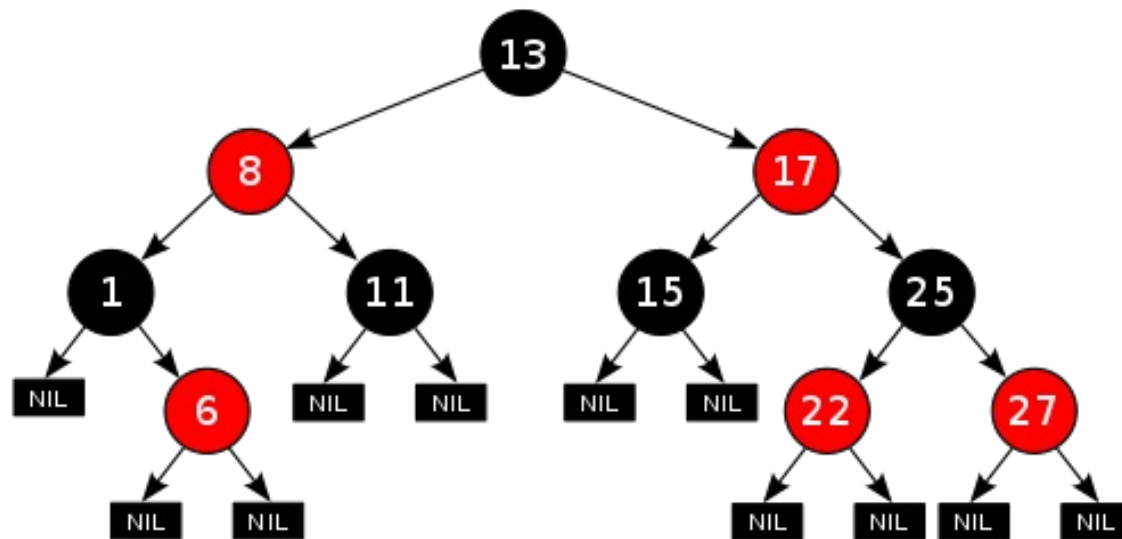
$$\begin{cases} qSort \cdot \text{nil} = \text{nil} \\ qSort \cdot \text{cons} = f_2 \cdot (id \times (qSort \times qSort)) \cdot g_2 \end{cases}$$

$$\equiv \{ \text{fusão-+}, \text{absorção-+}, \text{eq-+ etc} \}$$

$$qSort \cdot \text{in} = [\text{nil}, f_2] \cdot (id + id \times qSort^2) \cdot (id + g_2)$$

$$\equiv \{ \text{isomorfismo in / out} \}$$

$$qSort = \underbrace{[\text{nil}, f_2]}_{conquer} \cdot \underbrace{(id + id \times qSort^2)}_{\mathbf{B} (id, qSort)} \cdot \underbrace{(id + g_2) \cdot \text{out}}_{divide}$$



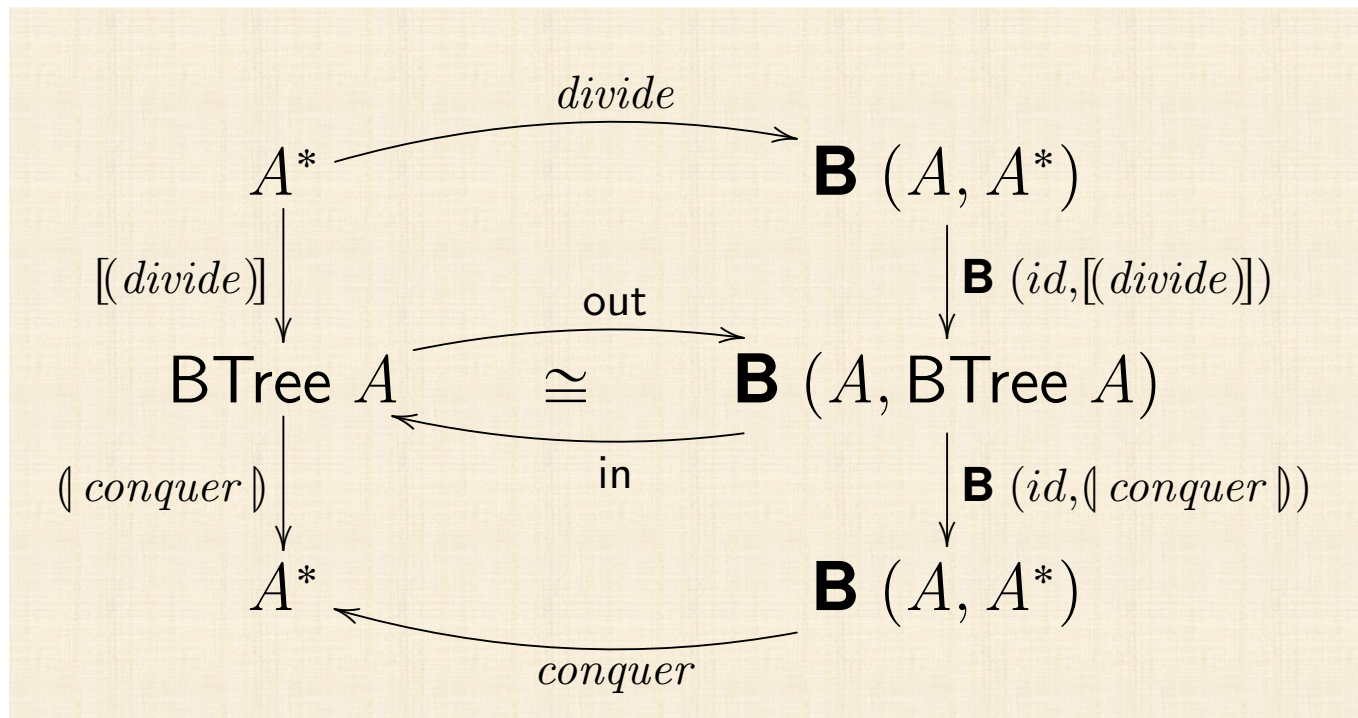
```
data BTree a = Empty | Node (a, (BTree a, BTree a))
```


QUICKSORT

```

1 |qSort :: Ord a => [a] -> [a]
2 |qSort [] = []
3 |qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4 |   where
5 |       x1 = [ a | a <- x , a < h ]
6 |       x2 = [ a | a <- x , a >= h ]
7

```



QUICKSORT

```
qSort = hyloBTree conquer divide
  --- the same as
  --- cataBTree conquer . anaBTree divide
```

```
where
  conquer = either nil f where
    f(h, (l, r)) = l ++ [h] ++ r
  divide = ( id -|- g2 ) . outList where
    g2(h, x) = (h, (x1, x2)) where
      x1 = [ a | a <- x, a < h ]
      x2 = [ a | a <- x, a >= h ]
```

```
a.hs
1 qSort :: Ord a => [a] -> [a]
2 qSort [] = []
3 qSort (h:x) = qSort x1 ++ [h] ++ qSort x2
4   where
5     x1 = [ a | a <- x, a < h ]
6     x2 = [ a | a <- x, a >= h ]
```

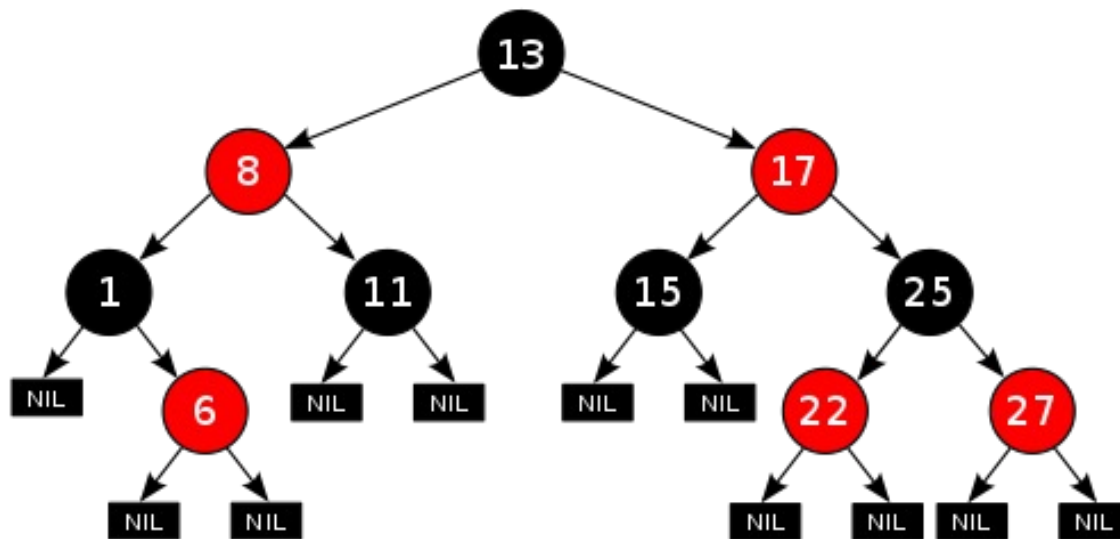
$(id, [(divide)])$

$(A, BTree A)$

$\mathbf{B} (id, [conquer])$

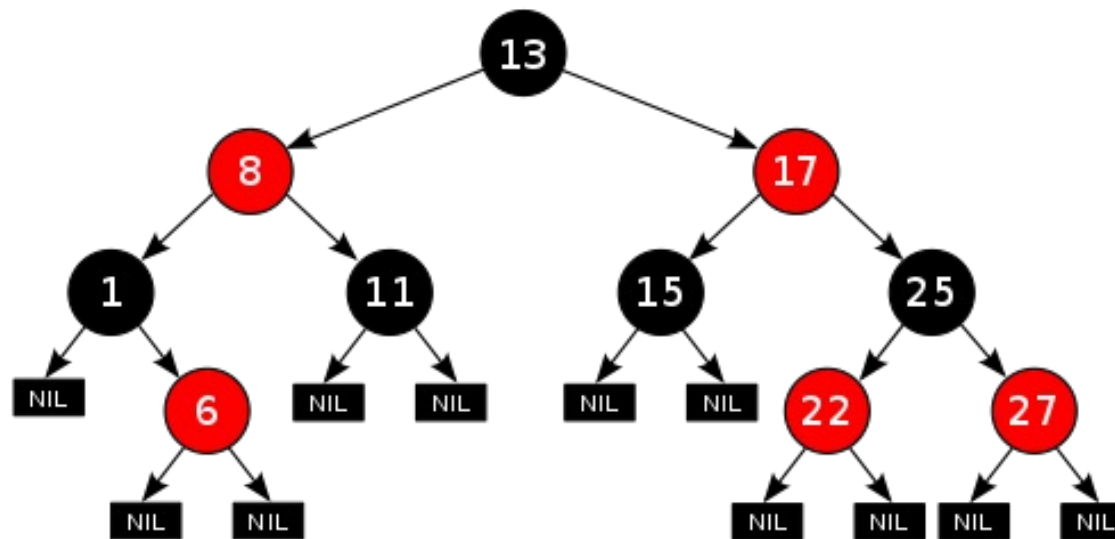
$\mathbf{B} (A, A^*)$

conquer



```
t = anaB divide [13,8,17,1,6,11,25,15,27,22]
```

```
data BTree a = Empty | Node (a, (BTree a, BTree a))
```



```

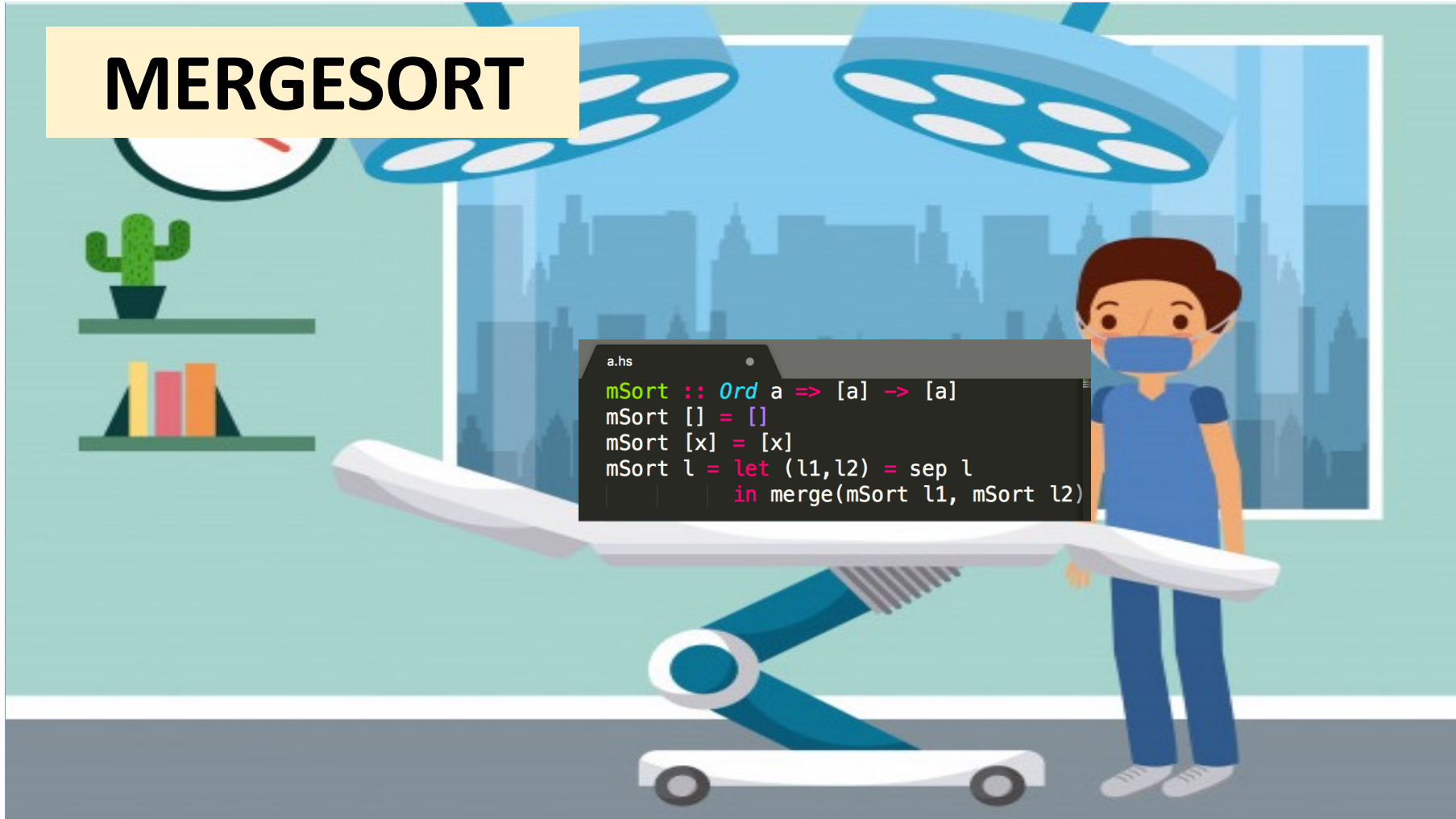
[*Cp> anaB divide [13,8,17,1,6,11,25,15,27,22]
Node (13,(Node (8,(Node (1,(Empty,Node (6,(Empty,Empty))))),Node
(11,(Empty,Empty))),Node (17,(Node (15,(Empty,Empty)),Node (25,
(Node (22,(Empty,Empty)),Node (27,(Empty,Empty)))))))

```

MERGESORT

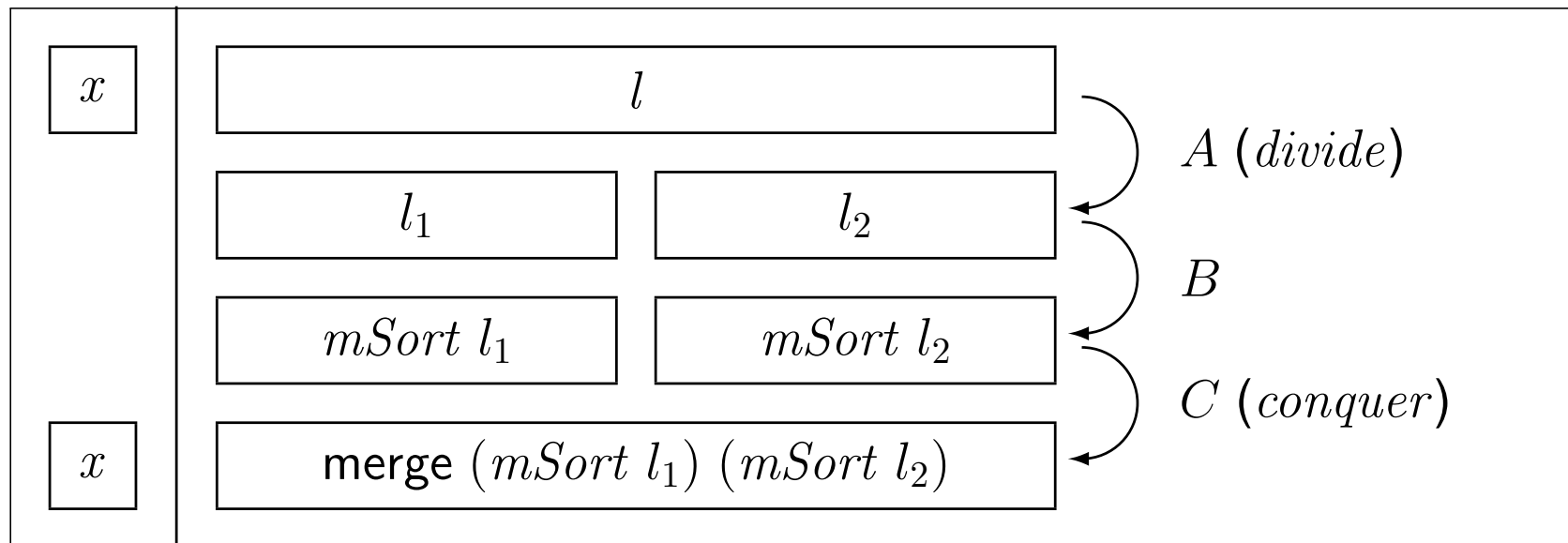
a.hs

```
mSort :: Ord a => [a] -> [a]
mSort [] = []
mSort [x] = [x]
mSort l = let (l1,l2) = sep l
           in merge(mSort l1, mSort l2)
```



MERGESORT

```
a.hs
mSort :: Ord a => [a] -> [a]
mSort [] = []
mSort [x] = [x]
mSort l = let (l1,l2) = sep l
          in merge(mSort l1, mSort l2)
```



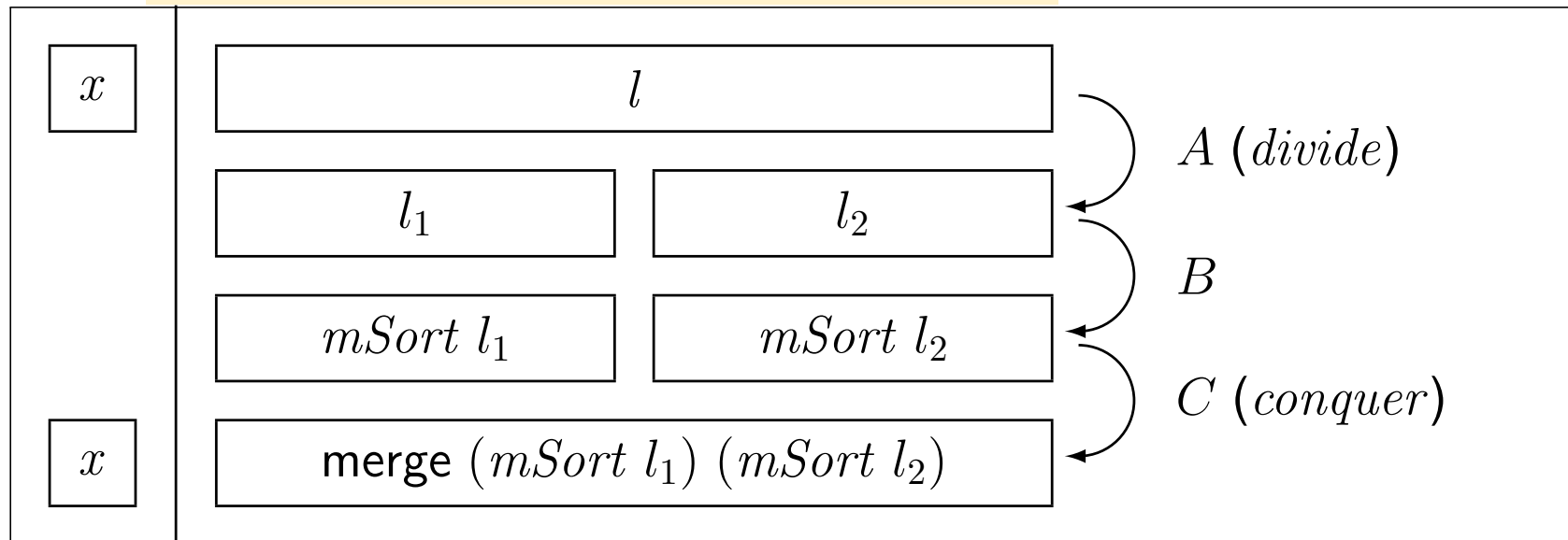
MERGESORT

a.hs

```
mSort :: Ord a => [a] -> [a]
```

$divide : A^* \rightarrow A + (A^* \times A^*)$

```
l1, l2) = sep l  
merge(mSort l1, mSort l2)
```

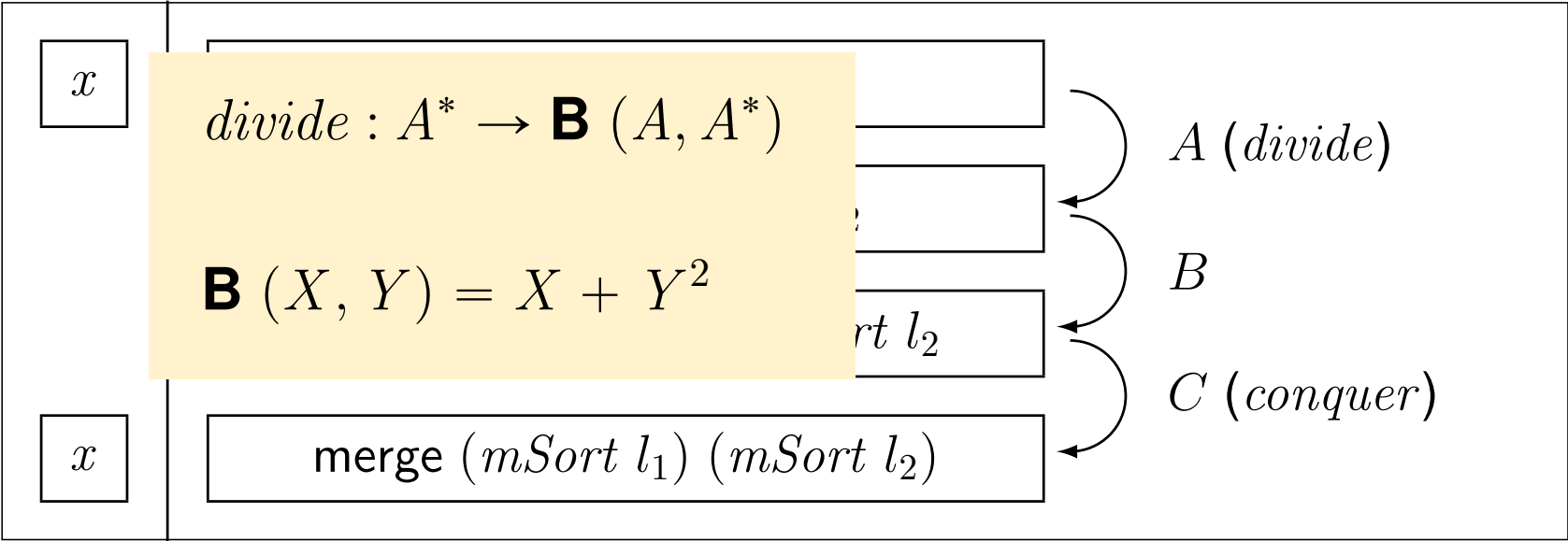


MERGESORT

```
a.hs
mSort :: Ord a => [a] -> [a]

mSort l = merge (mSort l1) (mSort l2)
  where (l1, l2) = sep l
```

$$divide : A^* \rightarrow A + (A^* \times A^*)$$

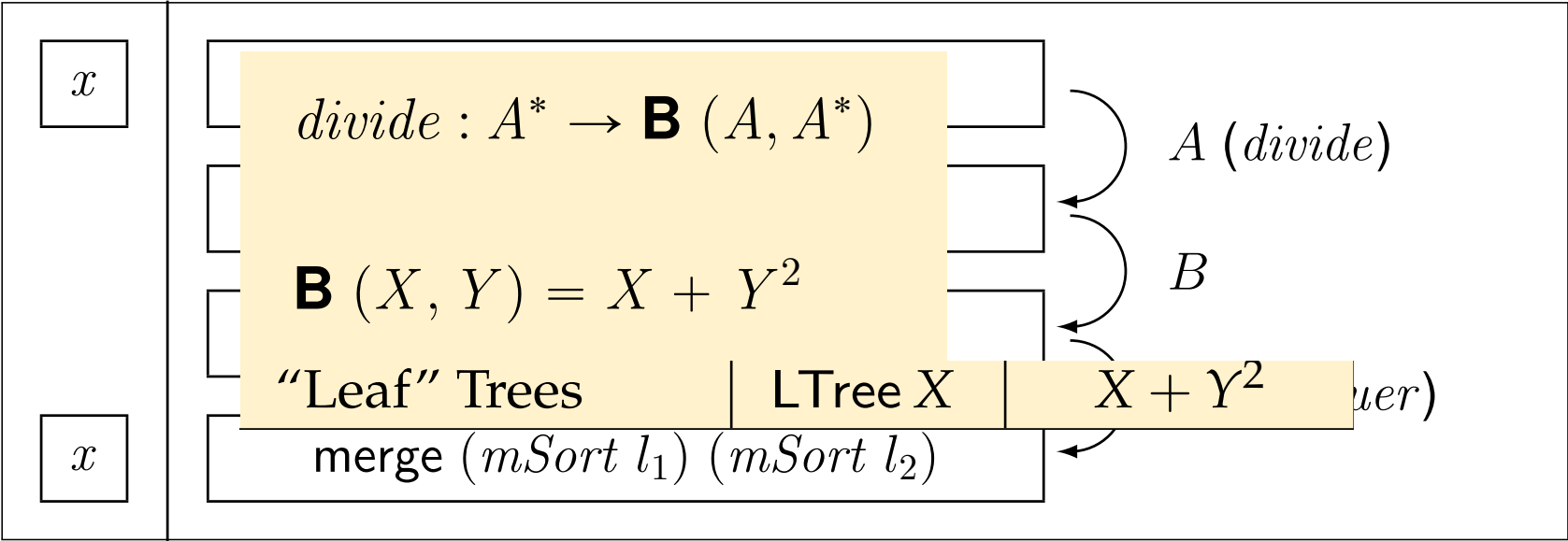


MERGESORT

```
a.hs
mSort :: Ord a => [a] -> [a]

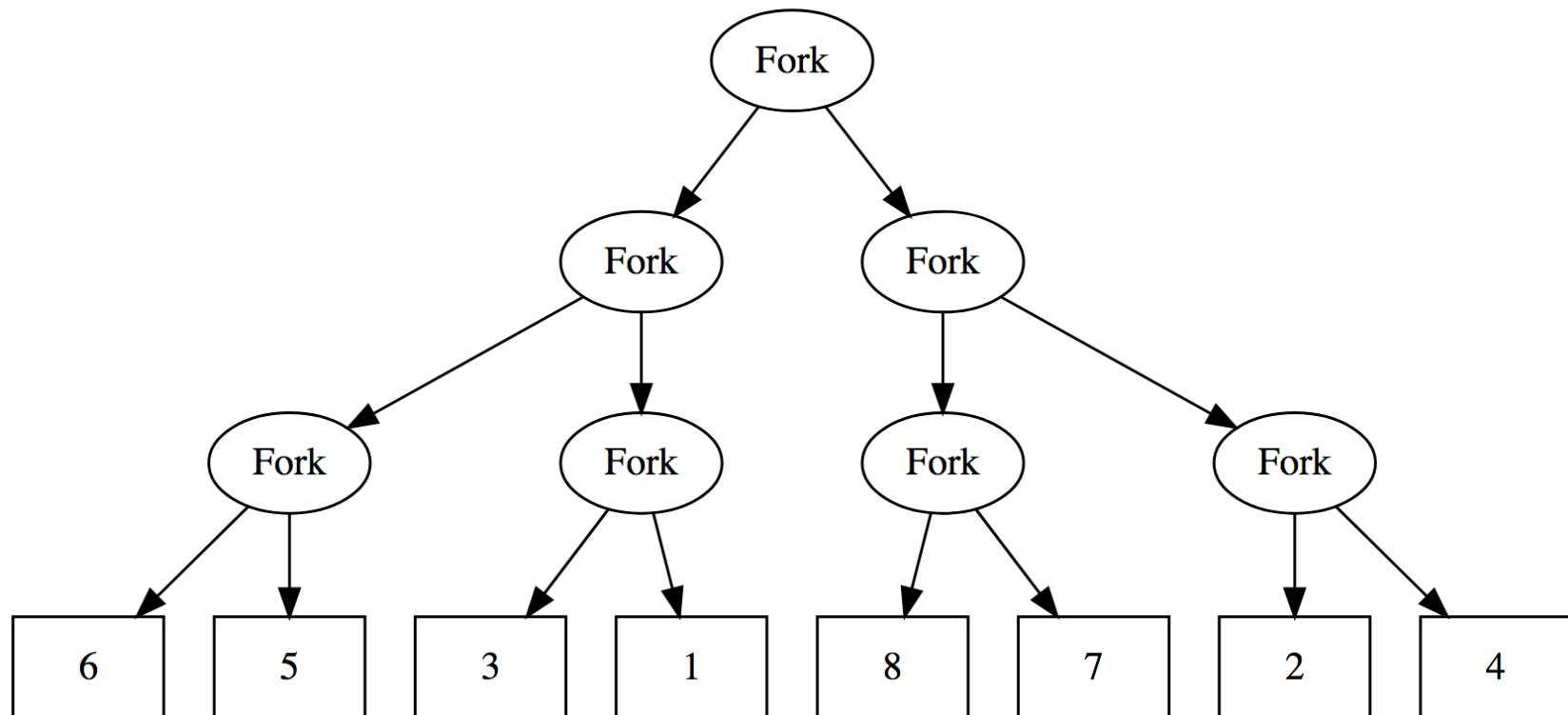
merge (mSort l1, mSort l2) = sep l
```

