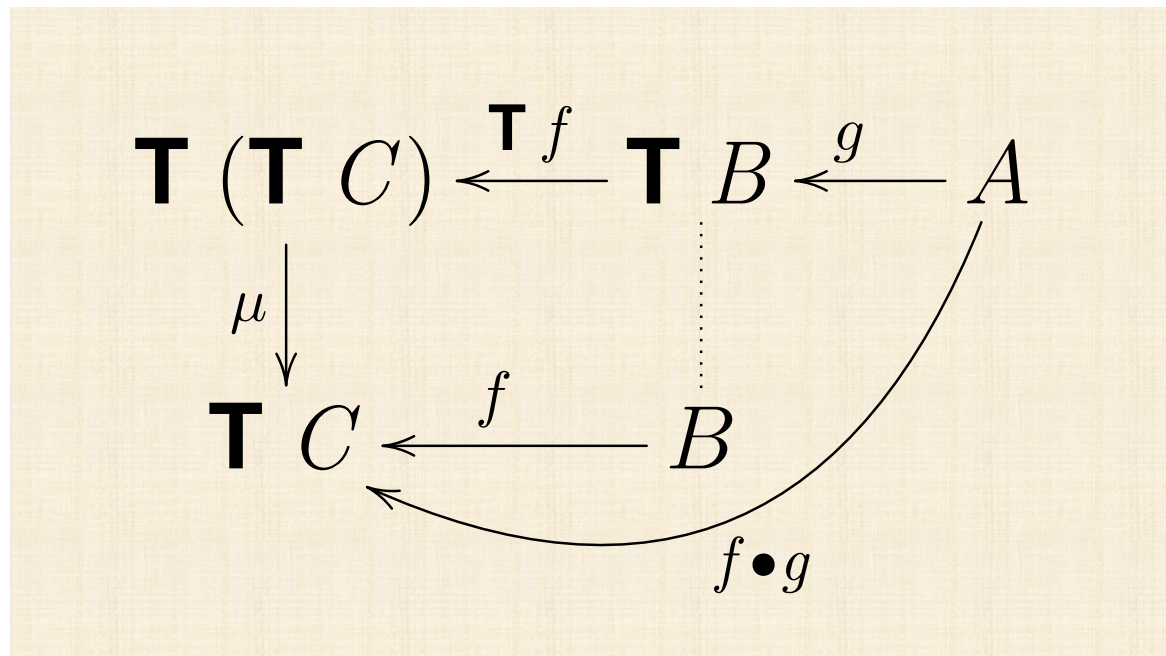


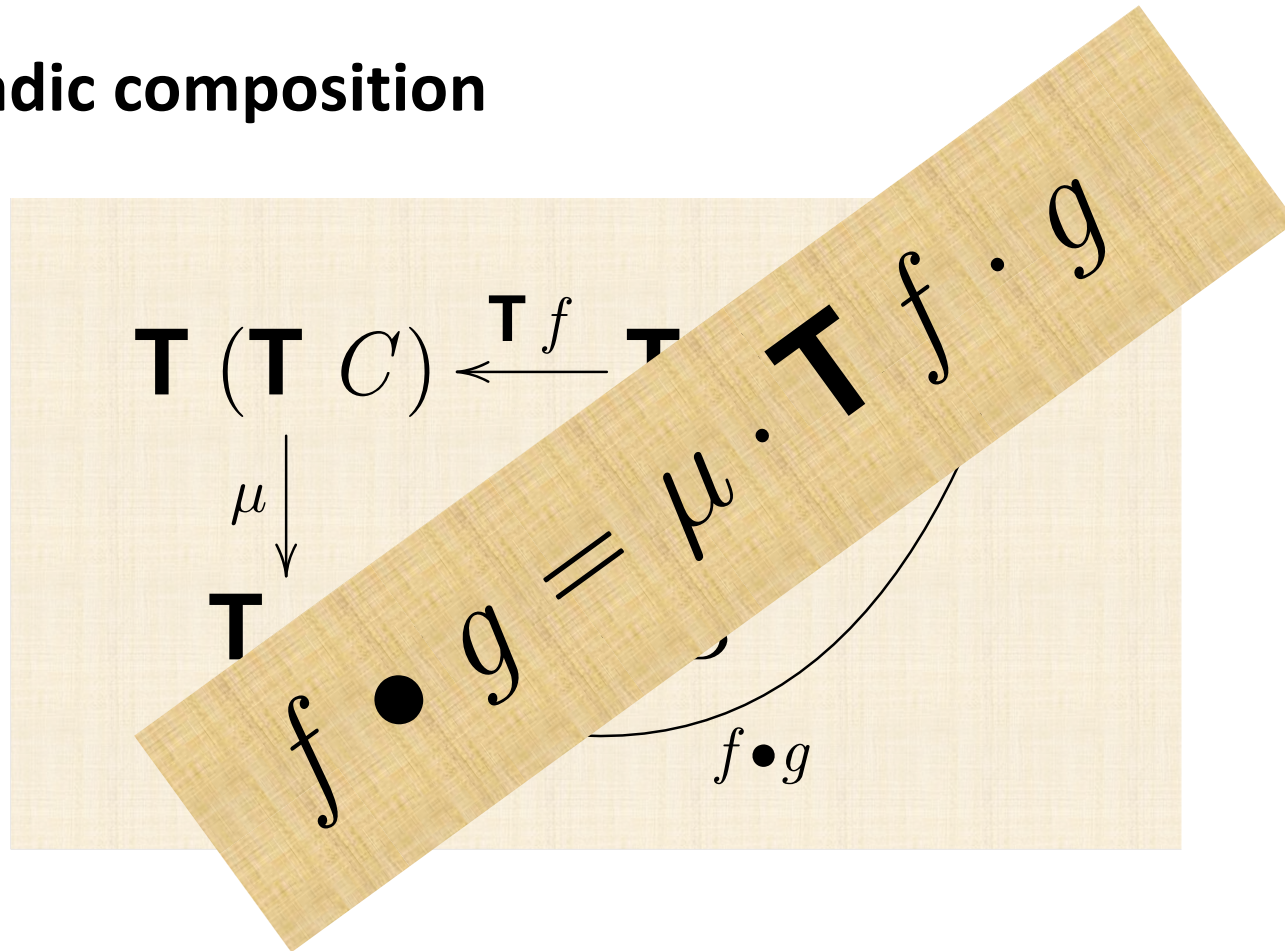
Cálculo de Programas

Aula T11

Monadic composition



Monadic composition



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 [Beno 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

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

Monad – multiplication *versus* unit

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