$$divide : A^* \rightarrow A + (A^* \times A^*)$$



MERGESORT

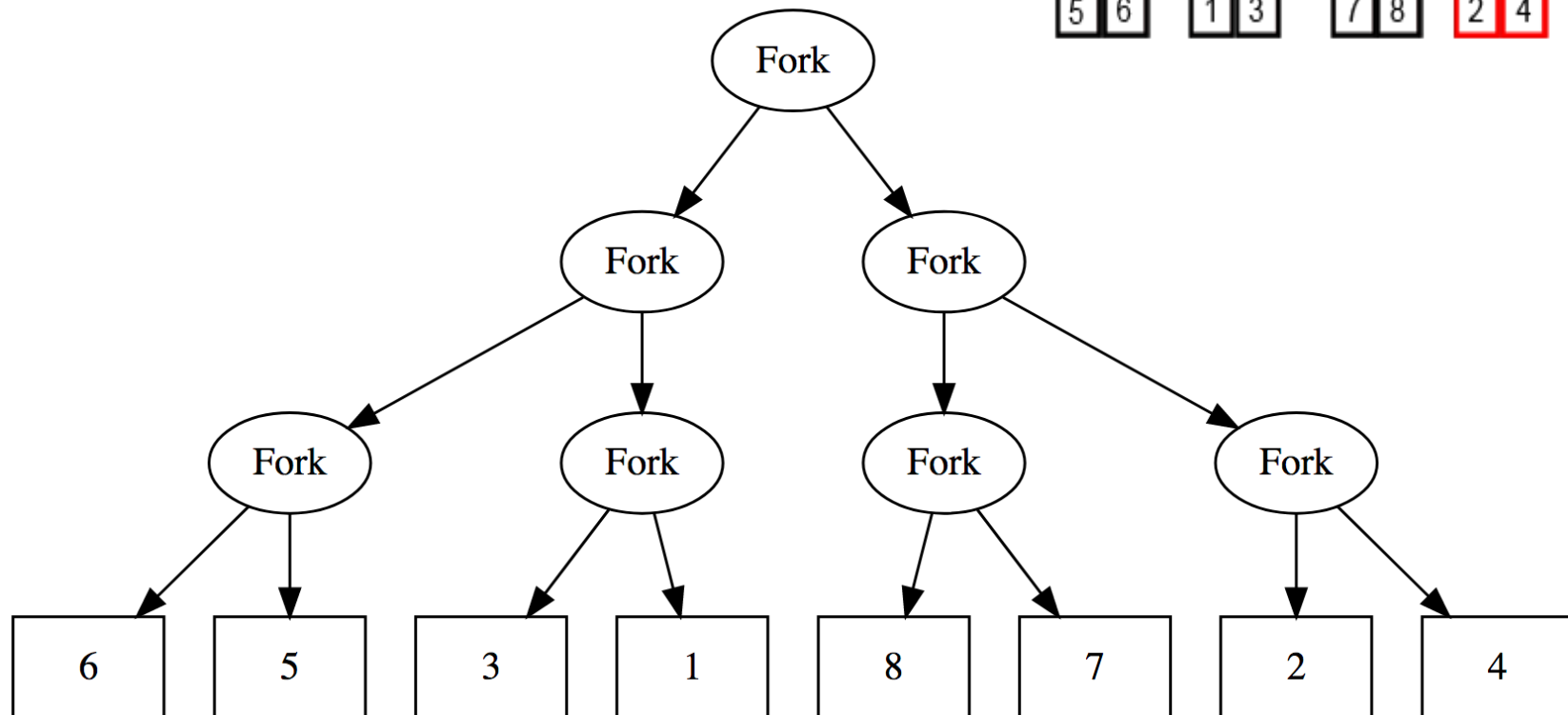
6 5 3 1 8 7 2 4



MERGESORT

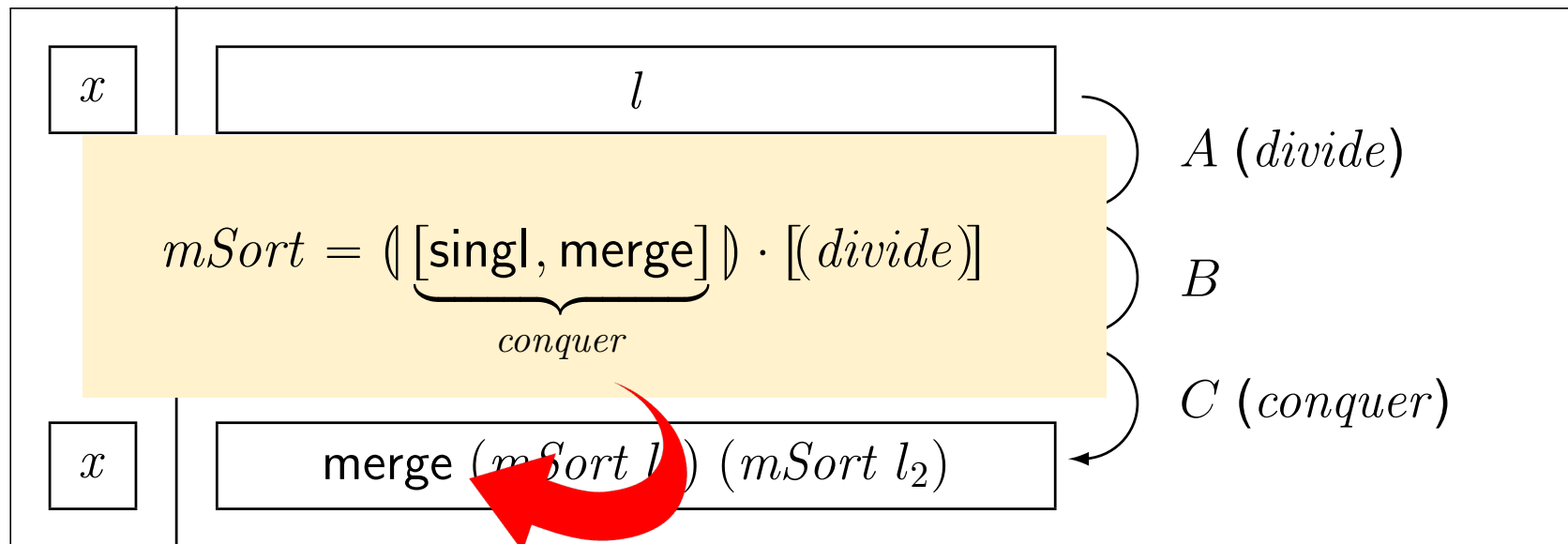
6 5 3 1 8 7 2 4

5 6 1 3 7 8 2 4



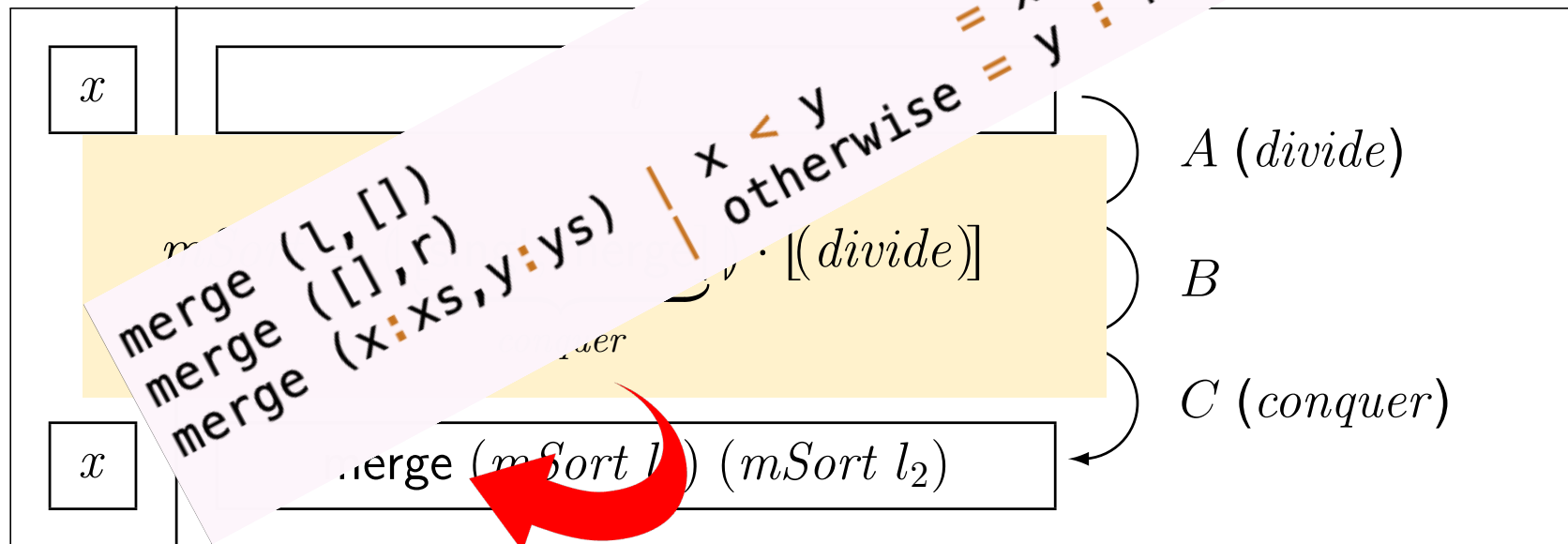
MERGESORT

```
a.hs
mSort :: Ord a => [a] -> [a]
mSort [] = []
mSort [x] = [x]
mSort l = let (l1,l2) = sep l
           in merge(mSort l1, mSort l2)
```



MERGESORT

```
a.hs
mSort :: Ord a => [a] -> [a]
mSort [] = []
mSort [x] = [x]
mSort l = merge (mSort l1) (mSort l2)
```

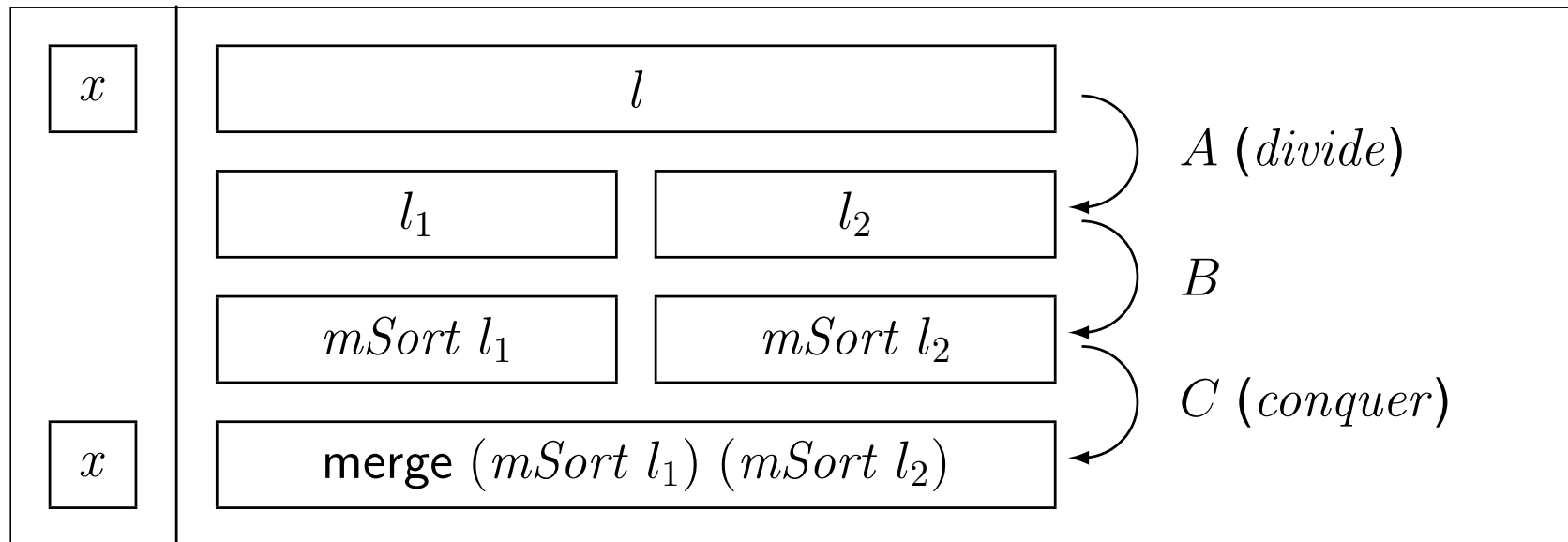


Cálculo de Programas

T11

MERGESORT

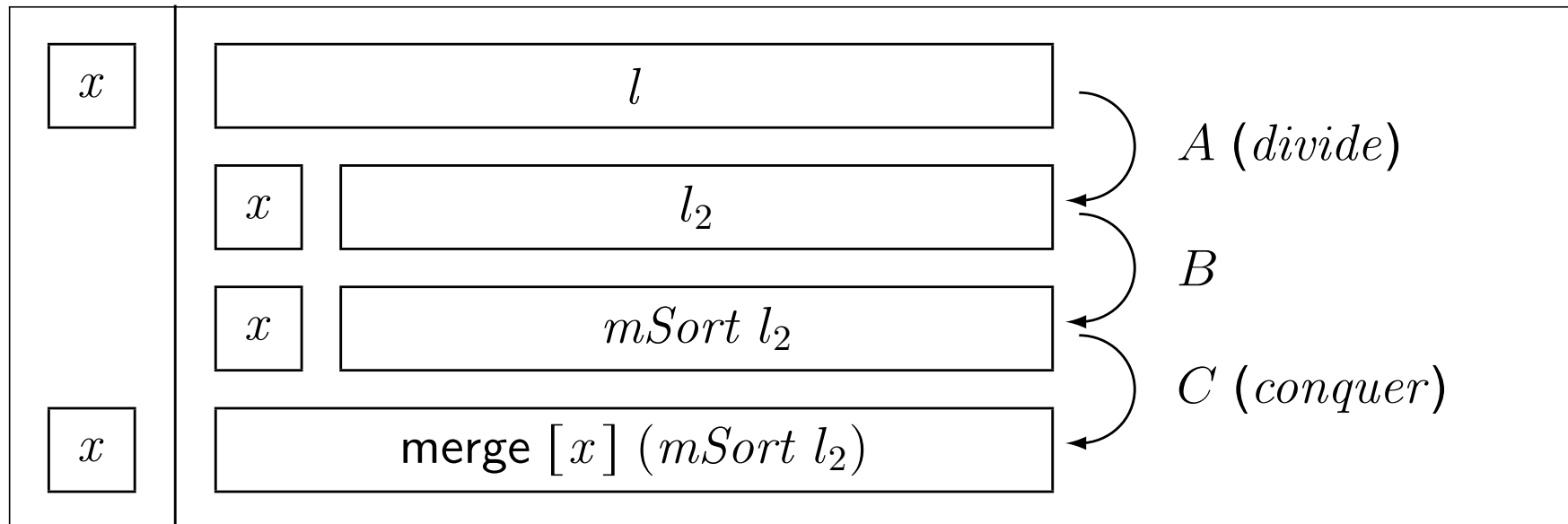
```
a.hs
mSort :: Ord a => [a] -> [a]
mSort [] = []
mSort [x] = [x]
mSort l = let (l1,l2) = sep l
          in merge(mSort l1, mSort l2)
```



MERGESORT

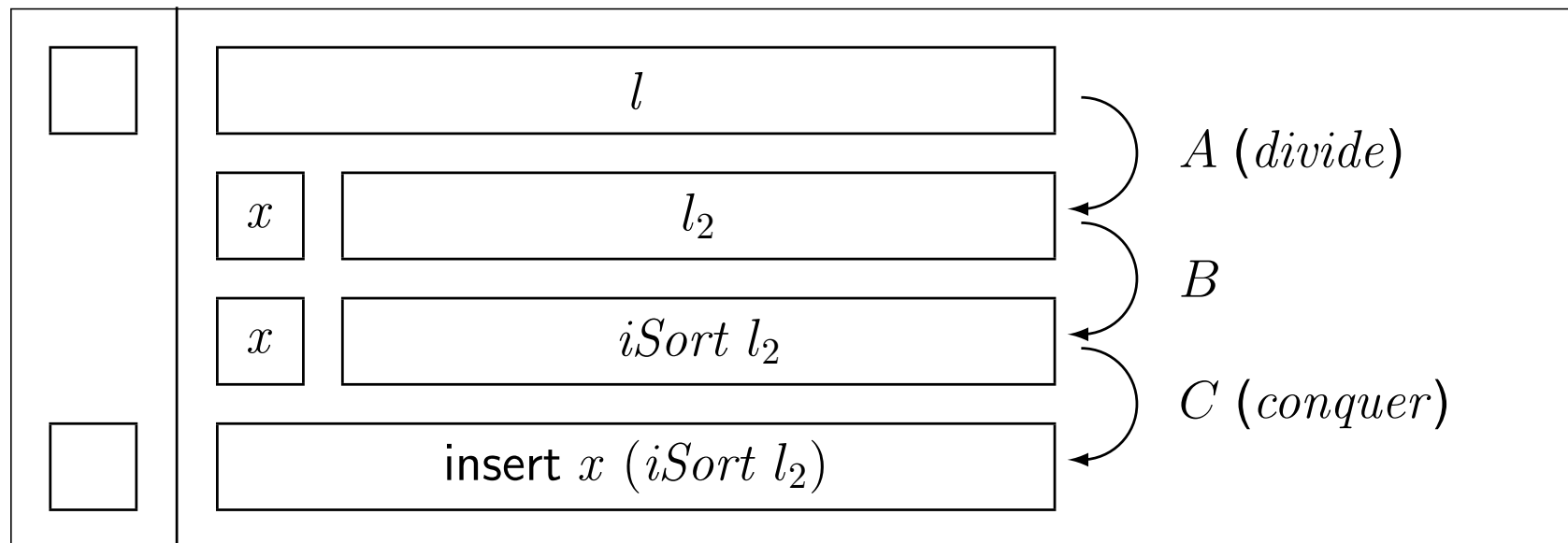
Particular case:

```
merge :: Ord a => ([a], [a]) -> [a]
merge ([x], [])           = [x]
merge ([], r)             = r
merge ([x], y:ys) | x < y = x : merge([], y:ys)
                  | otherwise = y : merge(x:[], ys)
```



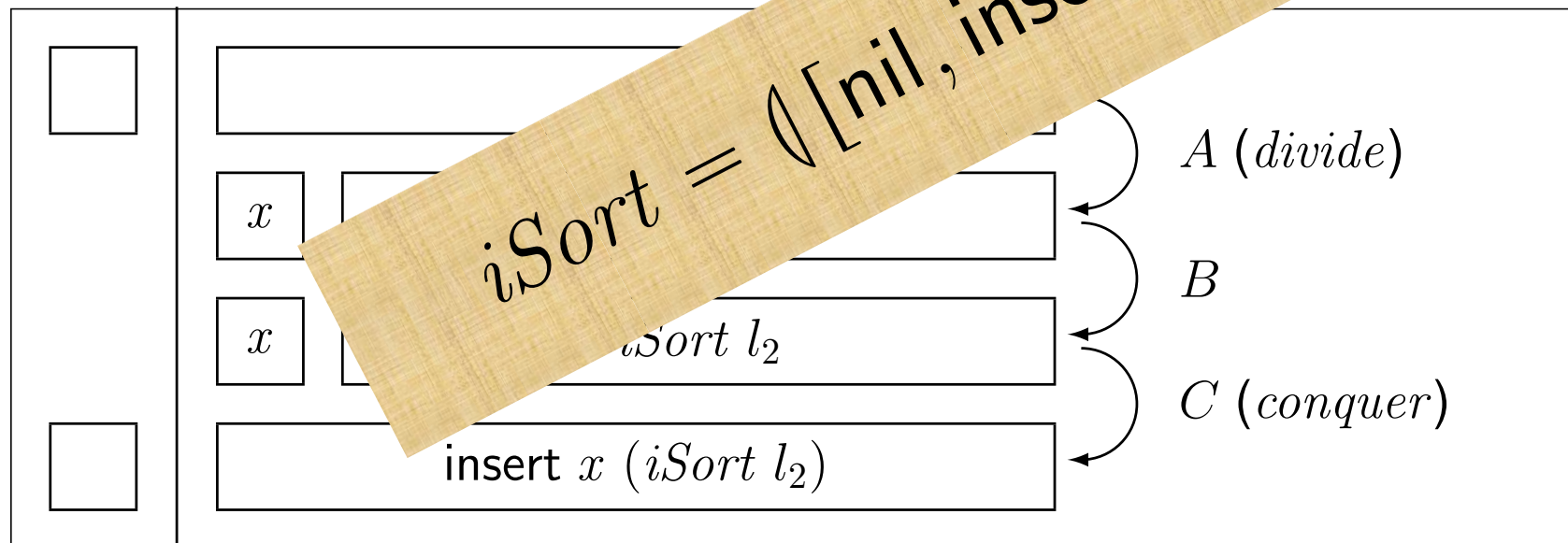
INSERTION SORT

```
insert :: Ord t => t -> [t] -> [t]
insert x [] = [x]
insert x (y:ys) | x < y = x:y:ys
                | otherwise = y:insert x ys
```



INSERTION SORT

```
insert :: Ord t => t -> [t] -> [t]
insert x [] = [x]
insert x (y:ys) | x < y = x:ys
                  | otherwise = y:insert x ys
```



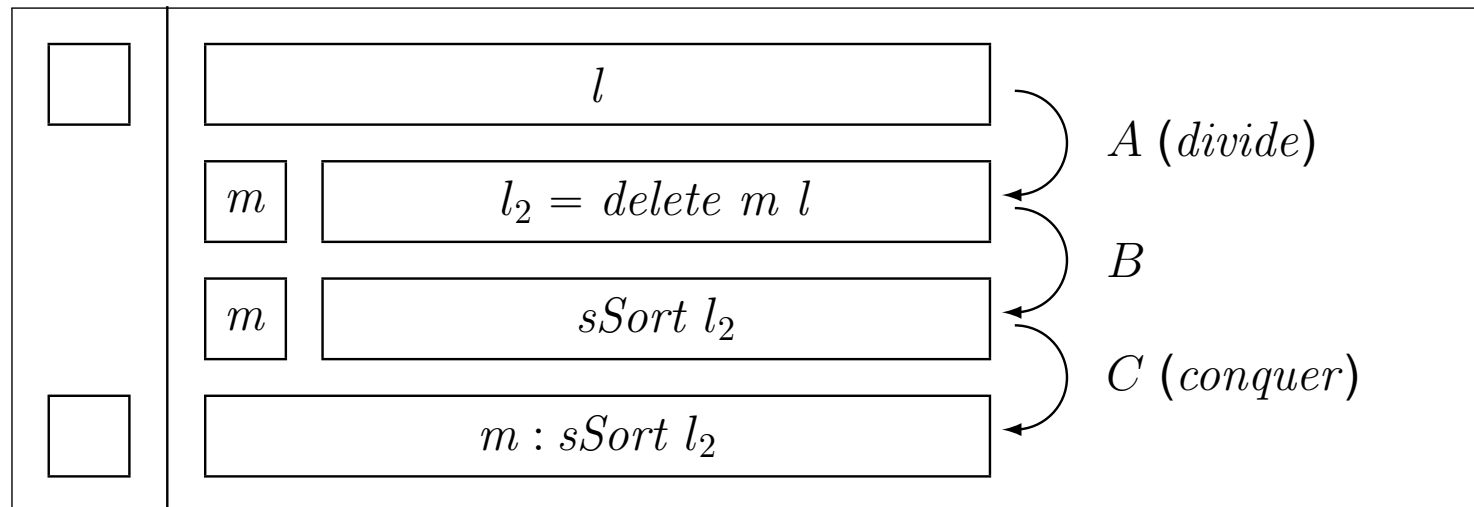
SELECTION SORT

```

1
2  sSort :: Ord a => [a] -> [a]
3  sSort = anal divide where
4      divide [] = i1()
5      divide (xs) = let m = minimum xs
6                    in i2(m, delete m xs)

```

Selection sort ($m = \text{minimum } l$):



SELECTION SORT

```

1
2  sSort :: Ord a => [a] -> [a]
3  sSort = anal divide where
4      divide [] = i1()
5      divide (xs) = let m = minimum xs
6                    in i2(m, delete m xs)

```

Selection sort ($m = \text{minimum } l$):



ANA, CATA & HYLO



$$C \xleftarrow{([f])} T \xleftarrow{[(g)]} A$$

$$[[f, g]] = ([f]) \cdot [(g)]$$

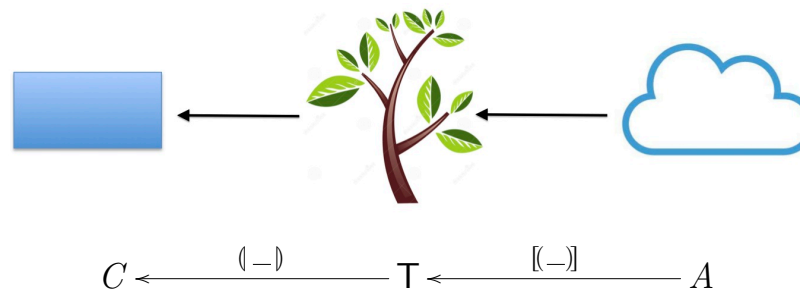
ALGORITHM CLASSIFICATION

	Singleton	Equal-size
Easy Split/Hard Join	Insertion Sort	Merge Sort
Hard Split/Easy Join	Selection Sort	Quick Sort

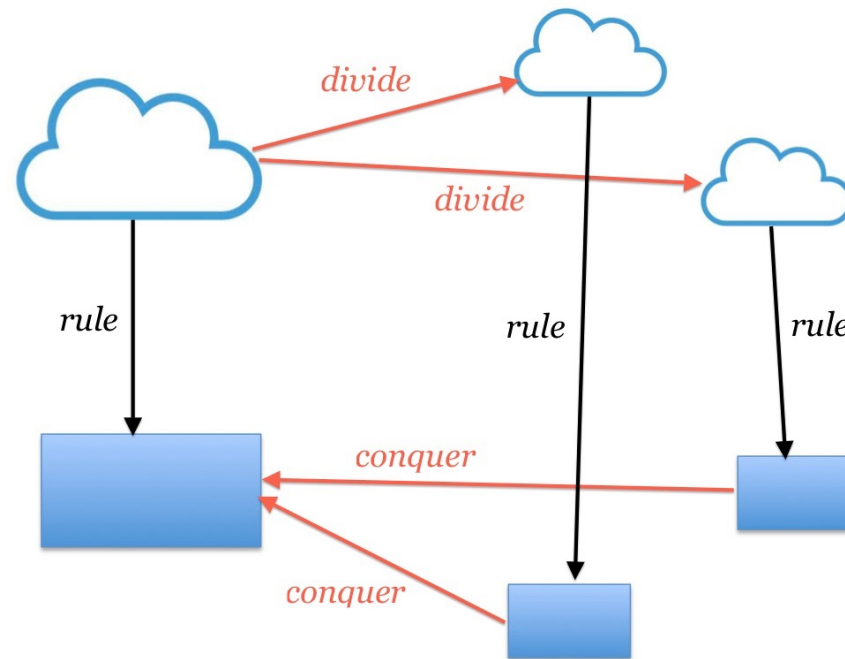
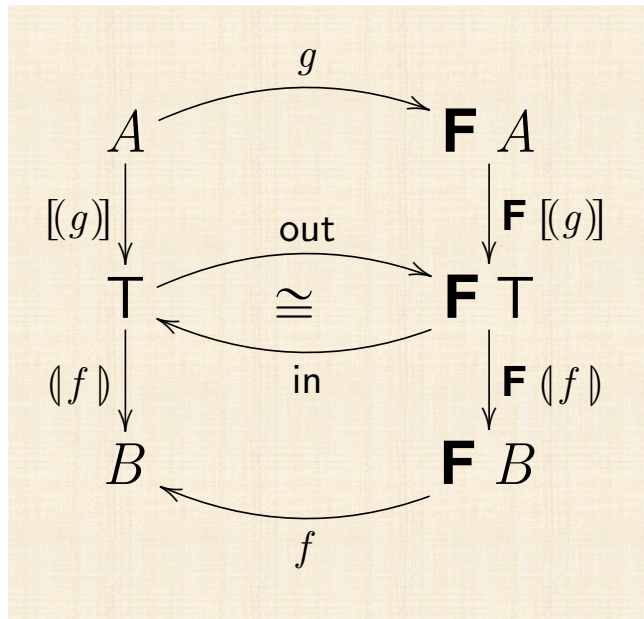
NB:

'Split' = *divide*

'Join' = *conquer*



More on 'DIVIDE & CONQUER'



More on 'DIVIDE & CONQUER'

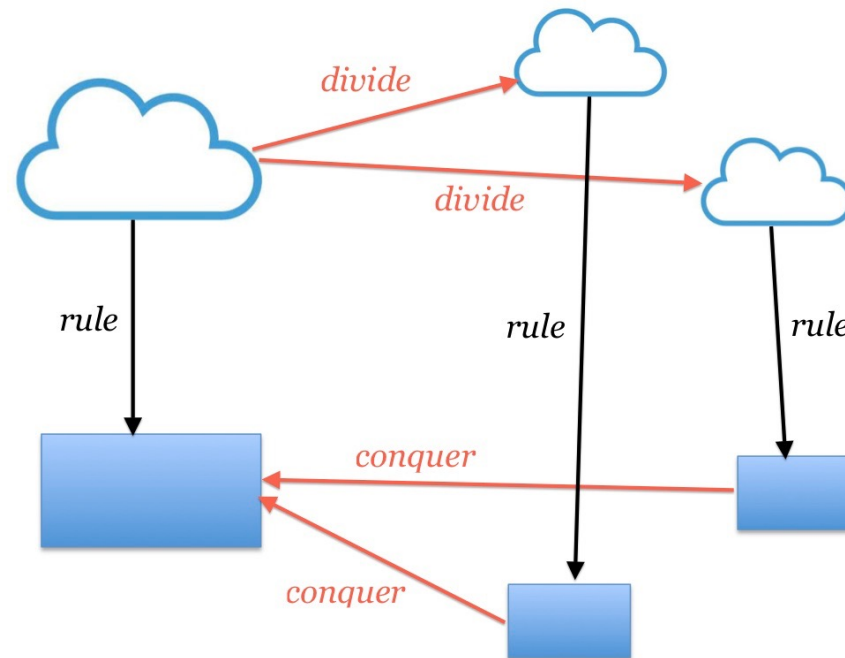


$C \xleftarrow{(\text{conquer})} T \xleftarrow{[(\text{divide})]} A$

More on 'DIVIDE & CONQUER'

QUESTION:

*In algorithm analysis, how do we find **divide** and **conquer**?*



Example (FIBONACCI)

$$\textit{fib } 0 = 1$$

$$\textit{fib } 1 = 1$$

$$\textit{fib } (n + 2) = \textit{fib } (n + 1) + \textit{fib } n$$

$$\textit{in} = [\underline{0}, \textit{succ}]$$

FIBONACCI

(practical rule)

$$\text{fib } 0 = 1$$

$$\text{fib } 1 = 1$$

$$\text{fib } (n + 2) = \text{fib } (n + 1) + \text{fib } n$$

$$\text{divide } 0 = 1$$

$$\text{divide } 1 = 1$$

$$\text{divide } (n + 2) = \dots (n + 1) \dots n$$

$$\text{divide } 0 = i_1 \ 1$$

$$\text{divide } 1 = i_1 \ 1$$

$$\text{divide } (n + 2) = i_2 \ (n + 1, n)$$

FIBONACCI

$$\textit{fib } 0 = 1$$

$$\textit{fib } 1 = 1$$

$$\textit{fib } (n + 2) = \textit{fib } (n + 1) + \textit{fib } n$$

$$\textit{divide} : \mathbb{N}_0 \rightarrow \mathbb{N}_0 + \mathbb{N}_0^2$$

$$\textit{divide } 0 = i_1 \ 1$$

$$\textit{divide } 1 = i_1 \ 1$$

$$\textit{divide } (n + 2) = i_2 \ (n + 1, n)$$

FIBONACCI

$$\text{fib } 0 = 1$$

$$\text{fib } 1 = 1$$

$$\text{fib } (n + 2) = \text{fib } (n + 1) + \text{fib } n$$

$$\text{divide} : \mathbb{N}_0 \rightarrow \mathbb{N}_0 + \mathbb{N}_0^2$$

$$\text{divide} \text{ (B } (X, Y) = X + Y^2$$

$$\text{divide } (n + 2) = v_2 (n + 1, n)$$

FIBONACCI

$T = LTree\ No$

$$fib\ (n + 1) + fib\ n$$

$$divide : 1 \quad T = N_0 + N_0^2$$

$$\mathbf{B} (X, Y) = X + Y^2$$

$$divide\ (n + 2) = v_2\ (n + 1, n)$$

FIBONACCI

$divide\ 0 = i_1\ 1$
 $divide\ 1 = i_1\ 1$
 $divide\ (n + 2) = i_2\ (n + 1, n)$

$conquer : \mathbb{N}_0 + \mathbb{N}_0^2 \rightarrow \mathbb{N}_0$
 $conquer = [id, add]$

$fib\ 0 = 1$
 $fib\ 1 = 1$
 $fib\ (n + 2) = fib\ (n + 1) + fib\ n$

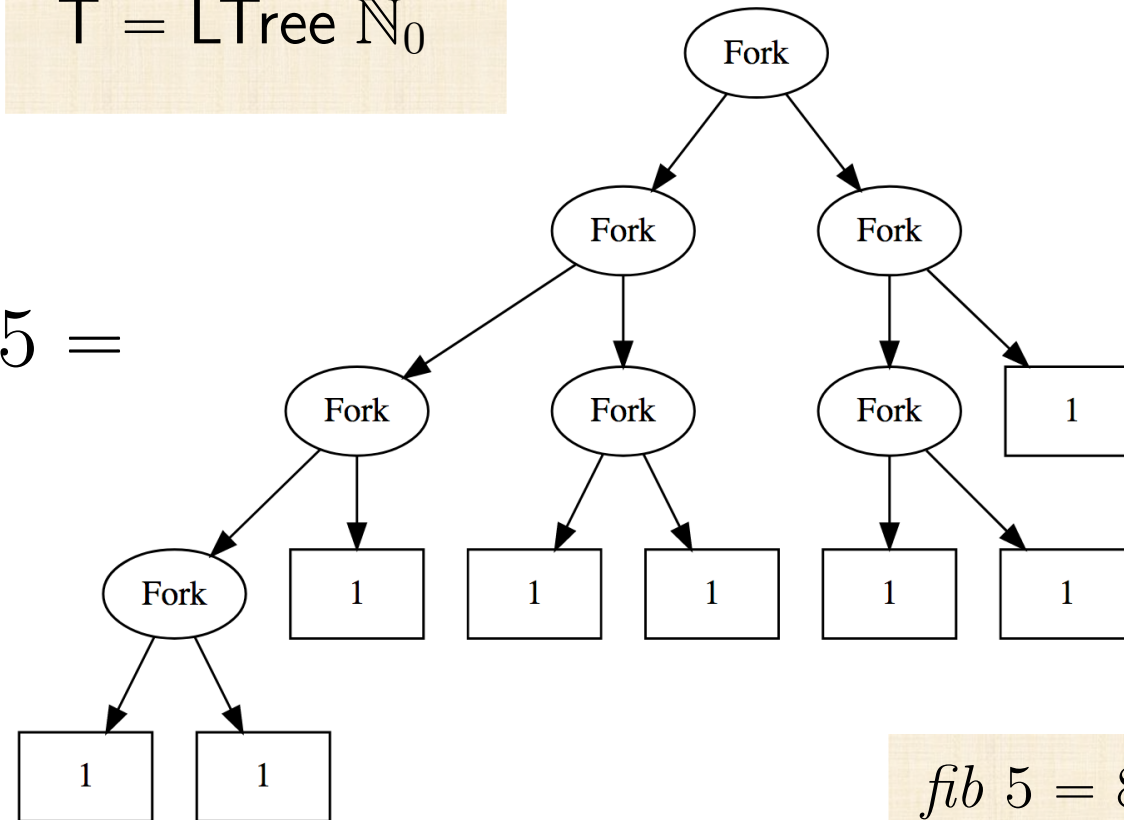
$T = LTree\ \mathbb{N}_0$

FIBONACCI

```
fib :: (Integral c) => c -> c
fib = hyloL conquer divide
  where
    divide 0 = i1 1
    divide 1 = i1 1
    divide(n+2) = i2(n+1,n)
    conquer = either id add
```

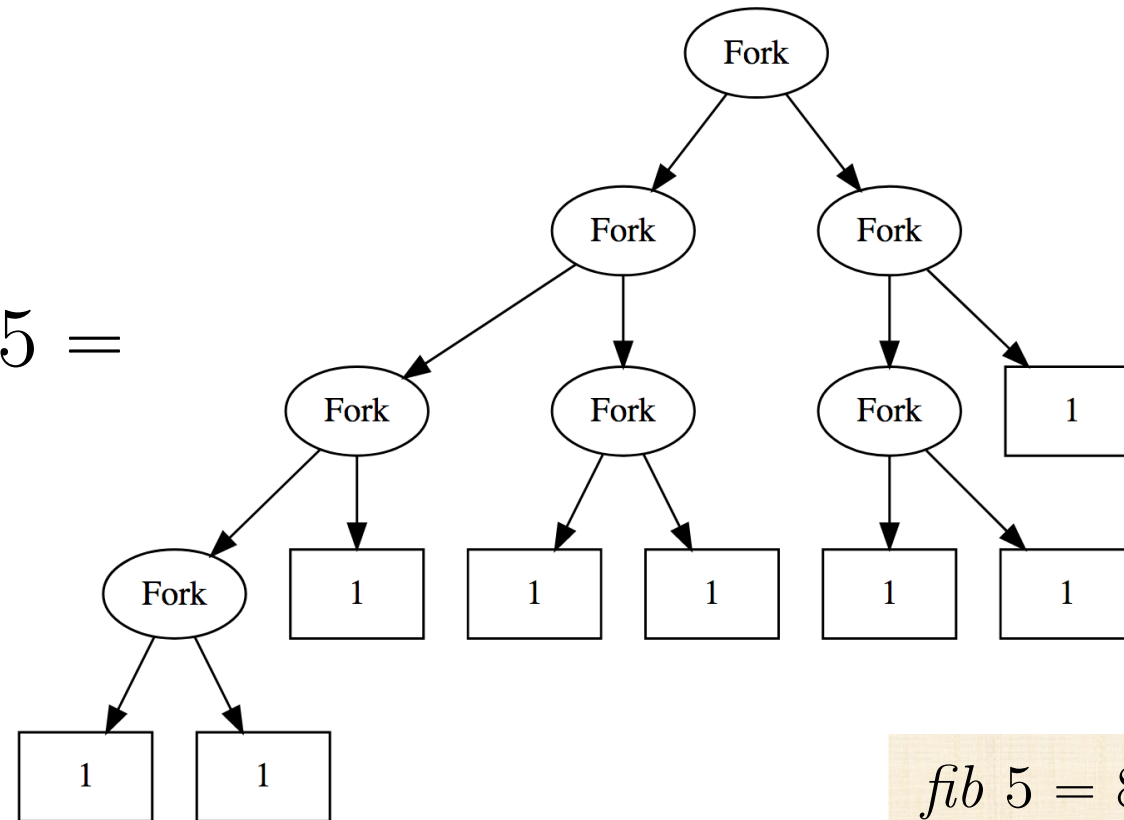
FIBONACCI

$$T = \text{LTree } N_0$$

$$[(divide)]\ 5 =$$


$$fib\ 5 = 8$$

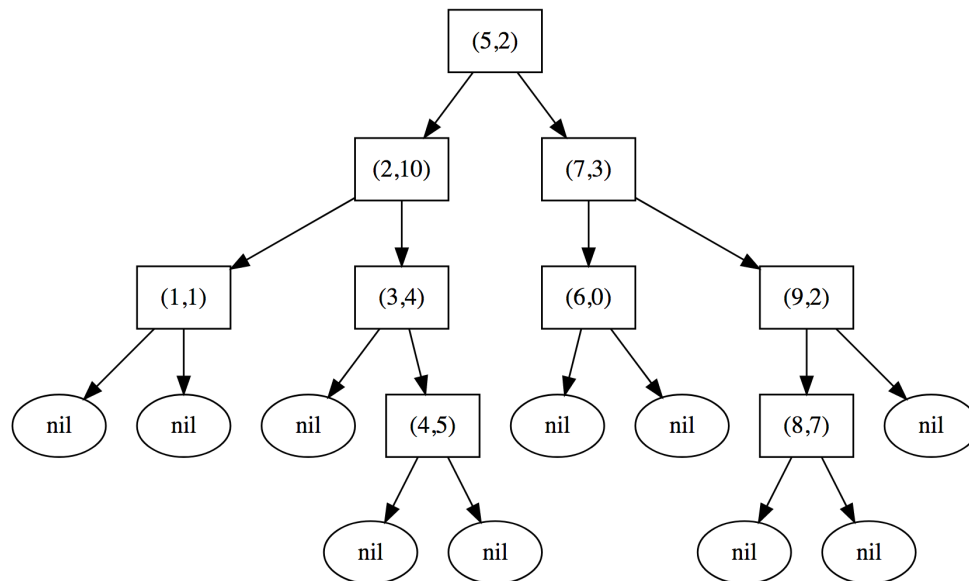
FIBONACCI

$$[(divide)]\ 5 =$$


$$fib\ 5 = 8$$

Pesquisa binária

```
lookBTree :: Ord a => a -> BTree (a,b) -> Maybe b
lookBTree a Empty = Nothing
lookBTree a (Node((a',b'),(l,r)))
  | a == a' = Just b'
  | a < a' = lookBTree a l
  | a > a' = lookBTree a r
```



Pesquisa binária

```
try a ((a', b'), (l, r))
  | a == a' = i1 (i2 b')
  | a < a' = i2 l
  | a > a' = i2 r
```

```
lookBTree :: Ord a => a -> BTree (a,b) -> Maybe b
lookBTree a Empty = Nothing
lookBTree a (Node((a',b'),(l,r)))
  | a == a' = Just b'
  | a < a' = lookBTree a l
  | a > a' = lookBTree a r
```

$$\begin{array}{ccc}
 T(A \times B) & \xrightarrow{\text{out}} & 1 + (A \times B) \times (T(A \times B))^2 \\
 \downarrow \text{look } a & & \downarrow [i_1 \cdot i_1, \text{try } a] \\
 1 + B & \xleftarrow{[id, id]} & (1 + B) + (1 + B) \\
 & & \downarrow id + \text{look } a \\
 & & (1 + B) + T(A \times B)
 \end{array}$$

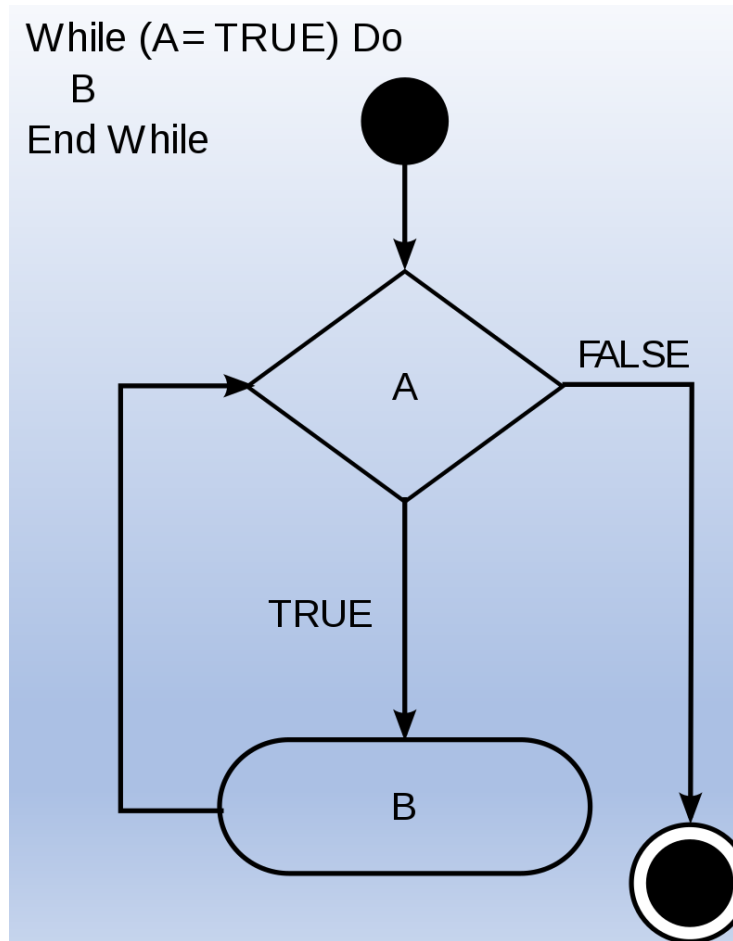
Pesquisa binária

```
try a ((a', b'), (l, r))
  | a = a' = i1 (i2 b')
  | a < a' = i2 l
  | a > a' = i2 r
```

```
lookBTree :: Ord a => BTree a -> Maybe b
lookBTree a Empty = ...
lookBTree a (Node ...)
```

$$\begin{aligned}
 T(A \times B) &\rightarrow \dots \rightarrow (T(A \times B))^2 \xrightarrow{[i_1 \cdot i_1, \text{try } a]} (1 + B) + T(A \times B) \\
 &\quad \downarrow \text{look } a \quad \downarrow id + \text{look } a \\
 1 &\rightarrow \dots \rightarrow (1 + B) + (1 + B) \\
 &\quad \quad \quad [id, id]
 \end{aligned}$$

‘While loop’

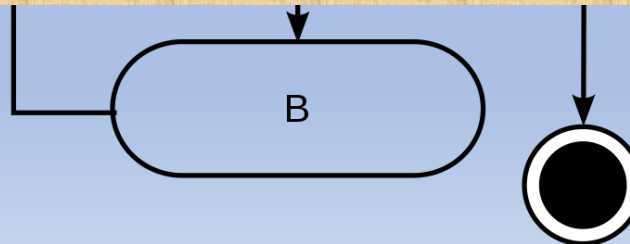


'While loop'

While (A= TRUE) Do
 B
End While

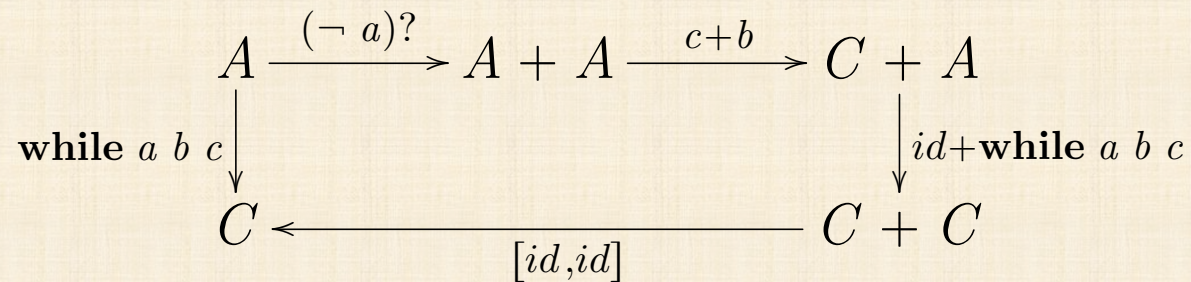


$\text{while} : (A \rightarrow \mathbb{B}) \rightarrow (A \rightarrow A) \rightarrow A \rightarrow A$
 $\text{while } a \ b \ x =$
 if $a \ x$
 then while $a \ b \ (b \ x)$
 else x

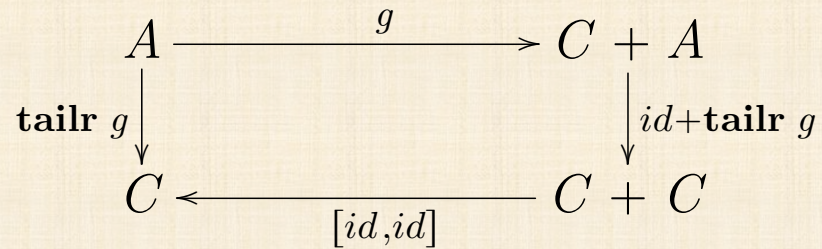


‘While loop’

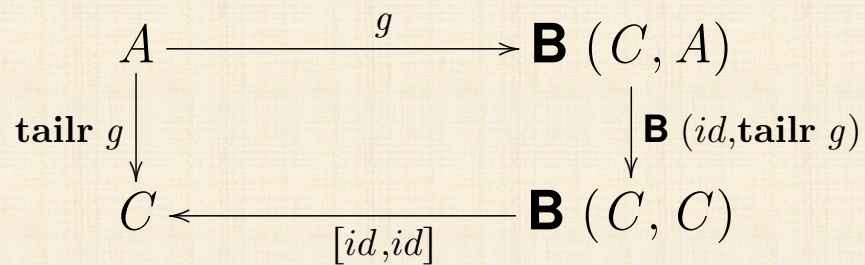
$\mathbf{while} :: (A \rightarrow \mathbb{B}) \rightarrow (A \rightarrow A) \rightarrow (A \rightarrow C) \rightarrow A \rightarrow C$
 $\mathbf{while} \ a \ b \ c \ x =$
 $\mathbf{if} \ a \ x$
 $\mathbf{then} \ \mathbf{while} \ a \ b \ c \ (b \ x)$
 $\mathbf{else} \ c \ x$



‘Tail recursion’



$$\mathbf{B} (X, Y) = X + Y$$



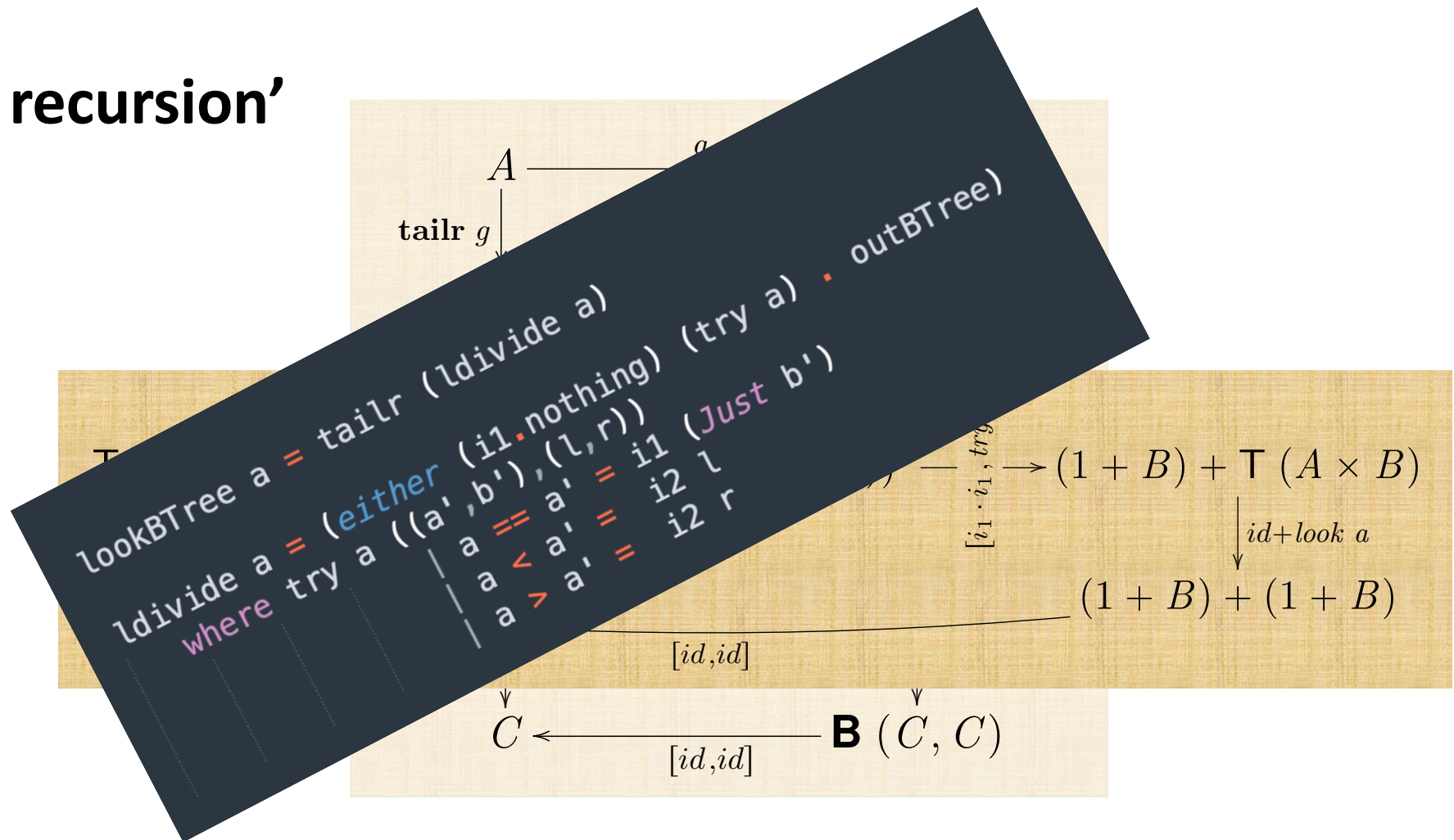
‘Tail recursion’

$$\begin{array}{ccc}
 A & \xrightarrow{g} & C + A \\
 \text{tailr } g \downarrow & & \downarrow id + \text{tailr } g \\
 C & \xleftarrow{[id, id]} & C + C
 \end{array}$$

$$\begin{array}{ccccc}
 \mathsf{T} (A \times B) & \xrightarrow{\text{out}} & 1 + (A \times B) \times (\mathsf{T} (A \times B))^2 & \xrightarrow{[i_1 \cdot i_1, \text{try } a]} & (1 + B) + \mathsf{T} (A \times B) \\
 \text{look } a \downarrow & & & & \downarrow id + \text{look } a \\
 1 + B & \xleftarrow{[id, id]} & & & (1 + B) + (1 + B)
 \end{array}$$

$$\begin{array}{ccc}
 \downarrow & & \downarrow \\
 C & \xleftarrow{[id, id]} & \mathbf{B} (C, C)
 \end{array}$$

'Tail recursion'



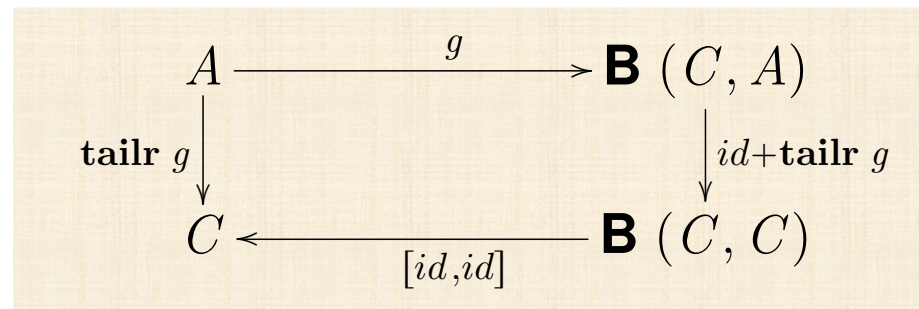
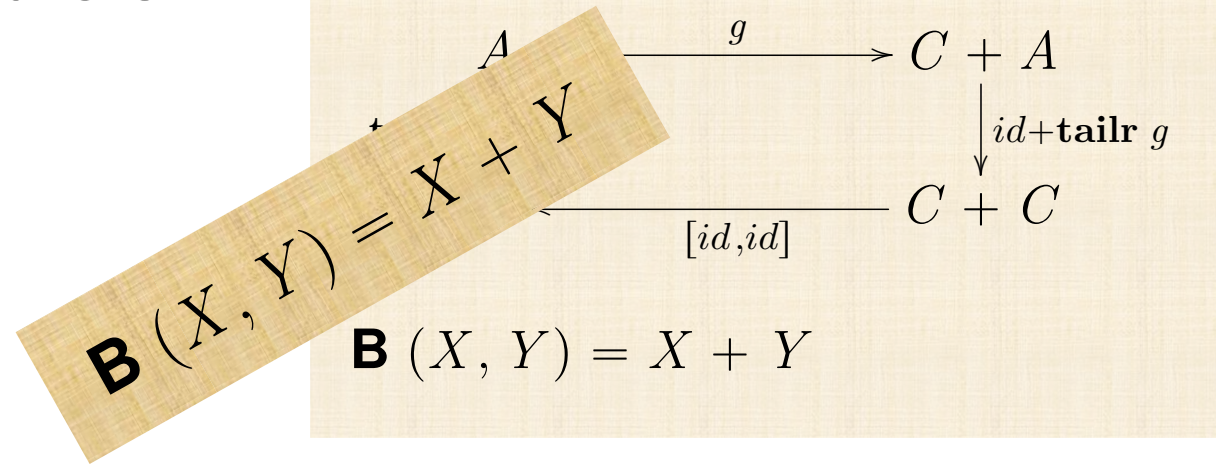
‘Tail recursion’

$$\begin{array}{ccc} A & \xrightarrow{g} & C + A \\ \text{tailr } g \downarrow & & \downarrow id + \text{tailr } g \\ C & \xleftarrow{[id, id]} & C + C \end{array}$$

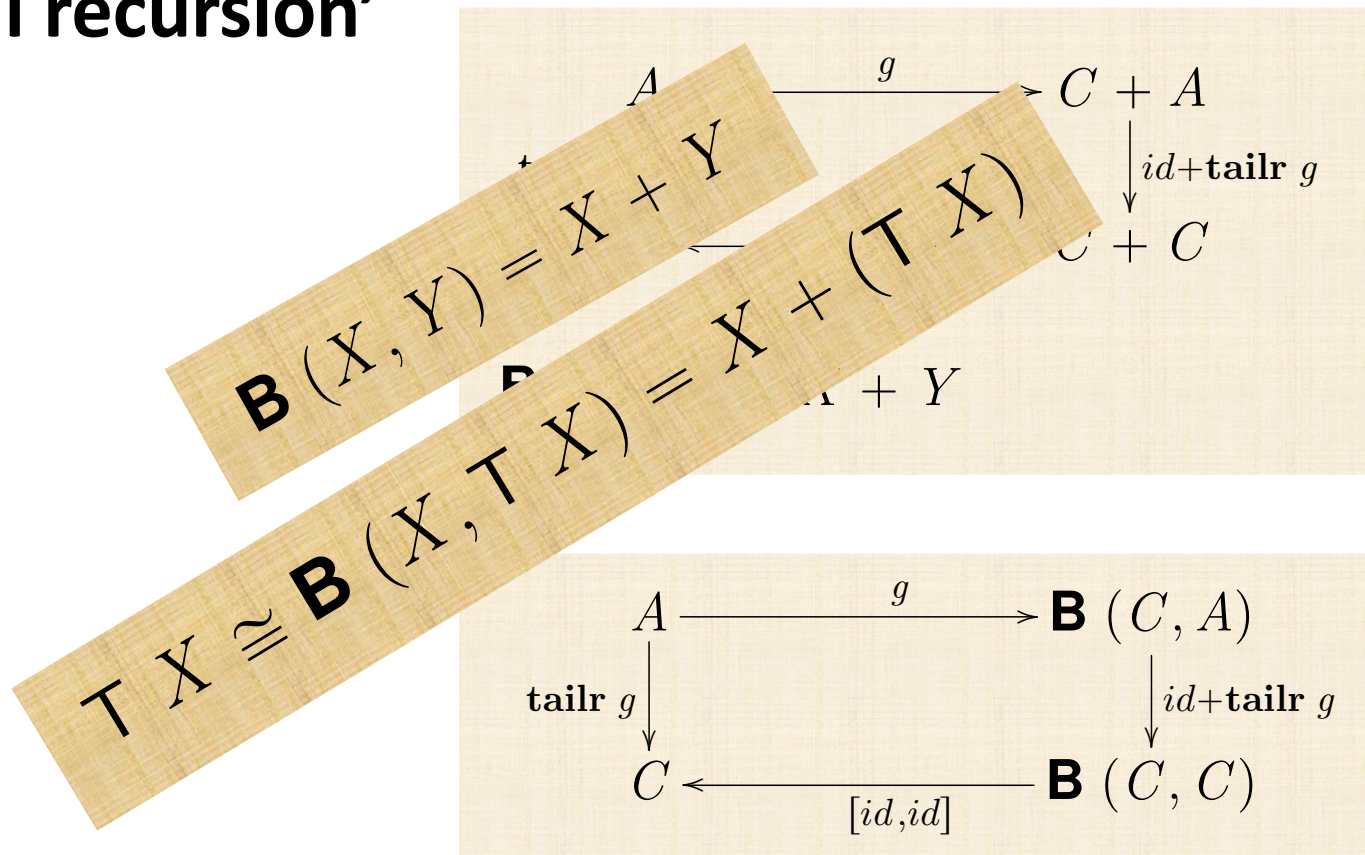
$$\mathbf{B} (X, Y) = X + Y$$

$$\begin{array}{ccc} A & \xrightarrow{g} & \mathbf{B} (C, A) \\ \text{tailr } g \downarrow & & \downarrow id + \text{tailr } g \\ C & \xleftarrow{[id, id]} & \mathbf{B} (C, C) \end{array}$$

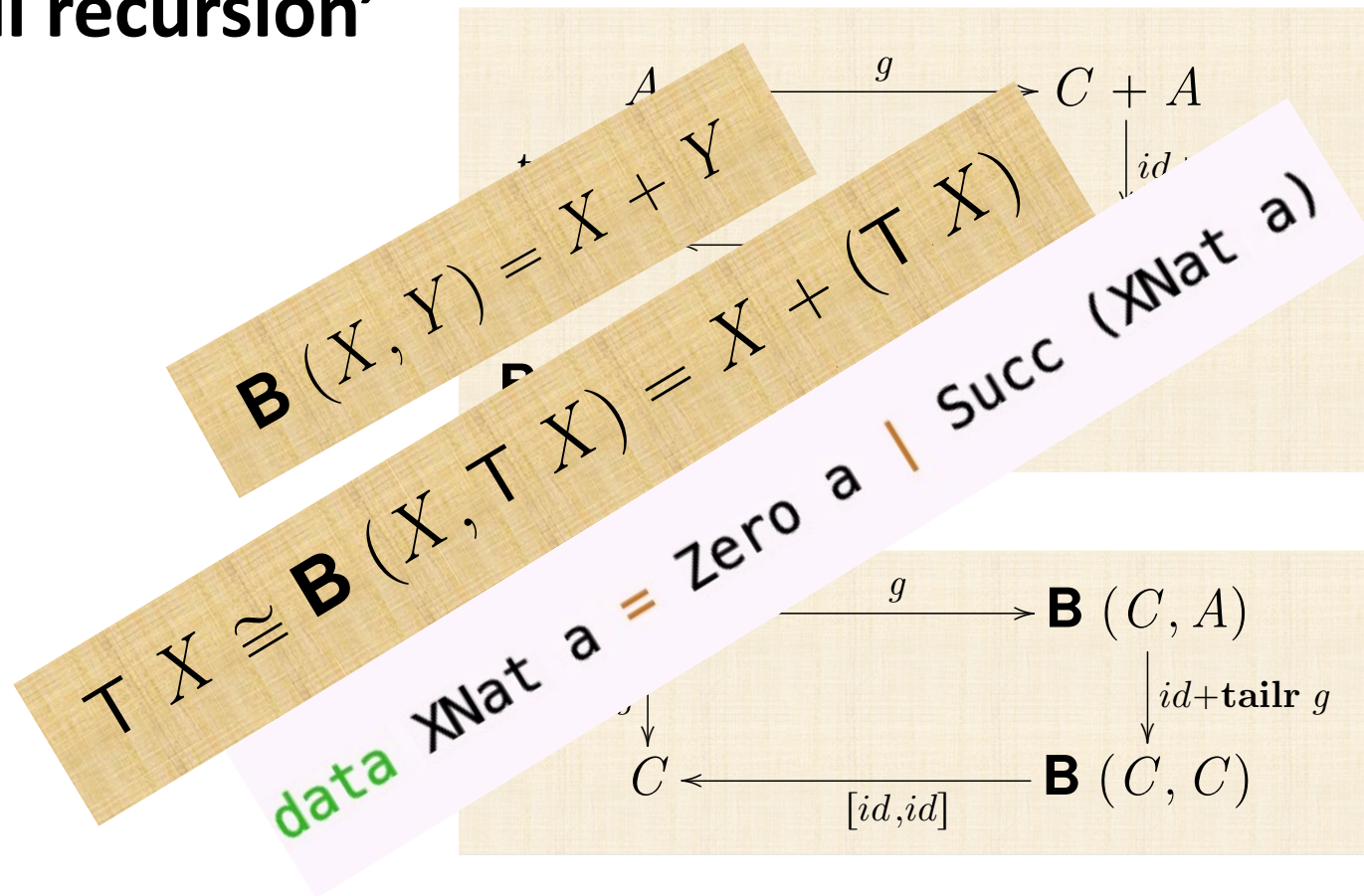
'Tail recursion'



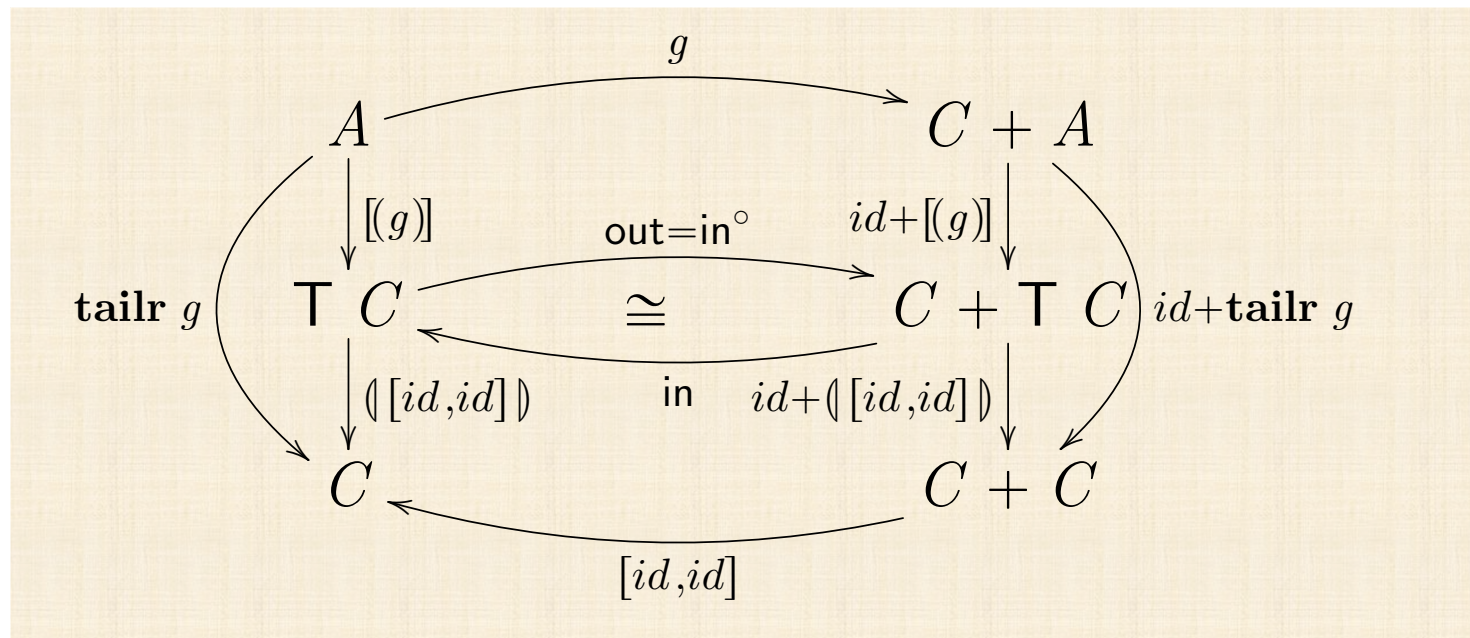
'Tail recursion'



'Tail recursion'



‘Tail recursion’ hylo



$$\mathsf{T} X \cong \mathbf{B} (X, \mathsf{T} X) = X + (\mathsf{T} X)$$

“Periodic table”

		$\mathbf{B}(X, Y)$	$1 + Y$	$X + Y$	$1 + X \times Y$	$Z + X \times Y$	$X + Y^2$	$1 + X \times Y^2$
A	C	$\mathbf{T} X$	$\mathbb{N}_0$	$\mathbf{XNat} X$	X^*	$\mathbf{SList} X Z$	$\mathbf{LTree} X$	$\mathbf{BTree} X$
$\mathbb{N}_0$	$\mathbb{N}_0$	Factorial			<i>fac</i>		<i>dfac</i>	
$\mathbb{N}_0$	$\mathbb{N}_0$	Misc. em $\mathbb{N}_0$	$(n*), (n+), -^n$ etc		<i>sq</i>		<i>dsq, fib</i>	
$\mathbb{N}_0$	$\mathbb{N}_0^*$	Séries			<i>odds, evens</i>			
$\mathbb{N}_0 \times X^*$	X^*	Seleccção		<i>udrop</i>	<i>utake</i>			
$\mathbb{R}$	$\mathbb{R}$	Raiz quadrada		$\sqrt{-}_\epsilon$				
X^*	X^*	Filtragem			<i>filter p</i>	<i>filter p</i>		
X^*	X^*	Ordenação	<i>bSort</i>		<i>iSort, sSort</i>		<i>mSort</i>	<i>qSort</i>
X^*	X^{**}	Grupos			<i>chunksOf n</i>			
$X^* \times X^*$	X^*	Junção				<i>merge, uconc</i>		
$X \times X^*$	X^*	Inserção				<i>insert</i>		
$\mathbb{B} \times \mathbb{N}_0$	$(\mathbb{N}_0 \times \mathbb{B})^*$	Puzzles						<i>hanoi</i>
$\mathbf{BTree}(X, Y)$	$1 + Y$	Look-up		<i>lookup x</i>				
$\mathbf{T}(X, Y)$	$1 + Y$	Look-up			<i>lookup x</i>			
$\mathbf{T} X$	$\mathbf{T} X$	Inversão			<i>reverse</i>		<i>mirror</i>	<i>mirror</i>
$\mathbf{T} X$	$\mathbb{N}_0$	Cardinalidades			<i>length</i>		<i>count</i>	<i>count</i>
$\mathbf{T} X$	$\mathbb{N}_0$	Profundidades					<i>depth</i>	<i>depth</i>
$\mathbf{T} X$	X^*	Travessias					<i>tips</i>	<i>inordt, preordt, posordt</i>
$\mathbf{T} X$	X^{**}	Caminhos			<i>prefixes, suffixes</i>			<i>traces</i>
$\mathbf{T}(\mathbf{T} X)$	$\mathbf{T} X$	'Multiplicação'			μ		μ	

Grupo →	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18
↓ Período																		
1	1 H																	2 He
2	3 Li	4 Be											5 B	6 C	7 N	8 O	9 F	10 Ne
3	11 Na	12 Mg											13 Al	14 Si	15 P	16 S	17 Cl	18 Ar
4	19 K	20 Ca	21 Sc	22 Ti	23 V	24 Cr	25 Mn	26 Fe	27 Co	28 Ni	29 Cu	30 Zn	31 Ga	32 Ge	33 As	34 Se	35 Br	36 Kr
5	37 Rb	38 Sr	39 Y	40 Zr	41 Nb	42 Mo	43 Tc	44 Ru	45 Rh	46 Pd	47 Ag	48 Cd	49 In	50 Sn	51 Sb	52 Te	53 I	54 Xe
6	55 Cs	56 Ba	57 La	58 Ce	59 Pr	60 Nd	61 Pm	62 Sm	63 Eu	64 Gd	65 Tb	66 Dy	67 Ho	68 Er	69 Tm	70 Yb	71 Lu	72 Hf
7	87 Fr	88 Ra	89 Ac	90 Th	91 Pa	92 U	93 Np	94 Pu	95 Am	96 Cm	97 Bk	98 Cf	99 Es	100 Fm	101 Md	102 No	103 Lr	104 Rf

Description	T X	B (X, Y)	B (id, f)	B (f, id)
“Right” Lists	List X	$1 + X \times Y$	$id + id \times f$	$id + f \times id$
“Left” Lists	LList X	$1 + Y \times X$	$id + f \times id$	$id + id \times f$
Non-empty Lists	NList X	$X + X \times Y$	$id + id \times f$	$f + f \times id$
Binary Trees	BTree X	$1 + X \times Y^2$	$id + id \times f^2$	$id + f \times id$
“Leaf” Trees	LTree X	$X + Y^2$	$id + f^2$	$f + id$



Research
at Google

Lecture: The Google MapReduce

<http://research.google.com/archive/mapreduce.html>

10/03/2014

Romain Jacotin

romain.jacotin@orange.fr

Monads

4

WHY MONADS MATTER

In this chapter we present a powerful device in state-of-the-art functional programming, that of a *monad*. The monad concept is nowadays of primary importance in computing science because it makes it possible to describe computational effects as disparate as input/output, comprehension notation, state variable updating, probabilistic behaviour, context dependence, partial behaviour *etc.* in an elegant and uniform way.

Our motivation to this concept will start from a well-known problem in functional programming (and computing as a whole) — that of coping with undefined computations.

4

WHY MONADS MATTER

In this chapter we present a powerful device in functional programming, that of a *monad*. The monad of primary importance in computing science becomes possible to describe computational effects as disjunction, comprehension notation, state variable updating, probabilistic behaviour, context dependence, partial behaviour *etc.* in an elegant and uniform way.

Our motivation to this concept will start from a well-known problem in functional programming (and computing as a whole) — that of coping with undefined computations.





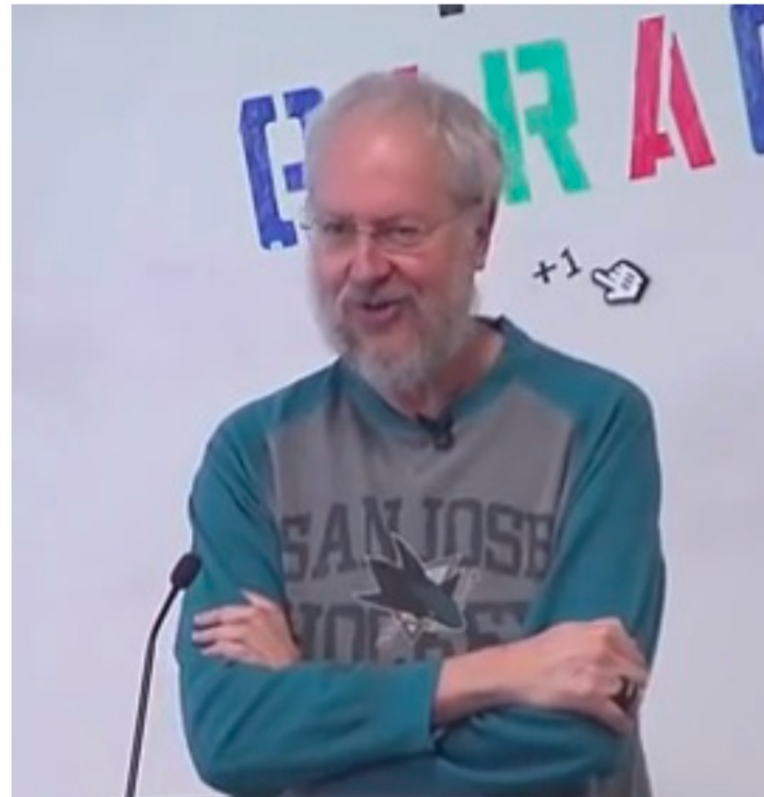
Probability of the sum





“Monads [...] come with a curse. The monadic curse is that once someone learns what monads are and how to use them, they lose the ability to explain it to other people”

(Douglas Crockford: *Google Tech Talk on how to express monads in JavaScript*  2013)



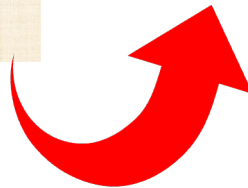
Douglas Crockford (2013)

Partial functions

$$1 + B \xleftarrow{g} A$$

$$B \xleftarrow{f} A$$

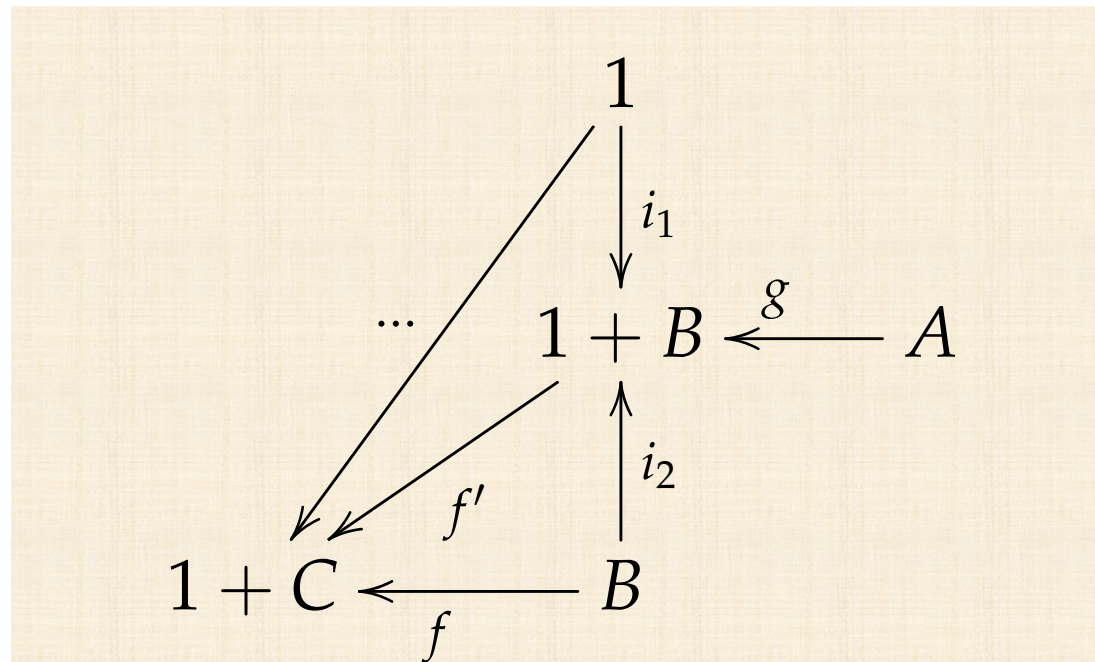
$$1 + B \xleftarrow{i_2 \cdot f} A$$



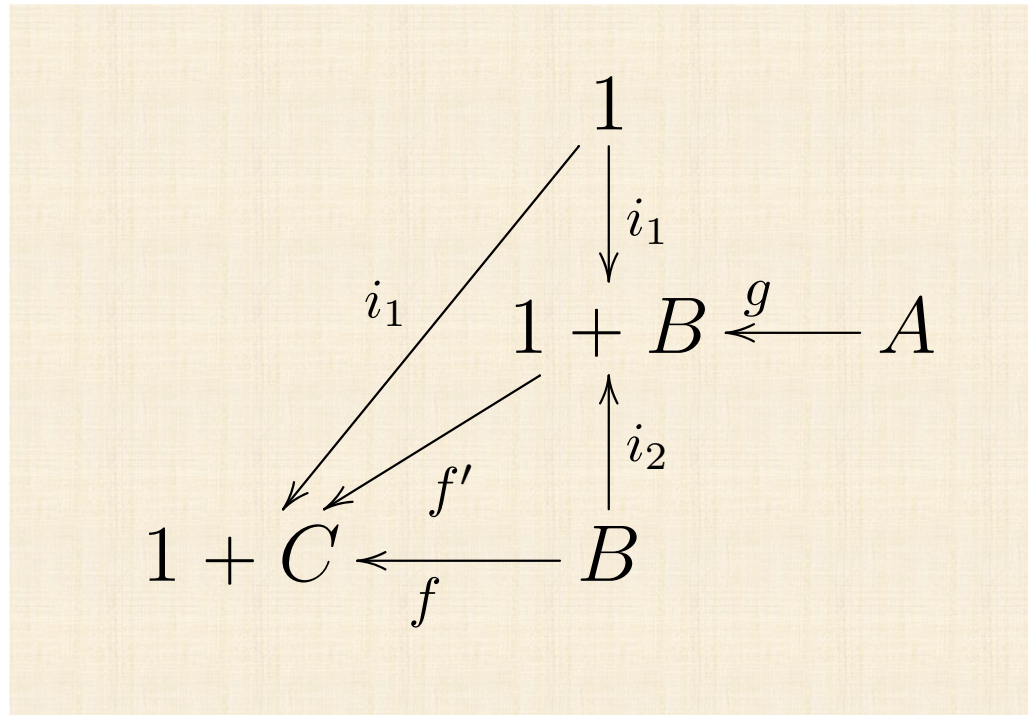
Partial functions

$$\begin{array}{ccc} 1 + B & \xleftarrow{g} & A \\ \vdots & & \\ 1 + C & \xleftarrow{f} & B \end{array}$$

Partial functions



Partial functions



Partial functions

$$\begin{array}{c} 1 + B \xleftarrow{g} A \\ \swarrow [i_1, f] \\ 1 + C \end{array}$$

Partial functions

$$\begin{array}{c} 1 + B \xleftarrow{g} A \\ \swarrow [i_1, f] \\ 1 + C \end{array}$$

Partial functions

$$\begin{array}{ccc} & 1 + B & \xleftarrow{g} A \\ [i_1, id] \cdot (id + f) \swarrow & & \\ 1 + C & & \end{array}$$

Partial composition

$$\begin{array}{ccccc} 1 + (1 + C) & \xleftarrow{id+f} & 1 + B & \xleftarrow{g} & A \\ \downarrow [i_1, id] & & \vdots & & \\ 1 + C & \xleftarrow{f} & B & & \end{array}$$

Partial composition

$$\begin{array}{ccc}
 1 + (1 + C)^{id+f} & \xleftarrow{\quad} & A \\
 [i_1, id] \downarrow & & \vdots \\
 f \bullet g & \xleftarrow{\quad} & B
 \end{array}
 \quad \begin{array}{l}
 \text{def} \\
 \underline{\underline{=}}
 \end{array}
 \quad [i_1, id] \cdot (id + f) \cdot g$$

‘Maybe functions’

$$\begin{array}{ccc} \text{Maybe } B & \xrightarrow{\text{out}=\text{in}^\circ} & 1 + B \\ & \cong & \\ & \xleftarrow{\text{in}=[\text{Nothing}, \text{Just}]} & \end{array}$$

$$\begin{array}{ccc} & A & \\ \text{in} \cdot f \swarrow & \downarrow f & \\ \text{Maybe } B & & 1 + B \\ & \cong & \\ & \xleftarrow{\text{in}=[\text{Nothing}, \text{Just}]} & \end{array}$$

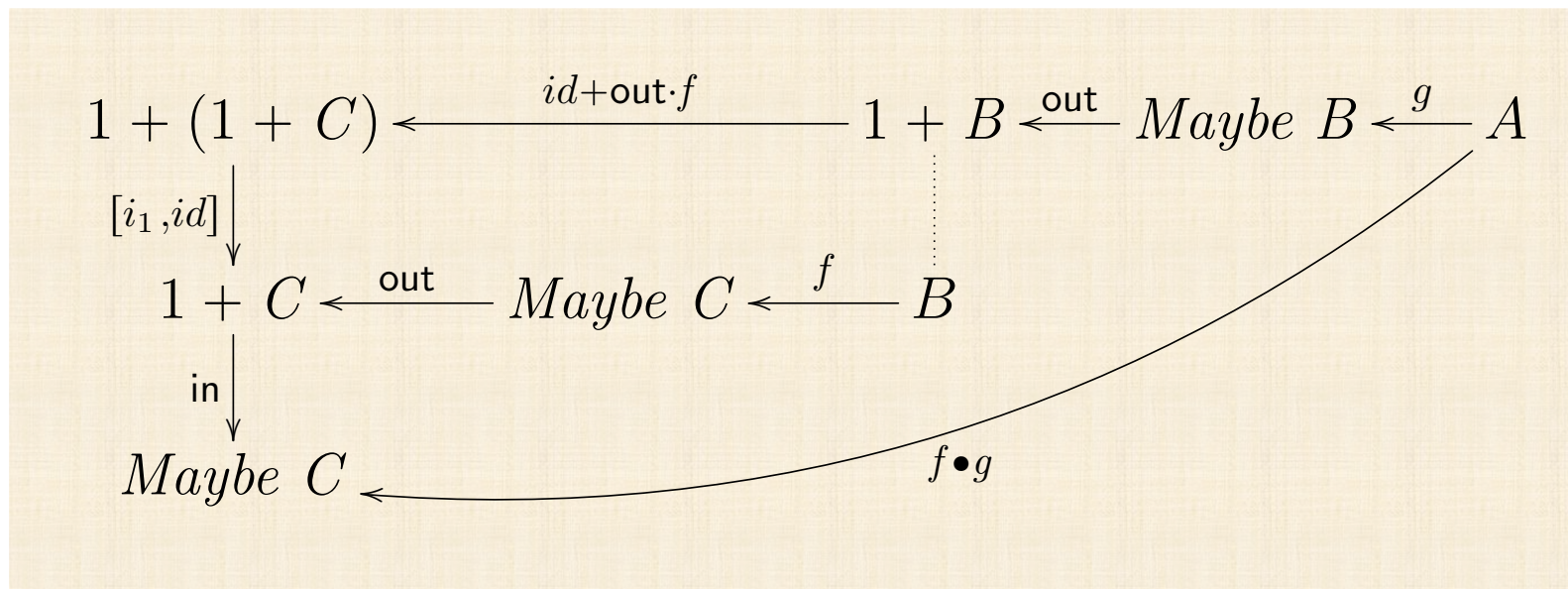
$$\begin{aligned} \text{out Nothing} &= i_1 () \\ \text{out (Just } a) &= i_2 a \end{aligned}$$

```
data Maybe a = Nothing | Just a
```

Composing 'Maybe functions'

$$\begin{array}{c} \text{Maybe } B \xleftarrow{g} A \\ \vdots \\ \text{Maybe } C \xleftarrow{f} B \end{array}$$

Composing 'Maybe functions'



Composing ‘Maybe functions’

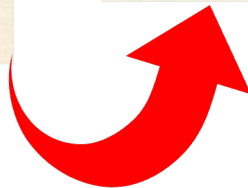
$$\begin{aligned} f \bullet g &= \text{in} \cdot [i_1, \text{out} \cdot f] \cdot \text{out} \cdot g \\ \equiv & \quad \{ \text{ fus\~ao-+ e } \text{in} \cdot \text{out} = \text{id} \} \\ f \bullet g &= [\text{in} \cdot i_1, f] \cdot \text{out} \cdot g \\ \equiv & \quad \{ \text{ introdu\~cao da vari\~avel } a \} \\ (f \bullet g) \ a &= [\text{in} \cdot i_1, f] (\text{out} (g \ a)) \\ \equiv & \quad \{ \text{ defini\~cao de out } \} \\ (f \bullet g) \ a &= \text{if } g \ a = \text{Nothing} \text{ then } [\text{in} \cdot i_1, f] (i_1 ()) \text{ else } [\text{in} \cdot i_1, f] (i_2 (g \ a)) \\ \equiv & \quad \{ \text{ cancelamento-+ e simplifica\~ao } \} \\ (f \bullet g) \ a &= \text{if } g \ a = \text{Nothing} \text{ then Nothing else } f (g \ a) \end{aligned}$$

Error messages

$$E + B \xleftarrow{g} A$$

$$B \xleftarrow{f} A$$

$$E + B \xleftarrow{i_2 \cdot f} A$$



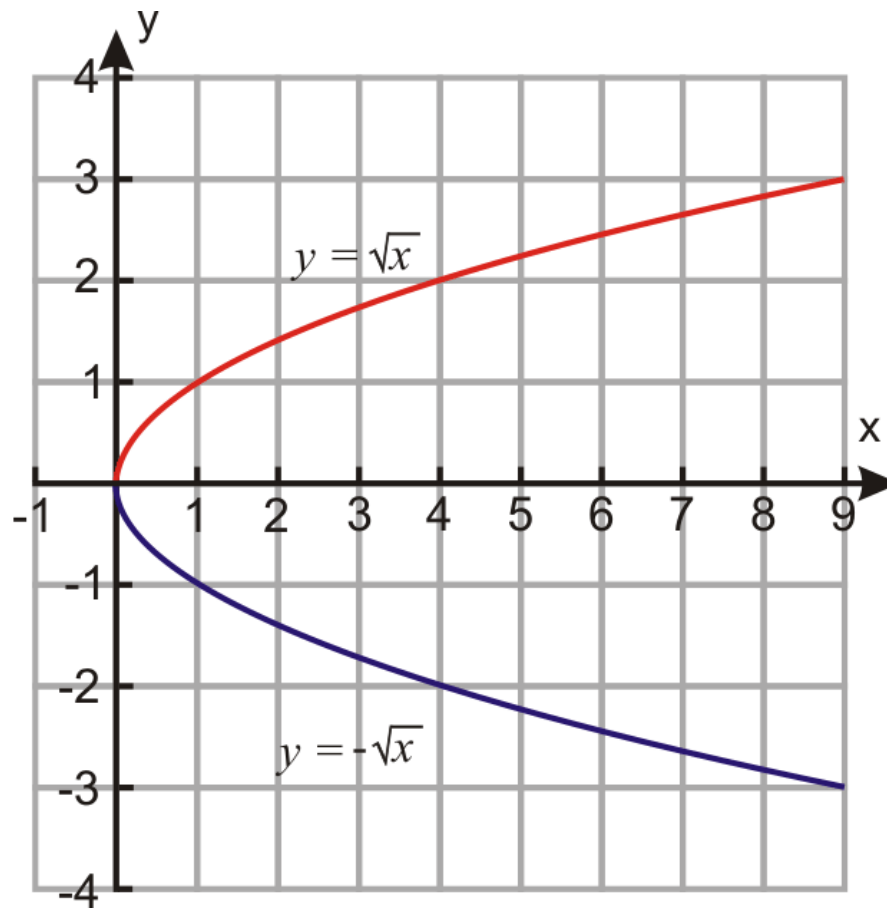
Handling error messages

$$\begin{array}{c} E + (E + C) \xleftarrow{id+f} E + B \xleftarrow{g} A \\ \downarrow [i_1, id] \\ E + C \xleftarrow{f} B \end{array}$$

$f \bullet g$



Square root “function”

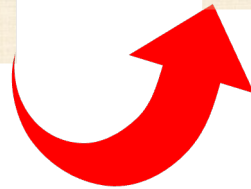


'Undecided' ("nondeterministic") functions

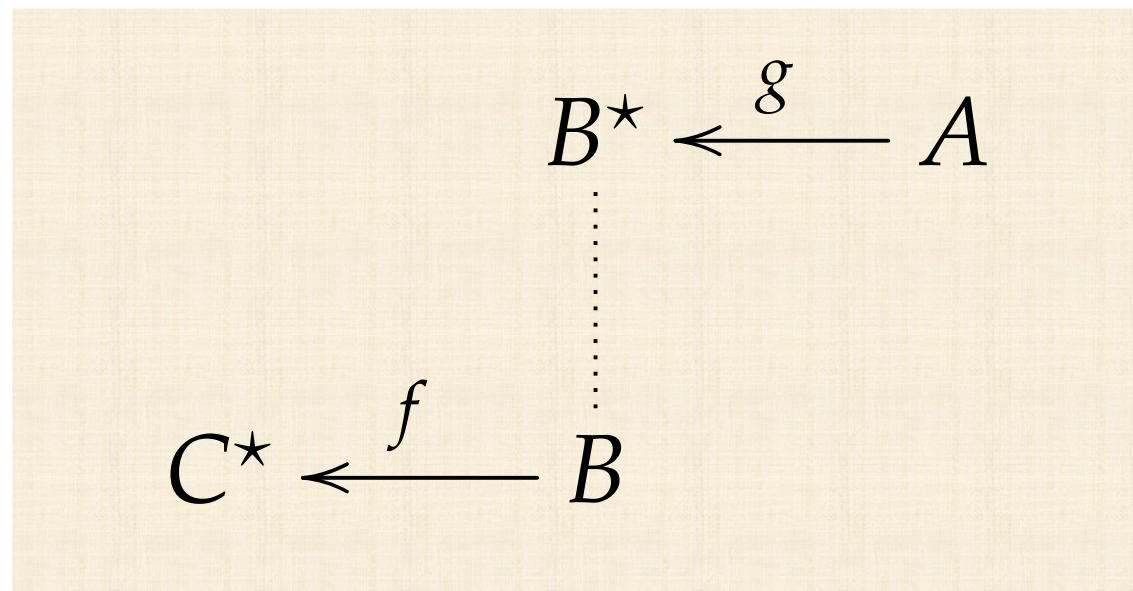
$$B^* \xleftarrow{g} A$$

$$B \xleftarrow{f} A$$

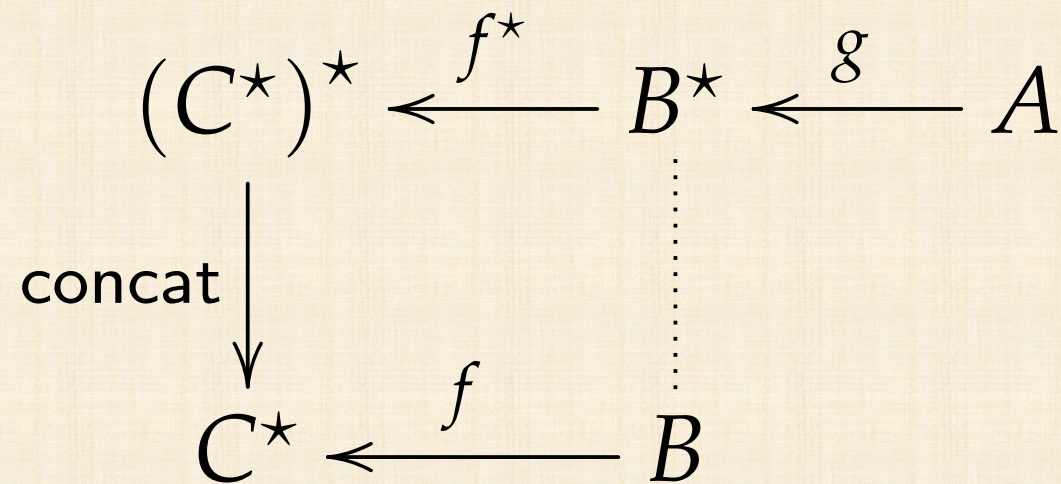
$$B^* \xleftarrow{\text{singl} \cdot f} A$$



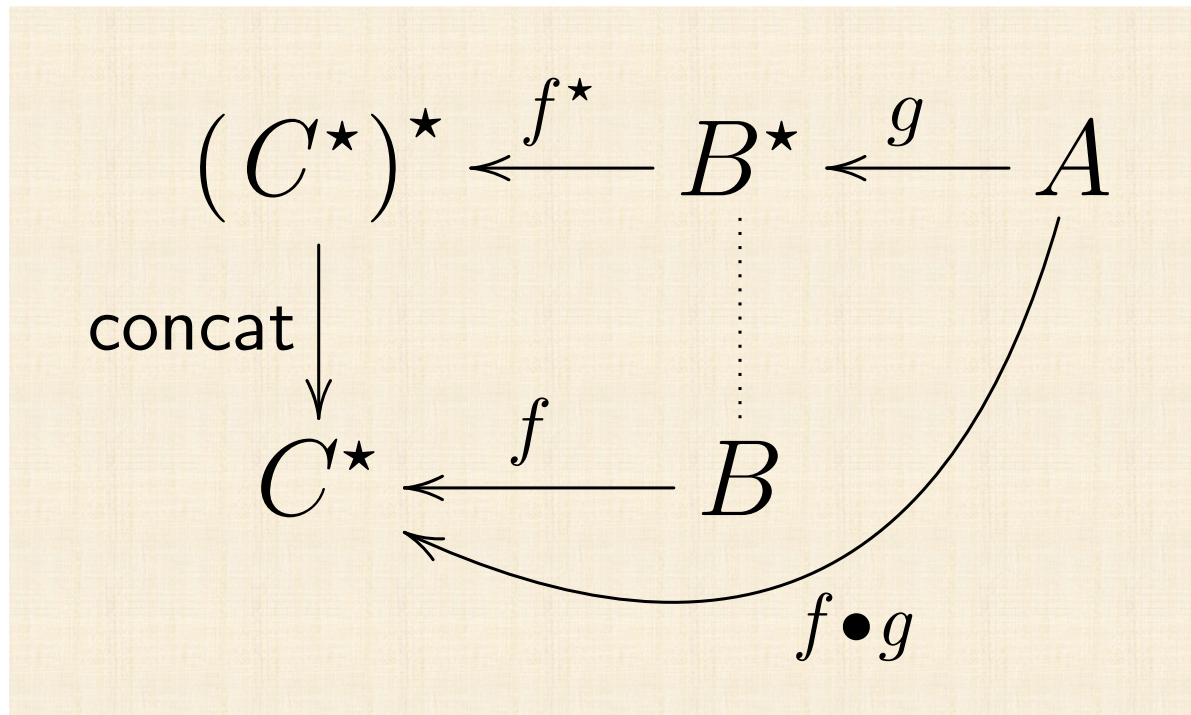
Composing 'undecided' functions



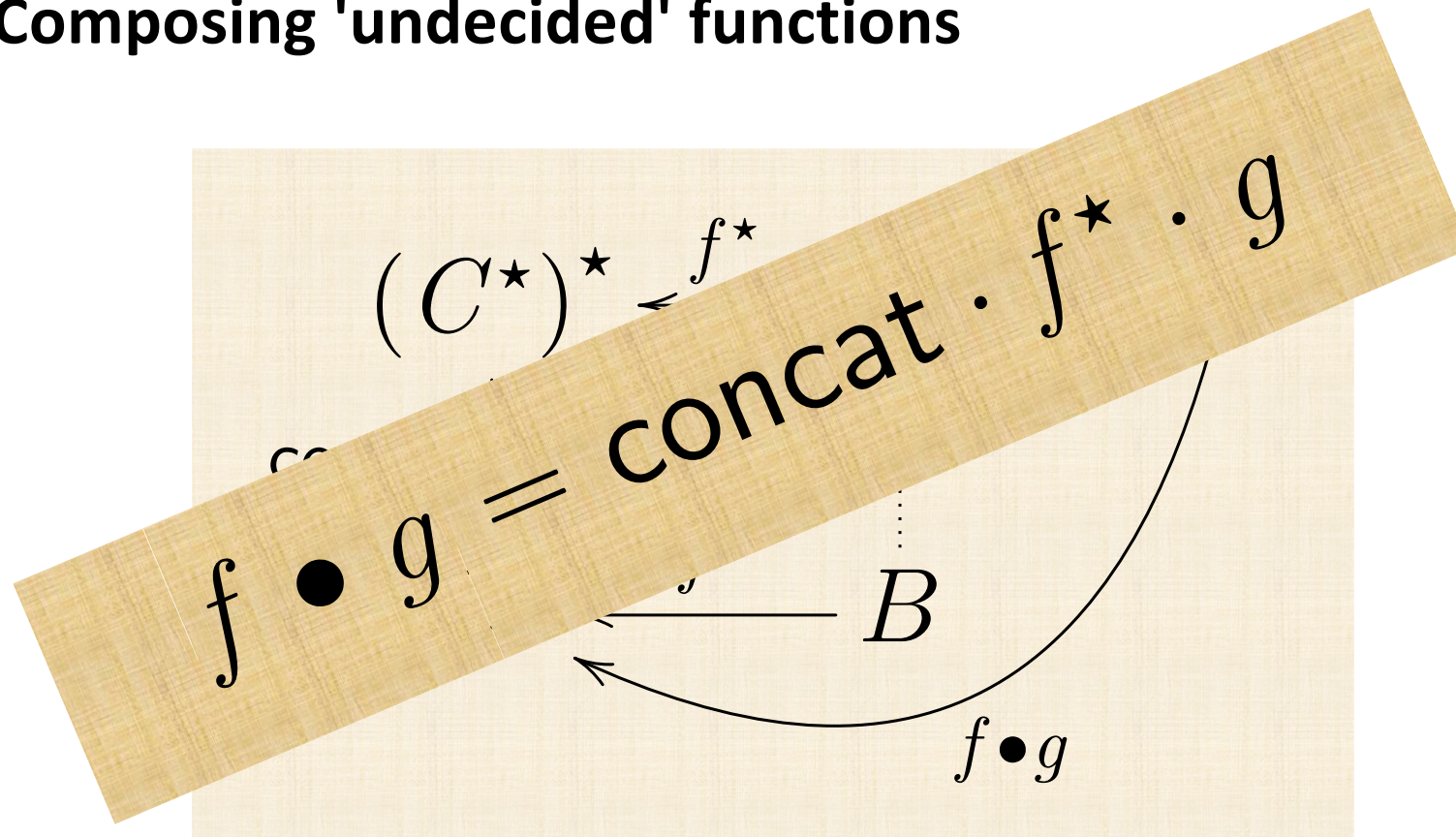
Composing 'undecided' functions



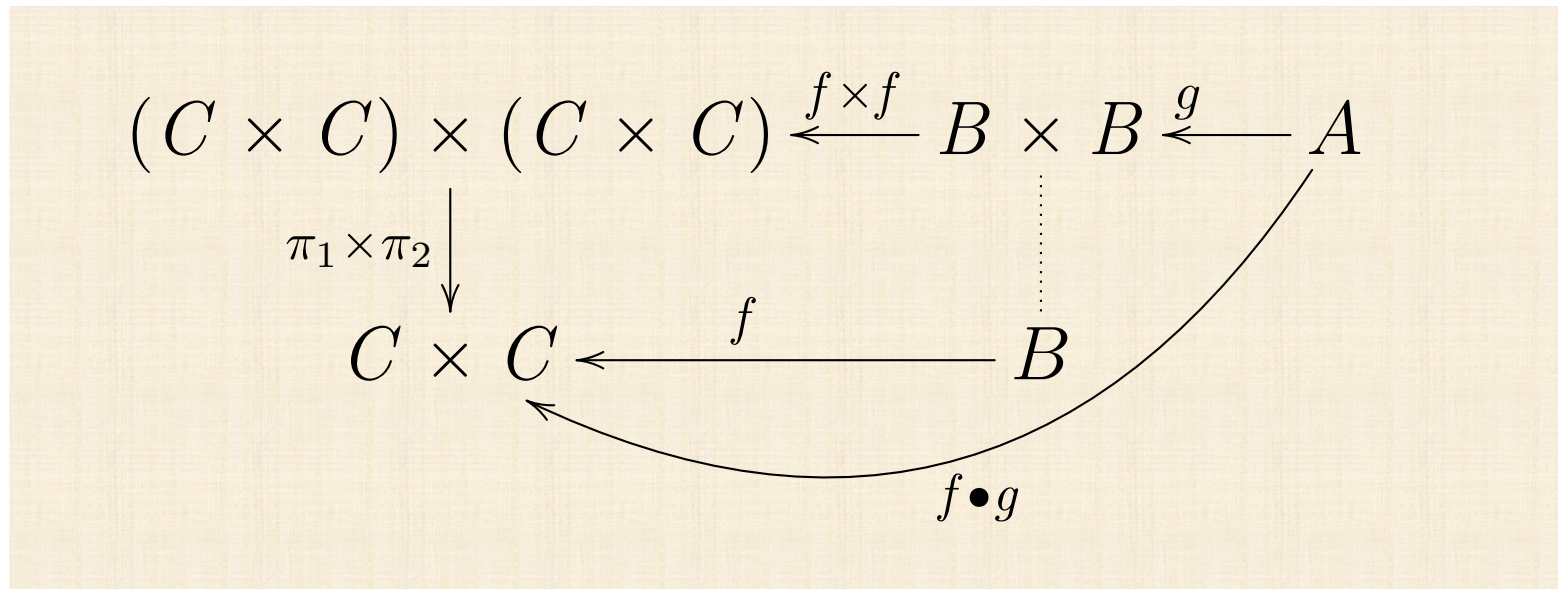
Composing 'undecided' functions



Composing 'undecided' functions



Composing functions that yield pairs



FUNCTORS so far

$$\mathbf{T} X = 1 + X$$

$$\mathbf{T} X = \textit{Maybe } X$$

$$\mathbf{T} X = E + X$$

$$\mathbf{T} X = X^*$$

$$\mathbf{T} X = X \times X$$

Similar structure

$$X \xrightarrow{i_2} 1 + X \xleftarrow{[i_1, id]} 1 + (1 + X)$$

$$X \xrightarrow{i_2} E + X \xleftarrow{[i_1, id]} E + (E + X)$$

$$X \xrightarrow{\text{Just}} \text{Maybe } X \xleftarrow{\mu} \text{Maybe } (\text{Maybe } X)$$

$$X \xrightarrow{\text{singl}} X^* \xleftarrow{\text{concat}} (X^*)^*$$

$$X \xrightarrow{\langle id, id \rangle} X \times X \xleftarrow{\pi_1 \times \pi_2} (X \times X) \times (X \times X)$$

MONAD

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

MONAD

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

Unit

Multiplication

MONAD

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

Monad = **Functor** + unit + multiplication

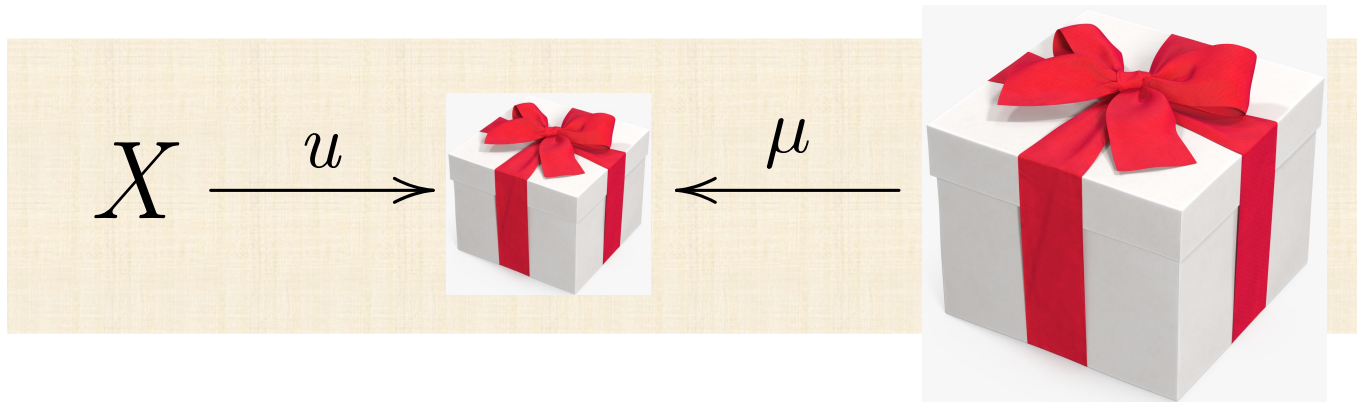
Cálculo de Programas T12

Monad = “racing”
functor



$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

MONAD



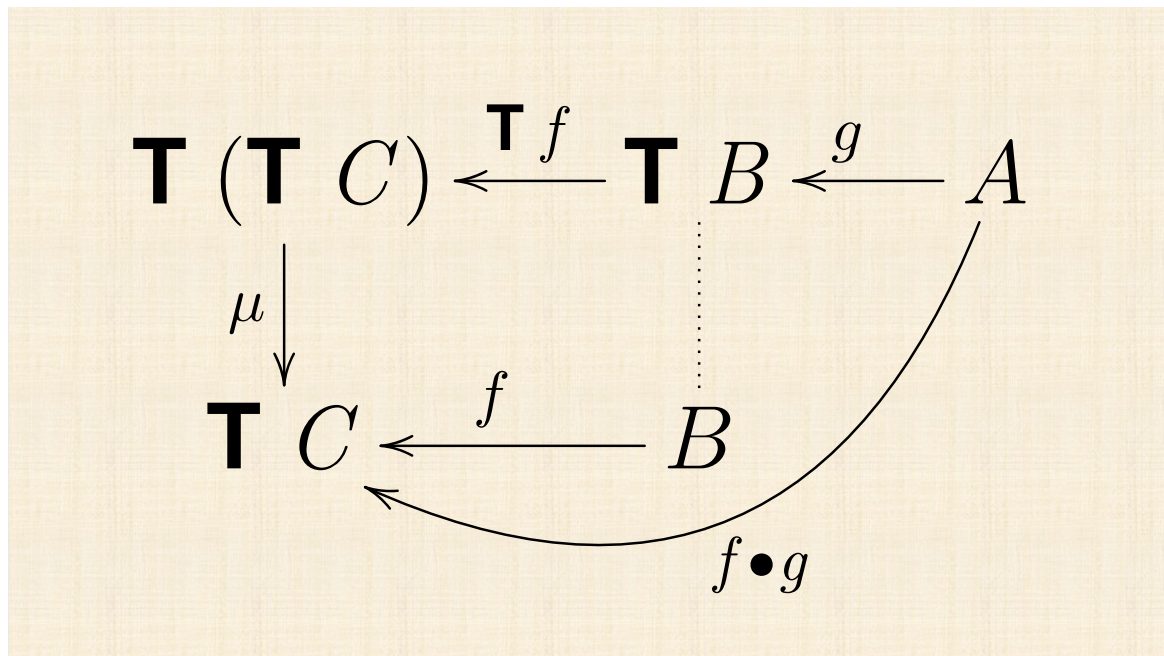
Monad = Functor + unit + multiplication

MONAD



= {
pointers
exceptions
pairs
distributions
I/O operations
...}

Monadic composition



Monadic composition

$$\begin{array}{ccc} T (T C) & \xleftarrow{T f} & T \\ \mu \downarrow & & \\ T & & \end{array}$$

$f \bullet g = \mu \bullet T f \bullet g$

$f \bullet g$

Heinrich Kleisli

From Wikipedia, the free encyclopedia

Heinrich Kleisli (/ˈklaɪsli/; October 19, 1930 – April 5, 2011) was a [Swiss mathematician](#). He is the namesake of several constructions in [category theory](#), including the [Kleisli category](#) and [Kleisli triples](#). He is also the namesake of the [Kleisli Query System](#), a tool for integration of heterogeneous databases developed at the [University of Pennsylvania](#).

Kleisli earned his Ph.D. at [ETH Zurich](#) in 1960, having been supervised by [Benno Eckmann](#) and [Ernst Specker](#). His dissertation was on [homotopy](#) and [abelian categories](#). He served as an associate professor at the [University of Ottawa](#) before relocating to the [University of Fribourg](#) in 1966. He became a full professor at Fribourg in 1967.



Heinrich Kleisli in 1987

Monad – natural properties

$$\begin{array}{ccccc} X & \xrightarrow{u} & \mathbf{T} X & \xleftarrow{\mu} & \mathbf{T} (\mathbf{T} X) \\ f \downarrow & & \mathbf{T} f \downarrow & & \downarrow \mathbf{T} (\mathbf{T} f) \\ Y & \xrightarrow{u} & \mathbf{T} Y & \xleftarrow{\mu} & \mathbf{T} (\mathbf{T} Y) \end{array}$$

$$\mathbf{T} f \cdot u = u \cdot f$$

$$\mathbf{T} f \cdot \mu = \mu \cdot \mathbf{T}^2 f$$

Monad – multiplication...

$$\begin{array}{ccc} \mathbf{T}^2 A & & \\ \mu \downarrow & & \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* unit


$$\begin{array}{c} \mathbf{T} X \xleftarrow{u} X \\ \text{where } X = \mathbf{T} A \\ \\ \mathbf{T}^2 A \xleftarrow{u} \mathbf{T} A \\ \downarrow \mu \\ \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* unit

$$\begin{array}{ccc} \mathbf{T}^2 A & \xleftarrow{u} & \mathbf{T} A \\ \mu \downarrow & & \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* unit

$$\begin{array}{ccc} \mathbf{T}^2 A & \xleftarrow{u} & \mathbf{T} A \\ \mu \downarrow & & \downarrow \mathbf{T} u \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* unit

A commutative diagram illustrating the relationship between multiplication (μ) and unit (u) in a monad. The diagram is set against a light beige textured background. It features four nodes arranged in a square: $T^2 A$ at the top-left, $T A$ at the top-right, $T A$ at the bottom-left, and $T^2 A$ at the bottom-right. The top horizontal arrow points from $T A$ to $T^2 A$ and is labeled u . The bottom horizontal arrow points from $T^2 A$ to $T A$ and is labeled μ . The left vertical arrow points from $T^2 A$ down to $T A$ and is labeled μ . The right vertical arrow points from $T A$ down to $T^2 A$ and is labeled $T u$. A diagonal arrow points from the top-right node ($T A$) to the bottom-left node ($T A$) and is labeled id .

$$\begin{array}{ccc} T^2 A & \xleftarrow{u} & T A \\ \mu \downarrow & \swarrow id & \downarrow T u \\ T A & \xleftarrow{\mu} & T^2 A \end{array}$$

Monad – multiplication *versus* unit

$$\begin{array}{ccc} T^2 A & \xleftarrow{u} & T A \\ \mu \downarrow & & \uparrow \\ T A & & T^2 A \end{array}$$

$\mu \cdot u = id = \mu \cdot T u$

Monad – multiplication *versus* multiplication

$$\begin{array}{ccc} \mathbf{T}^2 A & & \\ \mu \downarrow & & \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* multiplication


$$\begin{array}{c} \mathbf{T} X \xleftarrow{\mu} \mathbf{T}^2 X \\ \text{where } X = \mathbf{T} A \\ \\ \mathbf{T}^2 A \xleftarrow{\mu} \mathbf{T}^3 A \\ \downarrow \mu \\ \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* multiplication

$$\begin{array}{ccc} \mathbf{T}^2 A & \xleftarrow{\mu} & \mathbf{T}^3 A \\ \mu \downarrow & & \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* multiplication

$$\begin{array}{ccc} \mathbf{T}^2 A & \xleftarrow{\mu} & \mathbf{T}^3 A \\ \mu \downarrow & & \downarrow \mathbf{T} \mu \\ \mathbf{T} A & \xleftarrow{\mu} & \mathbf{T}^2 A \end{array}$$

Monad – multiplication *versus* multiplication

$$\begin{array}{c} \mathbf{T}^2 A \\ \mu \downarrow \end{array} \xleftarrow{\mu} \mathbf{T} A$$
$$\mu \cdot \mu = \mu \cdot \mathbf{T} \mu$$

Monad – laws of unit and multiplication

$$\mu \cdot u = id = \mu \cdot \mathbf{T} u$$

$$\mu \cdot \mu = \mu \cdot \mathbf{T} \mu$$

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

Monad – unit of composition

$$\begin{aligned} & f \bullet u = f = u \bullet f \\ \equiv & \quad \{ \text{definition of } f \bullet g, \text{ twice} \} \\ & \mu \cdot \mathbf{T} f \cdot u = f = \mu \cdot \mathbf{T} u \cdot f \\ \equiv & \quad \{ \text{natural-}u \text{ and } \mu \cdot \mathbf{T} u = id \} \\ & \mu \cdot u \cdot f = f = id \cdot f \\ \equiv & \quad \{ \mu \cdot u = id \} \\ & f = f \end{aligned}$$

$$\begin{aligned} \mathbf{T} f \cdot u &= u \cdot f \\ \mathbf{T} f \cdot \mu &= \mu \cdot \mathbf{T}^2 f \end{aligned}$$

$$\mu \cdot u = id = \mu \cdot \mathbf{T} u$$

Monad – unit of composition

Multiplicação	$\mu \cdot \mu = \mu \cdot \top \mu$	(62)
----------------------	--------------------------------------	------

Unidade	$\mu \cdot u = \mu \cdot \top u = id$	(63)
----------------	---------------------------------------	------

Natural-u	$u \cdot f = \top f \cdot u$	(64)
-------------------------------	------------------------------	------

Natural-μ	$\mu \cdot \top (\top f) = \top f \cdot \mu$	(65)
---------------------------------	--	------

Monad – laws

Multiplicação	$\mu \cdot \mu = \mu \cdot \top \mu$	(62)
----------------------	--------------------------------------	------

Unidade	$\mu \cdot u = \mu \cdot \top u = id$	(63)
----------------	---------------------------------------	------

Natural-u	$u \cdot f = \top f \cdot u$	(64)
-------------------------------	------------------------------	------

Natural-μ	$\mu \cdot \top (\top f) = \top f \cdot \mu$	(65)
---------------------------------	--	------



Composição monádica	$f \bullet g = \mu \cdot \top f \cdot g$	(66)
----------------------------	--	------

Associatividade-$\bullet$	$f \bullet (g \bullet h) = (f \bullet g) \bullet h$	(67)
---	---	------

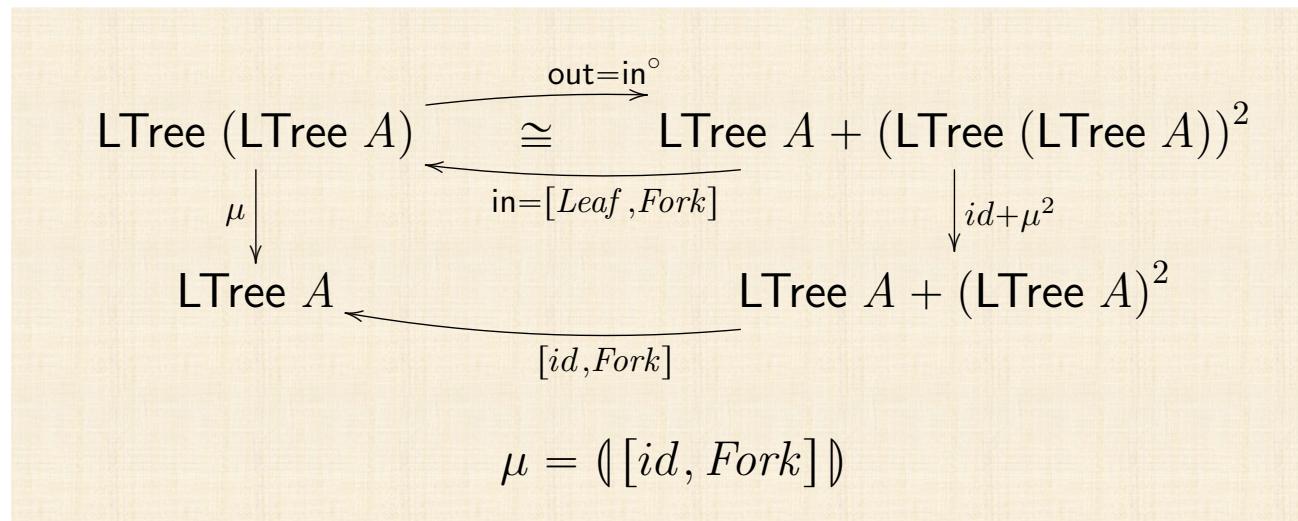
Identidade-$\bullet$	$u \bullet f = f = f \bullet u$	(68)
--	---------------------------------	------

Associatividade-$\bullet/\cdot$	$(f \bullet g) \cdot h = f \bullet (g \cdot h)$	(69)
---	---	------

Associatividade-$\cdot/\bullet$	$(f \cdot g) \bullet h = f \bullet (\top g \cdot h)$	(70)
---	--	------

μ versus $\bullet$	$id \bullet id = \mu$	(71)
---	-----------------------	------

LTree monad



```
data LTree a = Leaf a | Fork (LTree a, LTree a)
```

```
mu :: LTree (LTree a) -> LTree a  
mu = cataLTree (either id Fork)
```

LTree monad

$$X \xrightarrow{\text{Leaf}} \text{LTree } X \xleftarrow{([id, Fork])} \text{LTree}^2 X$$

$$\mu \cdot u = id = \mu \cdot \mathbf{T} u$$

$$\mu \cdot \mu = \mu \cdot \mathbf{T} \mu$$

```
data LTree a = Leaf a | Fork (LTree a, LTree a)
```

```
mu  :: LTree (LTree a) -> LTree a  
mu  = cataLTree (either id Fork)
```

LTree monad

$$\begin{aligned} & \mu \cdot \text{LTree } \text{Leaf} = \text{id} \\ \equiv & \quad \{ \text{definition of } \mu \} \\ & (\llbracket \text{id}, \text{Fork} \rrbracket) \cdot \text{LTree } \text{Leaf} = \text{id} \\ \equiv & \quad \{ \text{cata-absorption} \} \\ & (\llbracket \text{id}, \text{Fork} \rrbracket \cdot (\text{Leaf} + \text{id})) = \text{id} \\ \equiv & \quad \{ \text{+absorption} \} \\ & (\llbracket \text{Leaf}, \text{Fork} \rrbracket) = \text{id} \\ \equiv & \quad \{ \text{cata-reflection} \} \\ & \text{true} \end{aligned}$$

$$u = \text{Leaf}$$

$$\mu \cdot u = \text{id} = \mu \cdot \mathbf{T} u$$

$$X \xrightarrow{\text{Leaf}} \text{LTree } X \xleftarrow{\llbracket \text{id}, \text{Fork} \rrbracket} \text{LTree}^2 X$$

```
data LTree a = Leaf a | Fork (LTree a, LTree a)
```

```
mu  :: LTree (LTree a) -> LTree a
mu  = cataLTree (either id Fork)
```

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$

$$f \bullet u = f$$

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$

$$f \bullet id = ?$$

$$f \bullet u = f$$

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$

$$f \bullet id = ?$$

$$f \bullet u = f$$

A commutative diagram illustrating the monad binding property. The diagram consists of three nodes arranged in a triangle. The top-left node is $\mathbf{T}(\mathbf{T} C)$, the top-right node is $\mathbf{T} B$, and the bottom node is $\mathbf{T} C$. Arrows connect these nodes: a horizontal arrow from $\mathbf{T}(\mathbf{T} C)$ to $\mathbf{T} B$ labeled $\mathbf{T} f$; a horizontal arrow from $\mathbf{T} B$ to $\mathbf{T} C$ labeled f ; a vertical arrow from $\mathbf{T}(\mathbf{T} C)$ down to $\mathbf{T} C$ labeled μ ; a horizontal arrow from $\mathbf{T} B$ to $\mathbf{T} B$ labeled id ; and a curved arrow from $\mathbf{T} B$ down to $\mathbf{T} C$ labeled $f \bullet id$. A dotted vertical line connects $\mathbf{T} B$ to the node B in the middle of the diagram, which is positioned between the horizontal arrows $\mathbf{T} f$ and f .

$$\begin{array}{ccc} \mathbf{T}(\mathbf{T} C) & \xleftarrow{\mathbf{T} f} & \mathbf{T} B \xleftarrow{id} \mathbf{T} B \\ \mu \downarrow & & \vdots \\ \mathbf{T} C & \xleftarrow{f} & B \end{array}$$

$f \bullet id$

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$

$$f \bullet id = \mu \cdot \mathbf{T} f$$

$$f \bullet u = f$$

A commutative diagram illustrating the monad binding property. The diagram consists of two rows of objects and three types of arrows connecting them.

- Top Row:** $\mathbf{T}(\mathbf{T} C) \xleftarrow{\mathbf{T} f} \mathbf{T} B \xleftarrow{id} \mathbf{T} B$
- Bottom Row:** $\mathbf{T} C \xleftarrow{f} B$
- Vertical Arrows:**
 - A solid arrow labeled μ points from $\mathbf{T}(\mathbf{T} C)$ down to $\mathbf{T} C$.
 - A dotted arrow points from $\mathbf{T} B$ down to B .
- Curved Arrow:** A curved arrow labeled $f \bullet id$ points from $\mathbf{T} B$ in the top row down to B in the bottom row.

The diagram shows that the composition of the multiplication μ with the functor $\mathbf{T}$ applied to f (represented by the curved arrow $f \bullet id$) is equal to the function f itself (represented by the straight arrow f).

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$

$$(\gg f) = f \bullet id$$

A commutative diagram illustrating the relationship between monad multiplication and the bind operator. The diagram consists of four nodes arranged in a square:

- Top-left node: $\mathbf{T}^2 C$
- Top-right node: $\mathbf{T} B$
- Bottom-left node: $\mathbf{T} C$
- Bottom-right node: B

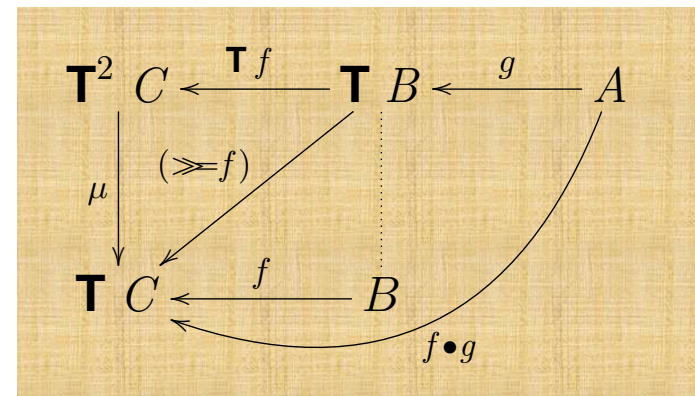
The arrows and their labels are:

- A horizontal arrow from $\mathbf{T}^2 C$ to $\mathbf{T} B$ labeled $\mathbf{T} f$.
- A vertical arrow from $\mathbf{T}^2 C$ down to $\mathbf{T} C$ labeled μ .
- A diagonal arrow from $\mathbf{T} B$ down to $\mathbf{T} C$ labeled $(\gg f)$.
- A horizontal arrow from B to $\mathbf{T} C$ labeled f .
- A vertical dotted arrow from $\mathbf{T} B$ down to B .

$$x \gg f \stackrel{\text{def}}{=} (\mu \cdot \mathbf{T} f)x$$

Monad “binding”

$$A \xrightarrow{u} \mathbf{T} A \xleftarrow{\mu} \mathbf{T}^2 A$$



$$(\gg f) = f \bullet id$$

$$(f \bullet g) x = (g x) \gg f$$

Monad (Haskell)

Minimal complete definition

`(>>=)`

Methods

```
(>>=) :: forall a b. m a -> (a -> m b) -> m b | infixl 1 |  
# Source
```

Sequentially compose two actions, passing any value produced by the first as an argument to the second.

```
(>>) :: forall a b. m a -> m b -> m b | infixl 1 | # Source
```

Sequentially compose two actions, discarding any value produced by the first, like sequencing operators (such as the semicolon) in imperative languages.

```
return :: a -> m a | # Source
```

```
-- (5) Monad -----  
  
instance Monad LTree where  
    return = Leaf  
    t >>= g = (mu . fmap g) t  
  
mu :: LTree (LTree a) -> LTree a  
mu = cataLTree (either id Fork)
```

$\text{return} = \iota$

Monad (Haskell)

Minimal complete definition

`(>>=)`

Methods

`(>>=) :: forall a b. m a -> (a -> m b) -> m b`

`infixl 1`

`# Source`

Sequentially compose two actions, passing any value produced by the first as an argument to the second.

$$(f \bullet g) x = (g x) \gg= f$$

`(>>) :: forall a b. m a -> m b -> m b`

`infixl 1`

`# Source`

Sequentially compose two actions, discarding any value produced by the first, like sequencing operators (such as the semicolon) in imperative languages.

$$id \bullet id = \mu$$

`return :: a -> m a`

`# Source`

$$\text{return} = u$$

```
-- (7) Monads: -----  
-- (7.1) Kleisli monadic composition -----  
  
infix 4 .!  
  
(.!) :: Monad a => (b -> a c) -> (d -> a b) -> d -> a c  
(f .! g) a = (g a) >>= f  
  
mult :: (Monad m) => m (m b) -> m b  
mult = (>>= id) -- also known as join
```

Monad (Haskell)

Minimal complete definition

`(>>=)`

Methods

```
(>>=) :: forall a b. m a -> (a -> m b) -> m b | infixl 1 |  
# Source
```

Sequentially compose two actions, passing any value produced by the first as an argument to the second.

```
(>>) :: forall a b. m a -> m b -> m b | infixl 1 | # Source
```

Sequentially compose two actions, discarding any value produced by the first, like sequencing operators (such as the semicolon) in imperative languages.

```
return :: a -> m a | # Source
```

```
-- (5) Monad -----  
  
instance Monad LTree where  
    return = Leaf  
    t >>= g = (mu . fmap g) t  
  
mu :: LTree (LTree a) -> LTree a  
mu = cataLTree (either id Fork)
```

$\text{return} = \iota$


```

1  ---- Using the pairing monad (cf. teachers versus classes) ----
2
3  data P a = P(a,a) deriving (Show,Eq,Ord)
4
5  instance Monad P where
6      x >>= f = (muP.fmap f) x
7      return a = P(a,a)
8
9  muP :: P (P a) -> P a
10 muP(P(P(a,b),P(c,d))) = P(a,d)
11
12 instance Functor P where
13     fmap f (P(a,b)) = P(f a, f b)
14
15 instance Applicative P where
16     pure = return
17     (<*>) = aap
18

```

Identity monad

$$\mathbf{T} X = X$$
$$\mathbf{T} f = f$$

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

$$X \xrightarrow{u} X \xleftarrow{\mu} X$$

$$u = id$$

$$\mu = id$$

$$f \bullet g = \mu \cdot \mathbf{T} f \cdot g = id \cdot f \cdot g = f \cdot g$$

Monads – summary

$$\mu \cdot u = id = \mu \cdot \mathbf{T} u$$

$$f \bullet g = \mu \cdot \mathbf{T} f \cdot g$$

$$\mu \cdot \mu = \mu \cdot \mathbf{T} \mu$$

$$(\gg f) = f \bullet id$$

MONADS: **do**-notation

$$(f \cdot g) \ a = f \ (g \ a) = \mathbf{let} \ b = g \ a \ \mathbf{in} \ f \ b$$

MONADS: **do**-notation

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$



$$(f \cdot g) \ a = f \ (g \ a) = \mathbf{let} \ b = g \ a \ \mathbf{in} \ f \ b$$

$$(f \bullet g) \ a = \mathbf{do} \ \{ b \leftarrow g \ a; f \ b \}$$



MONADS: **do**-notation

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

$$(f \cdot g) a = f (g a) = \mathbf{let} \ b = g \ a \ \mathbf{in} \ f \ b$$

$$(f \bullet g) a = \mathbf{do} \ \{ b \leftarrow g \ a; f \ b \}$$

MONADS: **do**-notation

$$(\gg=f) = f \bullet id$$

$$\begin{aligned} & x \gg f \\ = & \{ \text{definition of } (\gg=f) \} \\ & (f \bullet id) x \\ = & \{ \text{do-notation} \} \\ & \mathbf{do} \{ b \leftarrow x; f \ b \} \end{aligned}$$


$$(f \bullet g) a = \mathbf{do} \{ b \leftarrow g \ a; f \ b \}$$

MONADS: **do**-notation

$$(\gg f) = f \bullet id$$

$$\begin{aligned} x \gg f &= \{ \text{definition of } (\gg) \\ &= (f \bullet id) x \\ &= \text{do } \{ \dots \} \end{aligned}$$

$$x \gg f = \text{do } \{ b \leftarrow x; f b \}$$

$$(f \bullet g) a = \text{do } \{ b \leftarrow g a; f b \}$$

MONADS: **do**-notation

$$(\gg=f) = f \bullet id$$

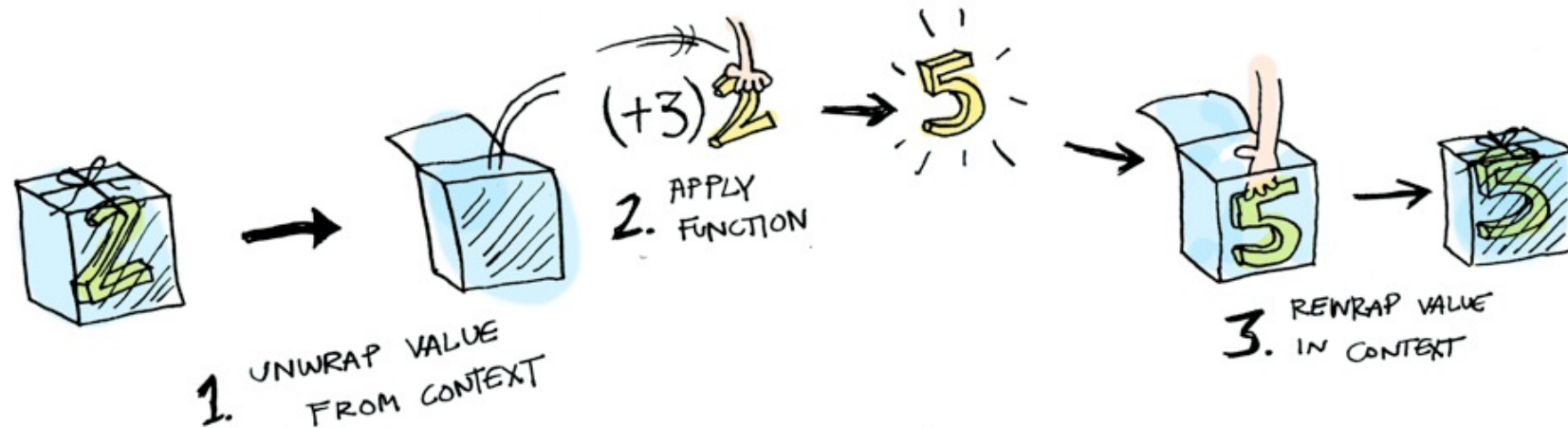
$$\begin{aligned} x &\gg f \\ &= \{ \text{definition of } (\gg) \\ &= (f \bullet id) x \\ &= \text{do } \{ \end{aligned}$$

$$x \gg f = \text{do } \{ b \leftarrow f x; f b \}$$

$$(f \bullet g) a = \text{do } \{ b \leftarrow g a; f b \}$$

MONADS: **do**-notation

$$x \gg f = \text{do } \{ b \leftarrow x; f \ b \}$$



(Credits: <http://shorturl.at/buNPX>)

MONADS: **do**-notation

Recall law

$$(g \cdot f) \bullet h = g \bullet (\mathbf{T} f \cdot h)$$

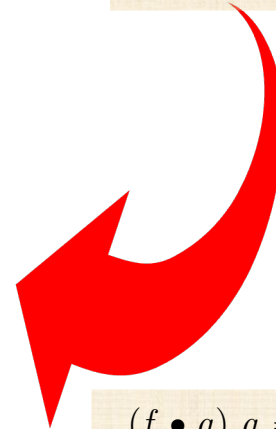
Particular case : $g, h := u, id$:

MONADS: **do**-notation

$$\begin{aligned} & (u \cdot f) \bullet id = u \bullet (\mathbf{T} f \cdot id) \\ \equiv & \quad \{ \text{natural-id; unit } u \} \\ & (u \cdot f) \bullet id = \mathbf{T} f \\ \equiv & \quad \{ \text{go pointwise on } x \} \\ & ((u \cdot f) \bullet id) x = \mathbf{T} f x \\ \equiv & \quad \{ \text{introduce do-notation} \} \\ & \mathbf{T} f x = \mathbf{do} \{ b \leftarrow x; \text{return } (f b) \} \end{aligned}$$

$$(g \cdot f) \bullet h = g \bullet (\mathbf{T} f \cdot h)$$

Particular case : $g, h := u, id$:



$$(f \bullet g) a = \mathbf{do} \{ b \leftarrow g a; f b \}$$

MONADS: **do**-notation

$$\begin{aligned}
 & (u \cdot f) \bullet id = u \bullet (\mathbf{T} f \cdot id) \\
 \equiv & \quad \{ \text{natural-id; unit } u \} \\
 & (u \cdot f) \bullet id = \mathbf{T} f \\
 \equiv & \quad \{ \text{go pointwise on } \} \\
 & ((u \cdot f) \bullet id) \\
 \equiv & \quad \{ \text{do notation} \} \\
 & \mathbf{T} f x = \text{do } \{ b \leftarrow x; \text{return } (f b) \}
 \end{aligned}$$

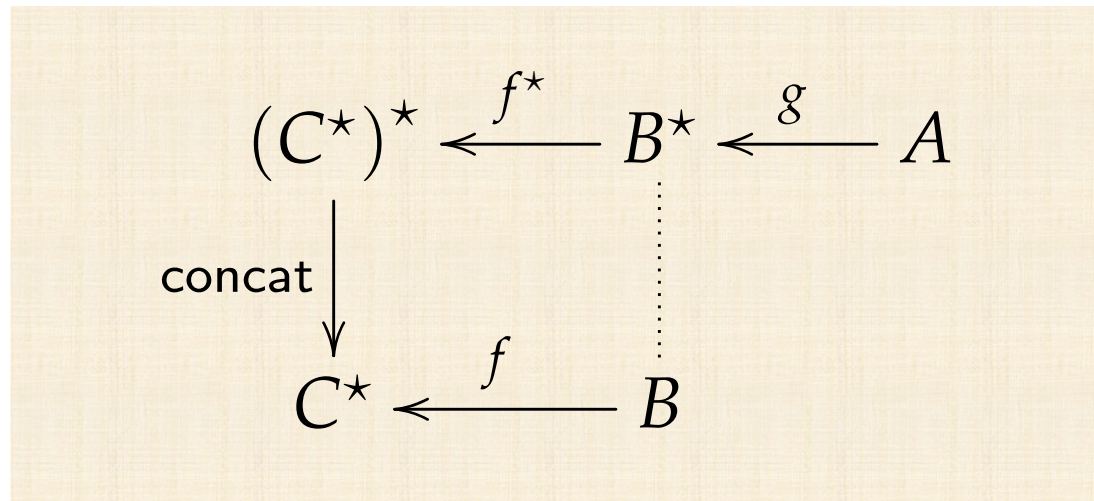
$$(g \cdot f) \bullet h = \mathbf{T} (g \cdot f) \cdot h = \mathbf{T} (g \cdot f \cdot h)$$

particular case : $g, h := u, id$:

$$(f \bullet g) a = \text{do } \{ b \leftarrow g a; f b \}$$

MONADS: list comprehensions

$$[e \mid a_1 \leftarrow x_1, \dots, a_n \leftarrow x_n] = \mathbf{do} \{ a_1 \leftarrow x_1; \dots; a_n \leftarrow x_n; \mathbf{return} \ e \}$$



Monad – more laws

$$(f \bullet g) \ a = \mathbf{do} \ \{ b \leftarrow g \ a; f \ b \} \quad (87)$$

$$x \gg= f \quad = \quad (\mu \cdot \top f)x \quad (88)$$

$$\mathbf{do} \ \{ x \leftarrow a; b \} \quad = \quad a \gg= (\lambda x \rightarrow b) \quad (89)$$

$$\mu \ x \quad = \quad x \gg= id \quad (90)$$

$$x \gg y \quad = \quad x \gg= \underline{y} \quad (91)$$

I/O monad : interfacing with the file system



I/O monad : interfacing with the file system

$$\begin{array}{c} \text{IO } \text{String} \xleftarrow{\text{readFile}} \text{FilePath} \\ \vdots \\ \text{IO } 1 \xleftarrow{\text{writeFile } o} \text{String} \end{array}$$

$$\begin{aligned} \text{copy } i \ o &= (\text{writeFile } o \bullet \text{readFile}) \ i \\ \equiv \quad &\{ \text{do-notation} \} \\ \text{copy } i \ o &= \mathbf{do} \ \{ s \leftarrow \text{readFile } i; \text{writeFile } o \ s \} \end{aligned}$$

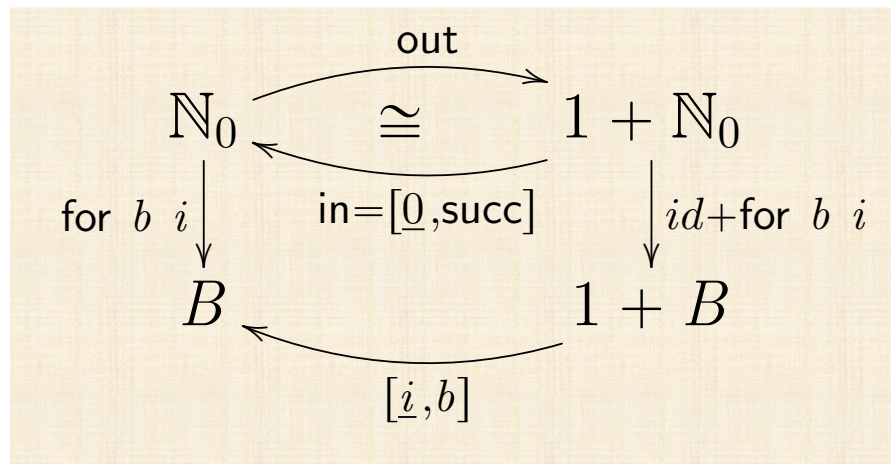


O monad (trivial) da identidade.



Monadic recursion

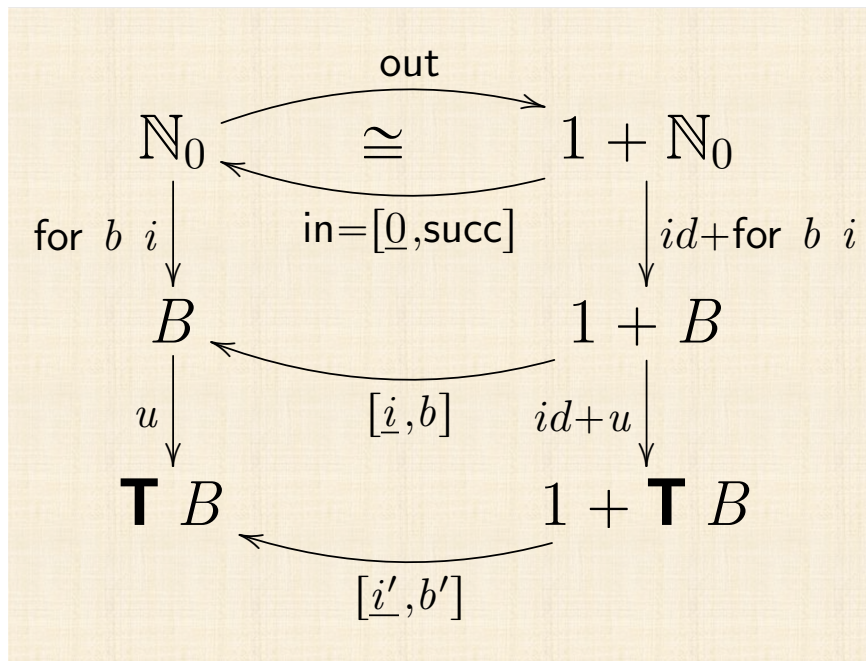
$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$



$$\text{for } b \ i = ([\underline{i}, b])$$

Monadic recursion

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$



$$\text{for } b \ i = ([i, b])$$

Monadic recursion

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

$$\begin{aligned} & u \cdot \text{for } b \ i = \text{for } b' \ i' \\ \equiv & \quad \{ \text{for } b \ i = \llbracket \underline{i}, b \rrbracket \} \\ & u \cdot \llbracket \underline{i}, b \rrbracket = \llbracket \underline{i'}, b' \rrbracket \\ \Leftarrow & \quad \{ \text{fusão-cata} \} \\ & u \cdot \llbracket \underline{i}, b \rrbracket = \llbracket \underline{i'}, b' \rrbracket \cdot (id + u) \\ \equiv & \quad \{ \text{coprodutos (fusão, absorção, eq)} \} \\ & \begin{cases} u \cdot \underline{i} = \underline{i'} \\ u \cdot b = b' \cdot u \end{cases} \end{aligned}$$

Monadic recursion

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

$$\begin{aligned} & u \cdot \text{for } b \ i = \text{for } b' \ i' \\ \equiv & \quad \{ \text{for } b \ i = ([\underline{i}, b]) \} \\ & u \cdot ([\underline{i}, b]) = ([\underline{i'}, b']) \\ \Leftarrow & \quad \{ \text{fus\~ao-cata} \} \\ & u \cdot [\underline{i}, b] = [\underline{i'}, b'] \cdot (id + u) \\ \equiv & \quad \{ \text{coprodutos (fus\~ao, absor\~cao, eq)} \} \\ & \begin{cases} u \cdot \underline{i} = \underline{i'} \\ u \cdot b = b' \cdot u \end{cases} \end{aligned}$$

$$\begin{aligned} \equiv & \quad \{ f \cdot \underline{x} = \underline{f x}; \mathbf{T} f \cdot u = u \cdot f \} \\ & \begin{cases} u \ i = i' \\ \mathbf{T} b \cdot u = b' \cdot u \end{cases} \\ \Leftarrow & \quad \{ \text{trivial} \} \\ & \begin{cases} i' = u \ i \\ b' = \mathbf{T} b \end{cases} \end{aligned}$$

$$\text{mfor } b \ i = ([\underline{u \ i}, \mathbf{T} b])$$

Monadic recursion

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

$$\text{mfor } b \ i = \llbracket \underline{u} \ i, \mathbf{T} \ b \rrbracket$$

$$\begin{aligned} \text{mfor } b \ i &= \llbracket \underline{u} \ i, \mathbf{T} \ b \rrbracket \\ &\equiv \{ \text{universal cata} \} \\ \text{mfor } b \ i \cdot [\underline{0}, \text{succ}] &= [\underline{u} \ i, \mathbf{T} \ b] \cdot (id + \text{mfor } b \ i) \\ &\equiv \{ \text{coprodutos (fusão, absorção, eq) ; variáveis} \} \\ &\quad \begin{cases} \text{mfor } b \ i \ 0 = u \ i \\ \text{mfor } b \ i \ (n + 1) = \mathbf{T} \ b \ (\text{mfor } b \ i \ n) \end{cases} \\ &\equiv \{ u = \text{return} ; \mathbf{T} \ f \ x = \mathbf{do} \{ a \leftarrow x ; \text{return} \ (f \ a) \} \} \\ &\quad \begin{cases} \text{mfor } b \ i \ 0 = \text{return } i \\ \text{mfor } b \ i \ (n + 1) = \mathbf{do} \{ x \leftarrow \text{mfor } b \ i \ n ; \text{return} \ (b \ x) \} \end{cases} \end{aligned}$$

Monadic recursion

$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

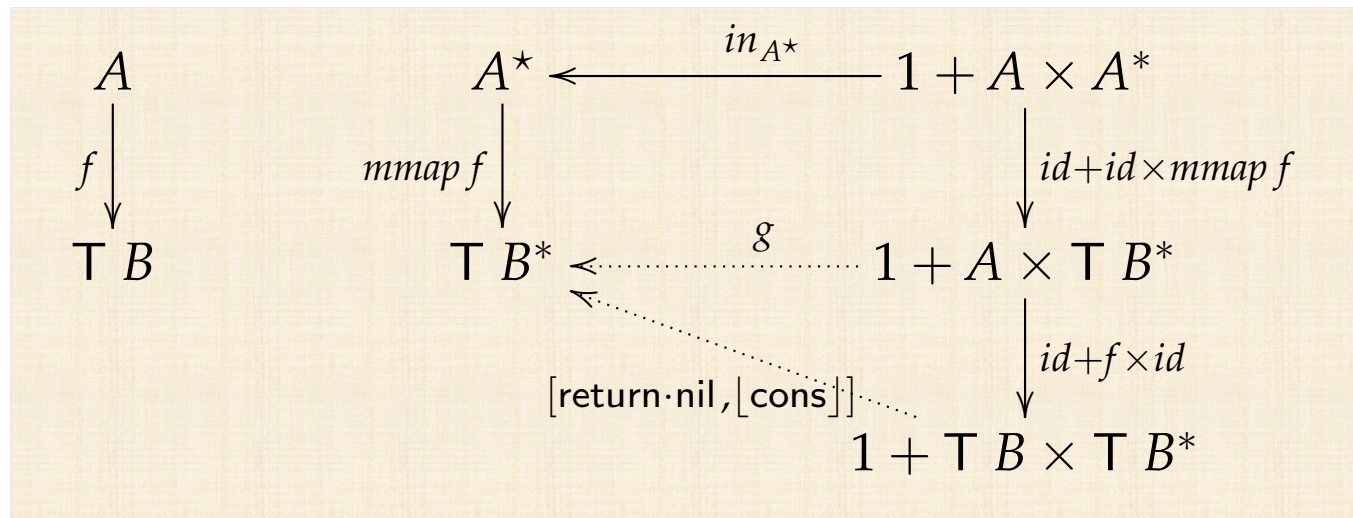
$$\begin{cases} mfor\ b\ i\ 0 = \text{return } i \\ mfor\ b\ i\ (n + 1) = \mathbf{do}\ \{x \leftarrow mfor\ b\ i\ n; \text{return } (b\ x)\} \end{cases}$$

Monadic **map** (mmap)

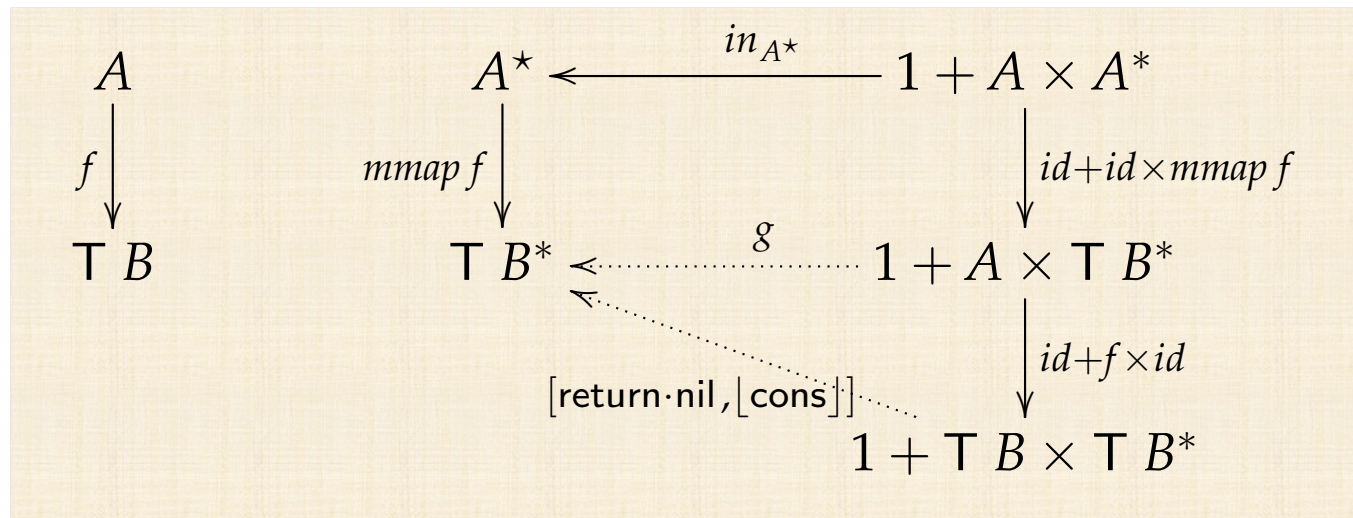
$$\begin{array}{ccccc}
 A & & A^* & \xleftarrow{\quad in_{A^*} \quad} & 1 + A \times A^* \\
 f \downarrow & & \downarrow mmap\ f & & \downarrow id + id \times mmap\ f \\
 \mathsf{T}\ B & & \mathsf{T}\ B^* & \xleftarrow{\quad g \quad} & 1 + A \times \mathsf{T}\ B^*
 \end{array}$$

$g?$

Monadic **map** (mmap)



Monadic **map** (mmap)



$[f]\ (x, y) = \mathbf{do}\ \{ a \leftarrow x; b \leftarrow y; \text{return}\ (f\ (a, b)) \}$

Recall...

$$\llbracket f \rrbracket (x, y) = \mathbf{do} \{ a \leftarrow x; b \leftarrow y; \text{return } (f(a, b)) \}$$

```
*Main> lift f (x,y) = do { a <- x ; b <- y ; return (f (a,b)) }  
*Main> d1 = uniform [1..6]  
*Main> d2 = uniform [1..6]  
*Main> lift add (d1, d2)  
7 16.7%  
6 13.9%  
8 13.9%  
5 11.1%  
9 11.1%  
4 8.3%  
10 8.3%  
3 5.6%  
11 5.6%  
2 2.8%  
12 2.8%
```



Monadic **map** (mmap)

$$mmap\ f = \llbracket [\text{return} \cdot \text{nil}, [\text{cons}] \cdot (f \times id)] \rrbracket$$

$$\begin{aligned} mmap &:: (Monad\ m) \Rightarrow (a \rightarrow m\ b) \rightarrow [a] \rightarrow m\ [b] \\ mmap\ f\ [] &= \text{return}\ [] \\ mmap\ f\ (h : t) &= \mathbf{do}\ \{ b \leftarrow f\ h; x \leftarrow mmap\ f\ t; \text{return}\ (b : x) \} \end{aligned}$$

Monadic **map** (mmap)

Getting the minimum of a list (if possible...)

$$mgetmin :: Ord\ a \Rightarrow [a] \rightarrow Maybe\ a$$

Get the list of all minima (where possible...)

```
mmap mgetmin [[1,2],[3]] = Just [1,3]
mmap mgetmin [[1,2],[]] = Nothing
```

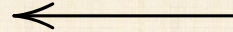
Monadic **map** (mmap)

Getting the minimum of a list (if possible...)

$$mgetmin :: Ord\ a \Rightarrow [a] \rightarrow Maybe\ a$$

```
mgetmin [] = Nothing  
mgetmin [a] = return a  
mgetmin (h : t) = do { x ← mgetmin t; return (min h x) }
```

MONADS

 X u  μ 

work input
standardized
guidance
interline
productivity
troubleshooting
established
estimation
giants
manpower
category
hardware
methodologies
potpourri
notion
day
project
programmer
staffs
signs
shortened
computer
expensive
large
industry
required
tools
interval
techniques
rained
iterative
management
promulgated

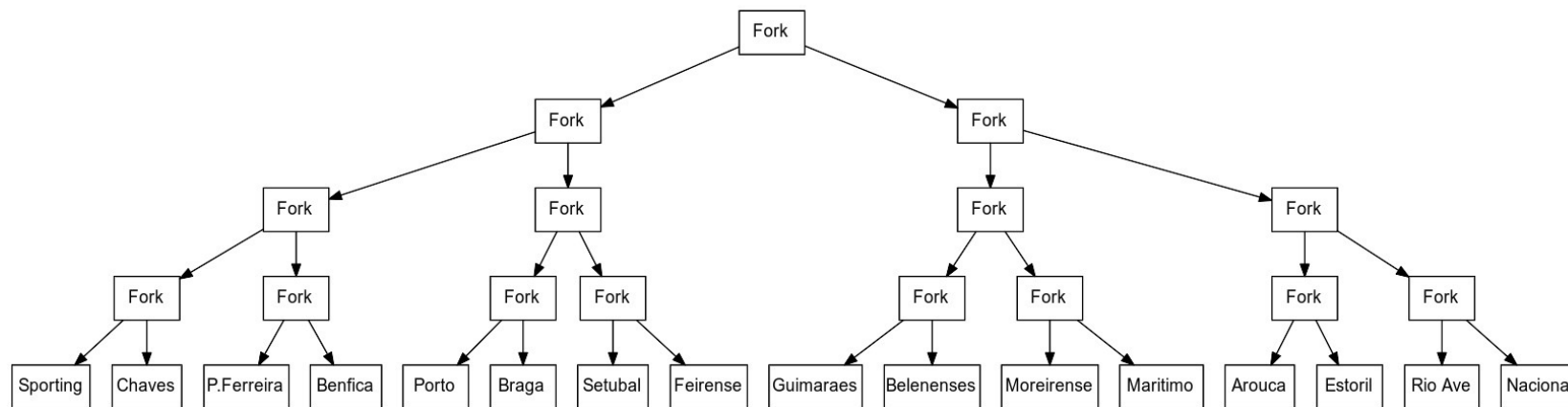
programming

productivity

Probabilistic monadic programming



Example – football league

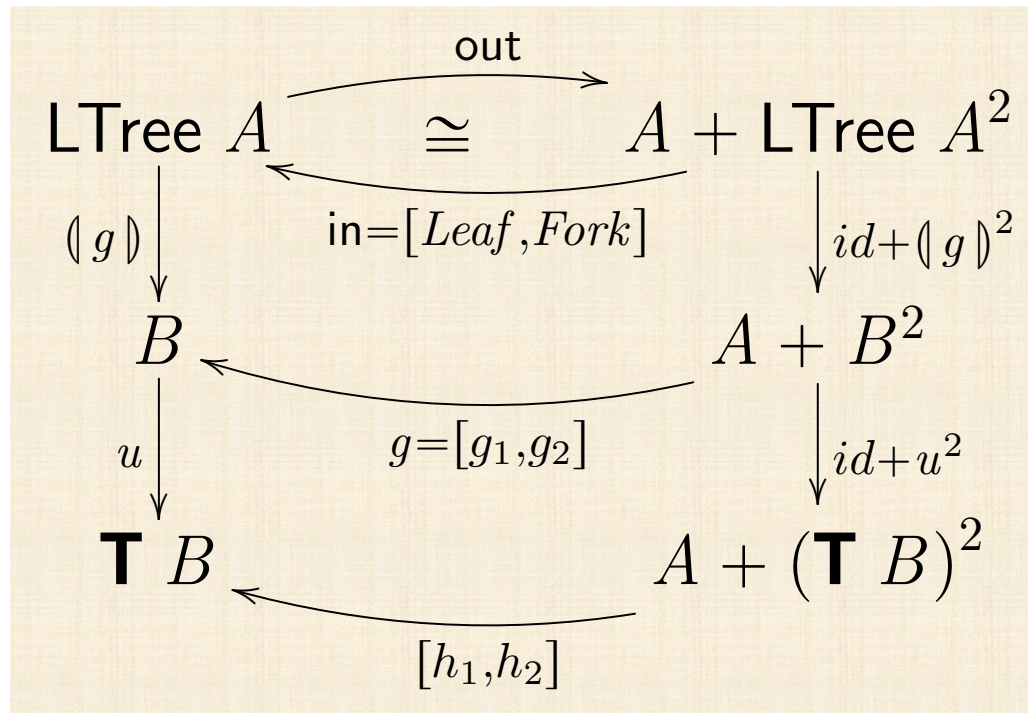


Arouca — 28.6%

Braga — 71.4%

etc

LTree ... catas with monads



$$\begin{cases} h_1 = u \cdot g_1 \\ h_2 = \mathbf{T} g_2 \cdot \delta \end{cases}$$

```

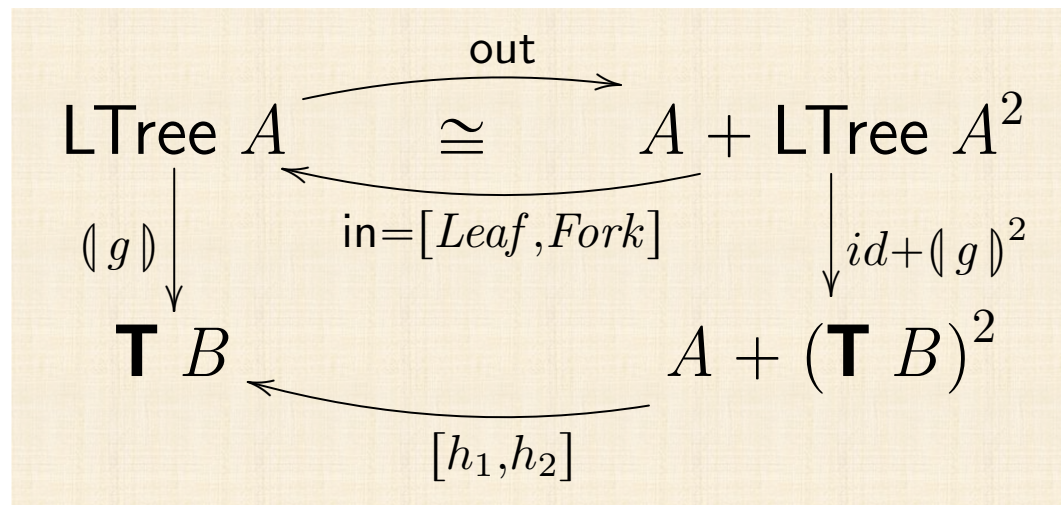
 $\delta(x, y) = \mathbf{do} \{$ 
   $a \leftarrow x;$ 
   $b \leftarrow y;$ 
   $\text{return } (a, b)$ 
 $\}$ 

```

LTree ... catas with monads

```
mcataLTtree g = k where  
  k (Leaf a) = return (g1 a)  
  k (Fork (x, y)) = do { a ← k x; b ← k y; return (g2 (a, b)) }  
  g1 = g · i1  
  g2 = g · i2
```

LTree ... monadic cats



$$f : B^2 \rightarrow \mathbf{T} B$$

Arouca **—** 28.6%
Braga **—** 71.4%

$$h_2 (x, y) = \mathbf{do} \{ a \leftarrow x; b \leftarrow y; f (a, b) \}$$

Example – football league

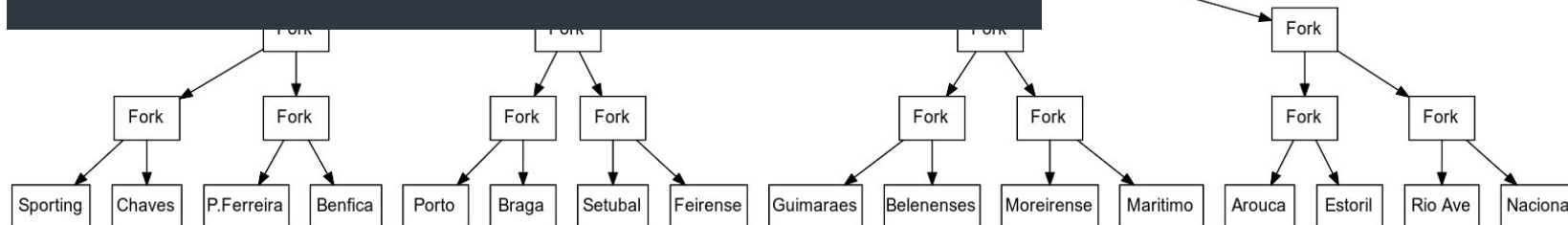


```
jogo :: (Equipa, Equipa) -> Dist Equipa
```

```
*Main> jogo ("Braga", "Arouca")
```

```
"Braga" 71.4%
```

```
"Arouca" 28.6%
```



Arouca **■** 28.6%

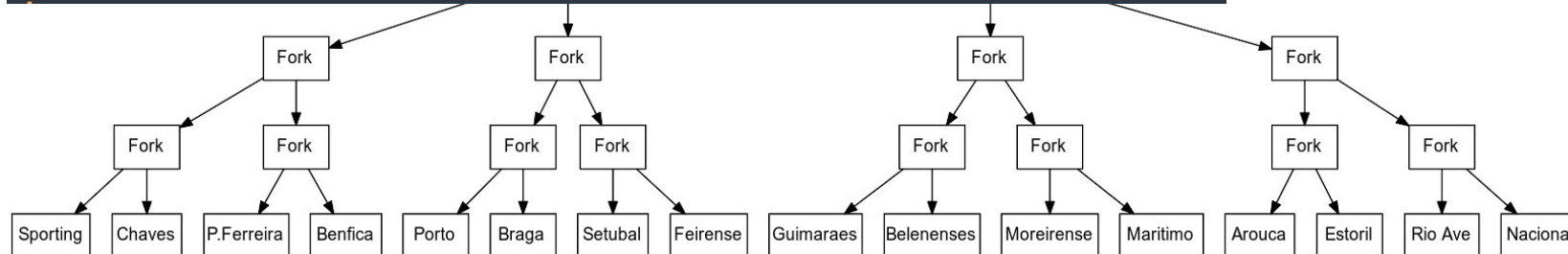
Braga **■** 71.4%

etc

Example – football league

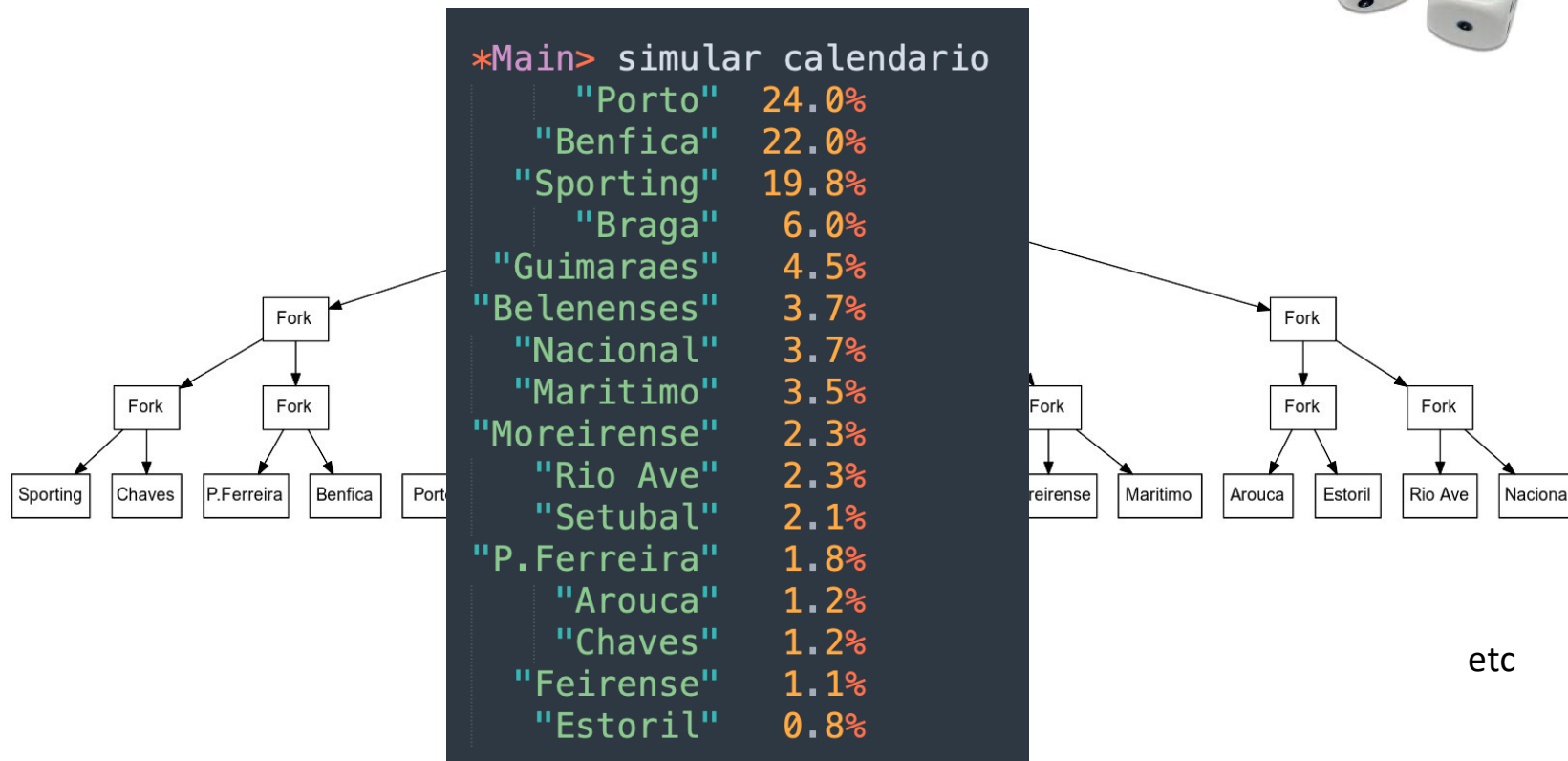


```
h2(d1,d2) = do { a <- d1; b <- d2; jogo(a,b) }  
simular = cataLTree (either return h2)
```



```
calendario = anaLTree lsplit equipas
```

Example – football league



Monad =
“racing”
functor

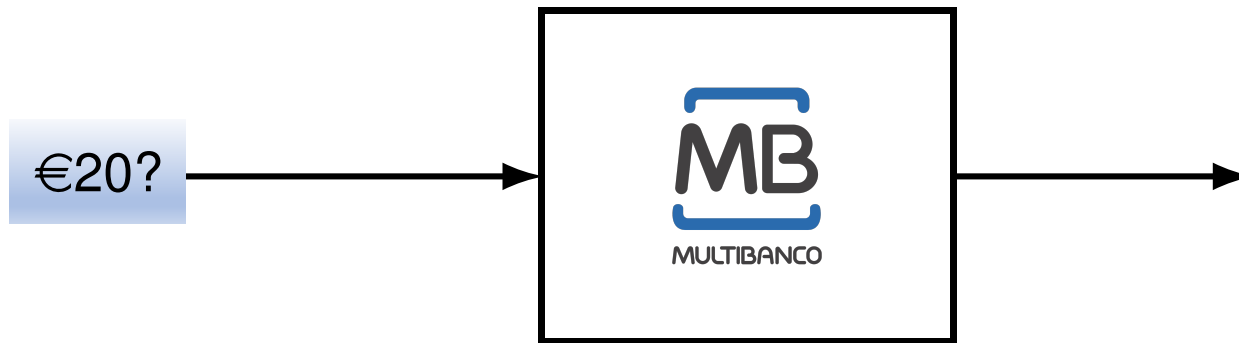


$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$

STATE MONAD (REACTIVE SYSTEMS)



REACTIVE SYSTEMS



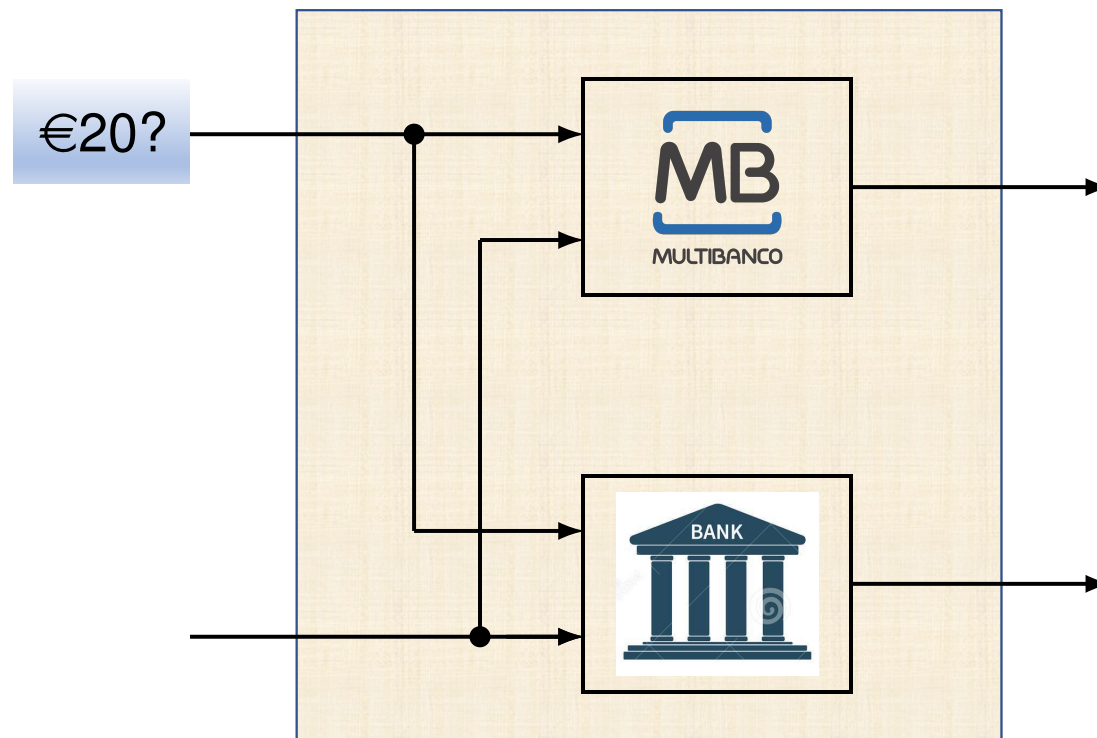
REACTIVE SYSTEMS



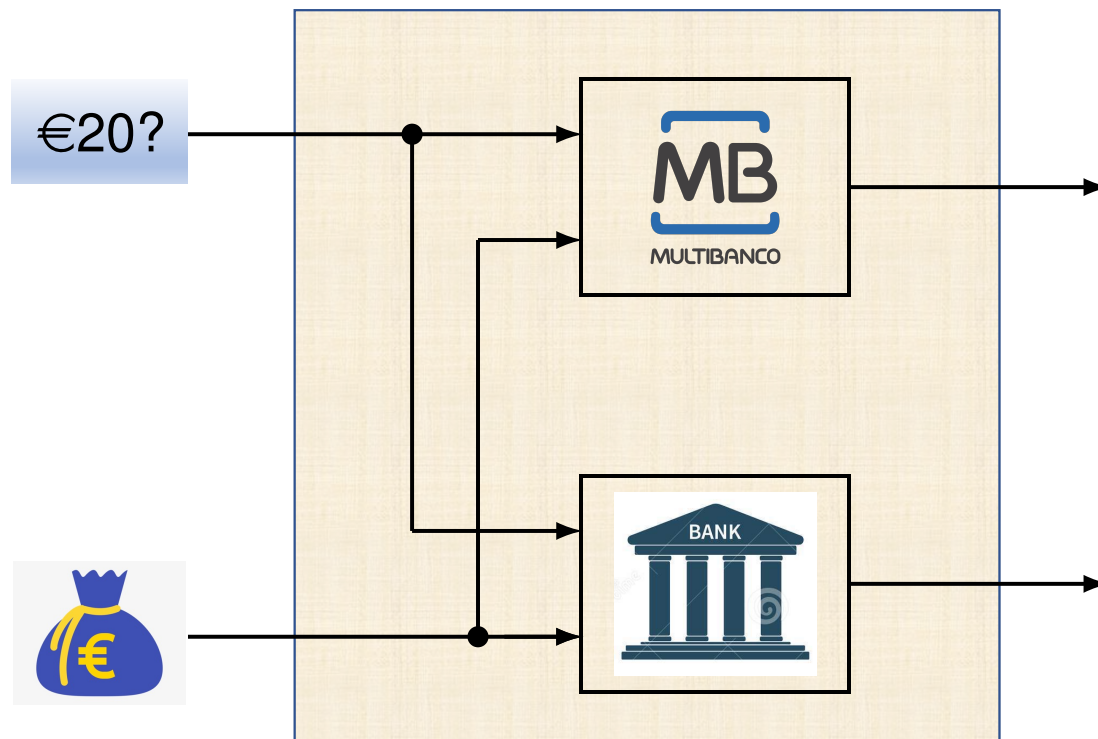
REACTIVE SYSTEMS



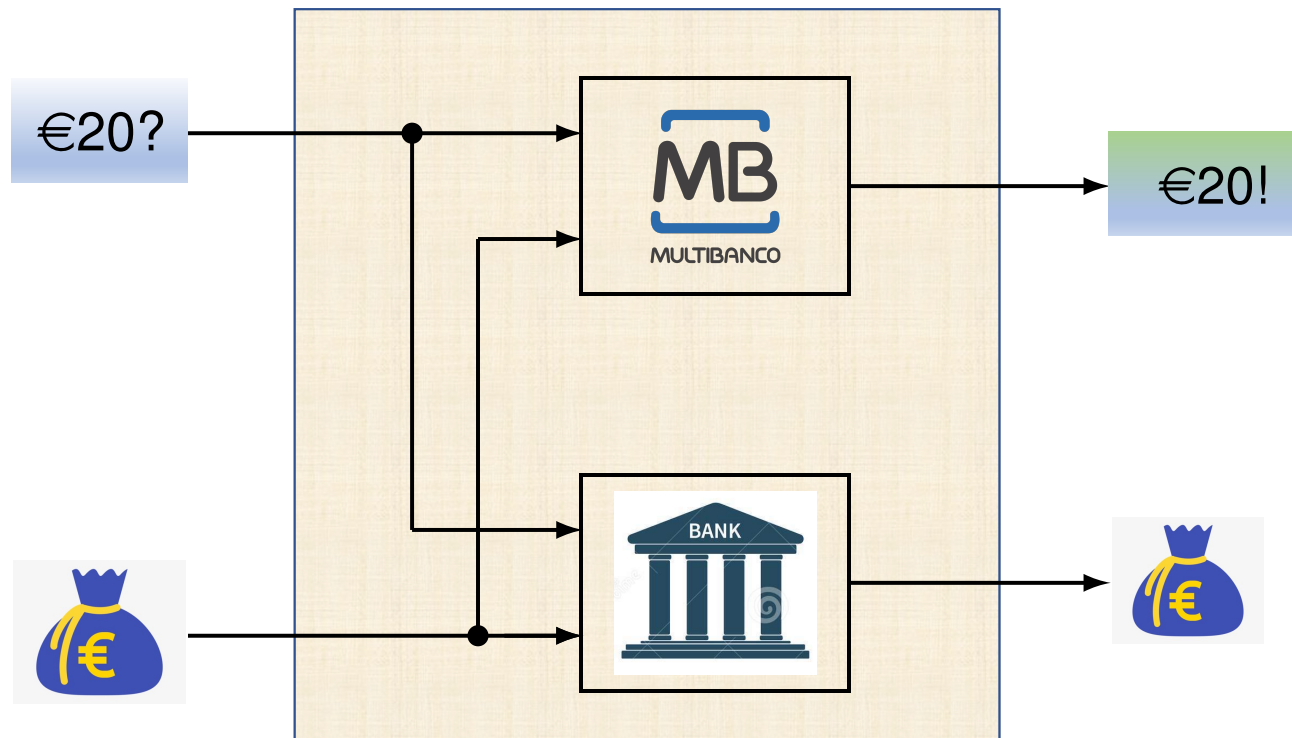
REACTIVE SYSTEMS



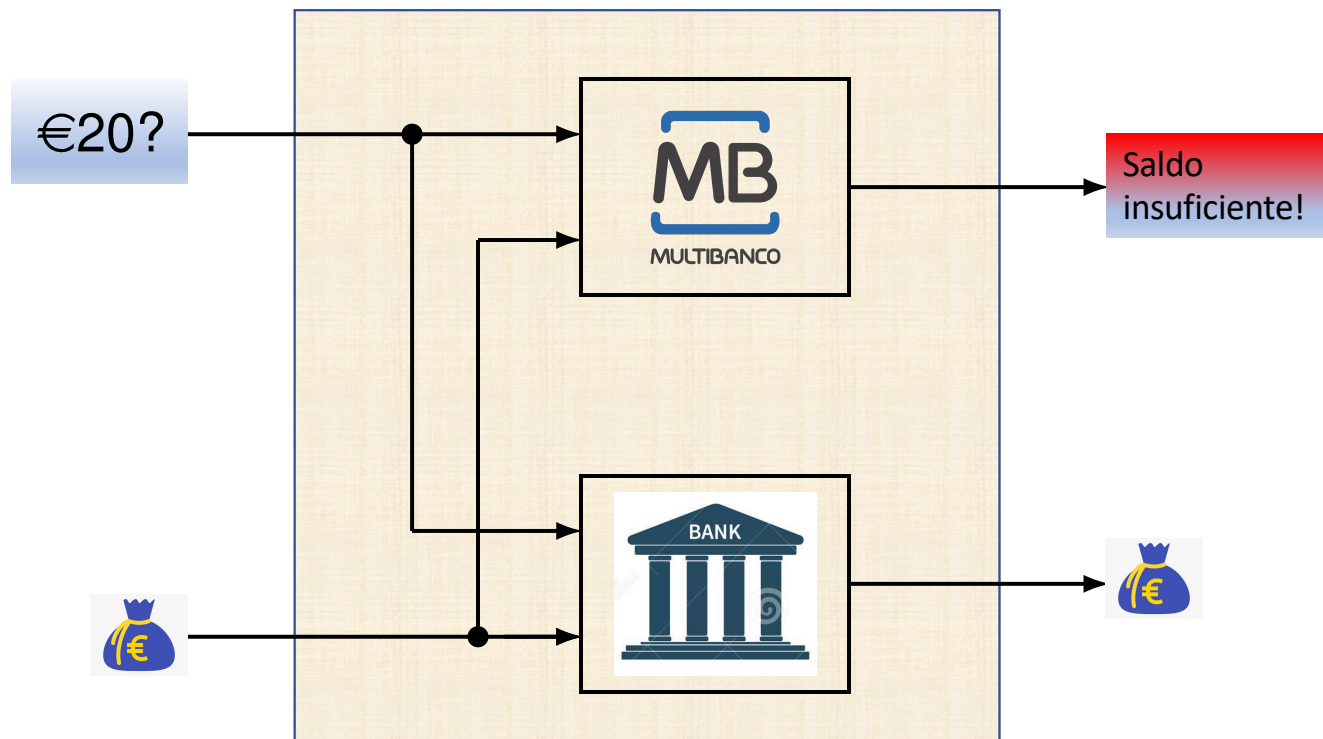
REACTIVE SYSTEMS



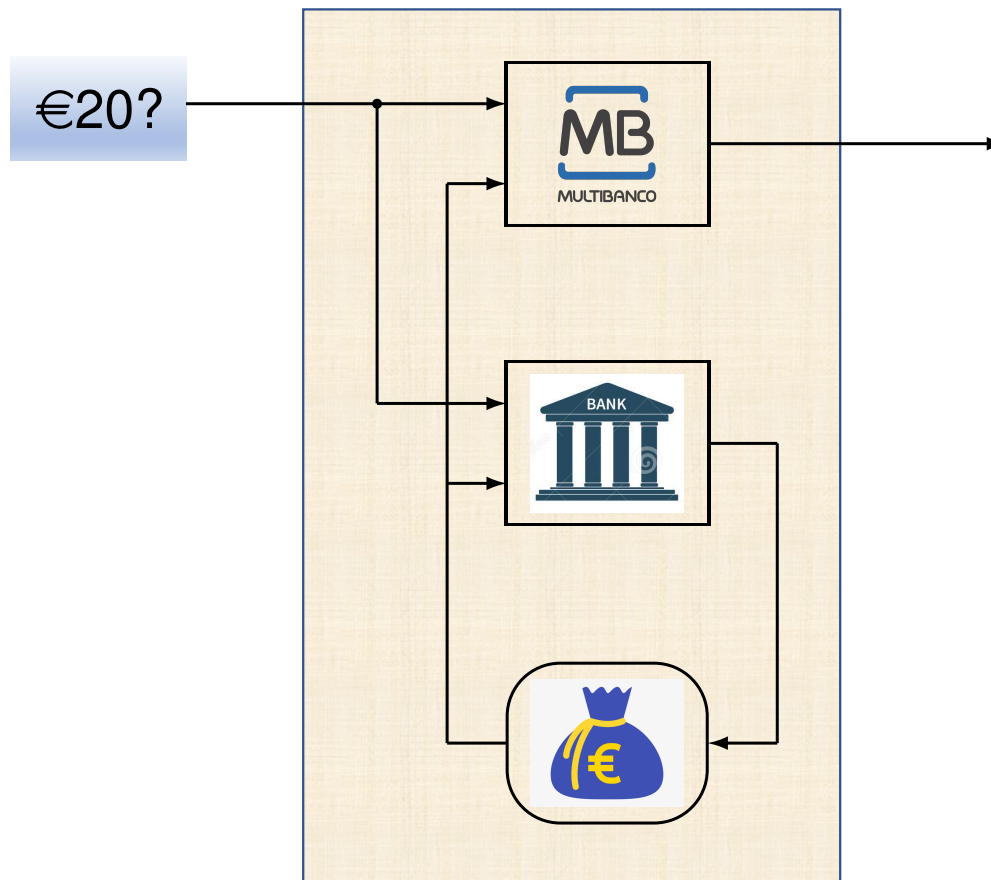
REACTIVE SYSTEMS



REACTIVE SYSTEMS



REACTIVE SYSTEMS

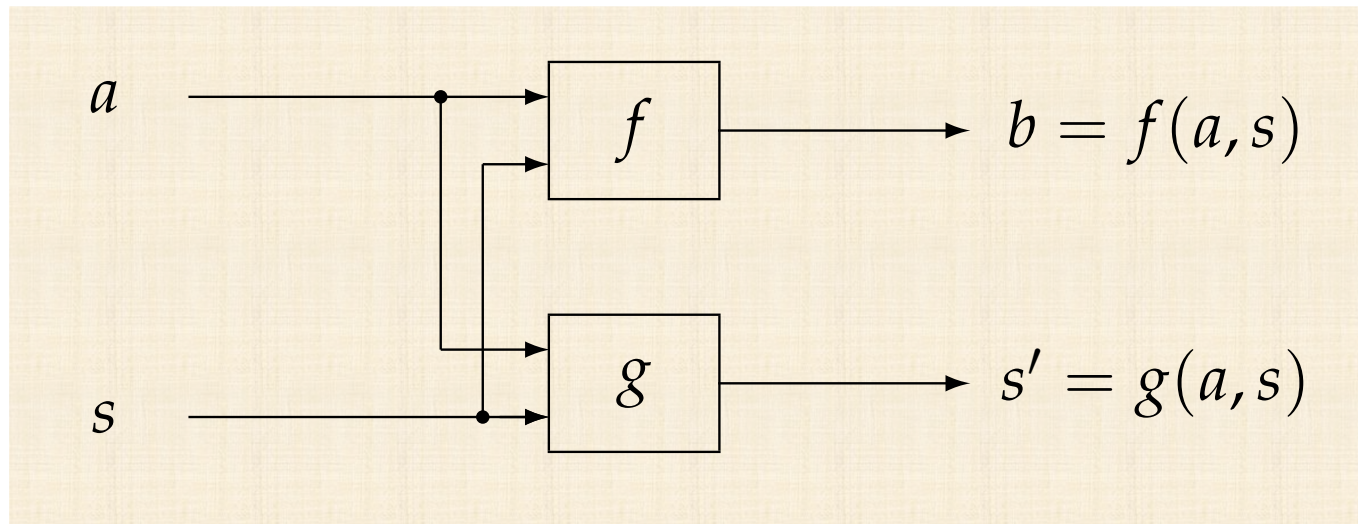


REACTIVE SYSTEMS

$$A \times S \xrightarrow{f} B$$

$$A \times S \xrightarrow{g} S$$

$$A \times S \xrightarrow{\langle f, g \rangle} B \times S$$

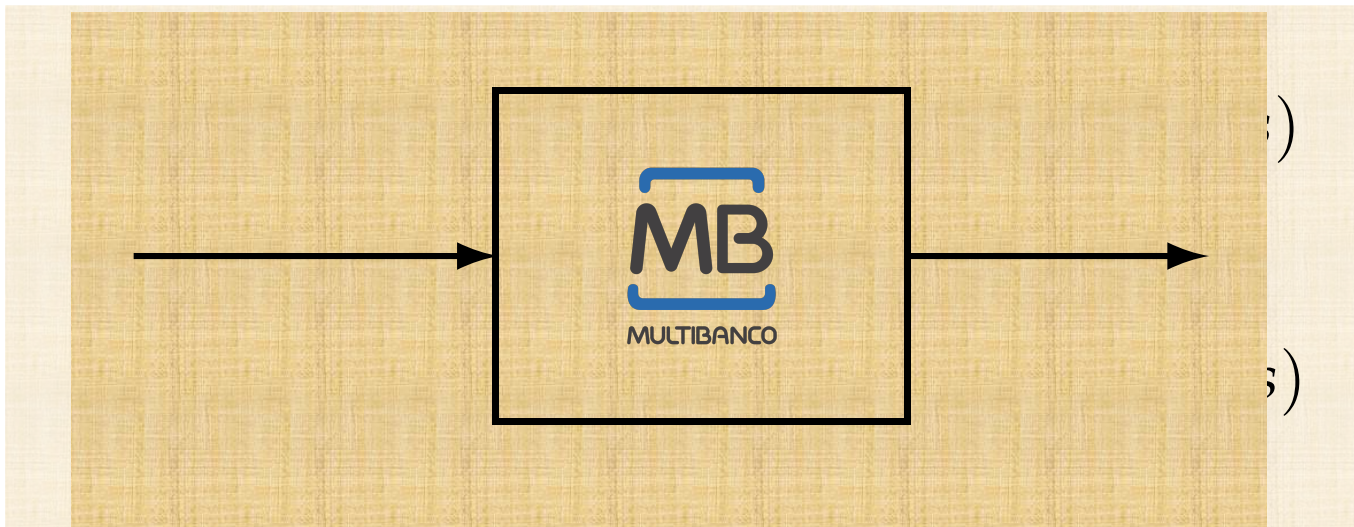


REACTIVE SYSTEMS

$$A \times S \xrightarrow{f} B$$

$$A \times S \xrightarrow{g} S$$

$$A \times S \xrightarrow{\langle f, g \rangle} B \times S$$



Cálculo de Programas T13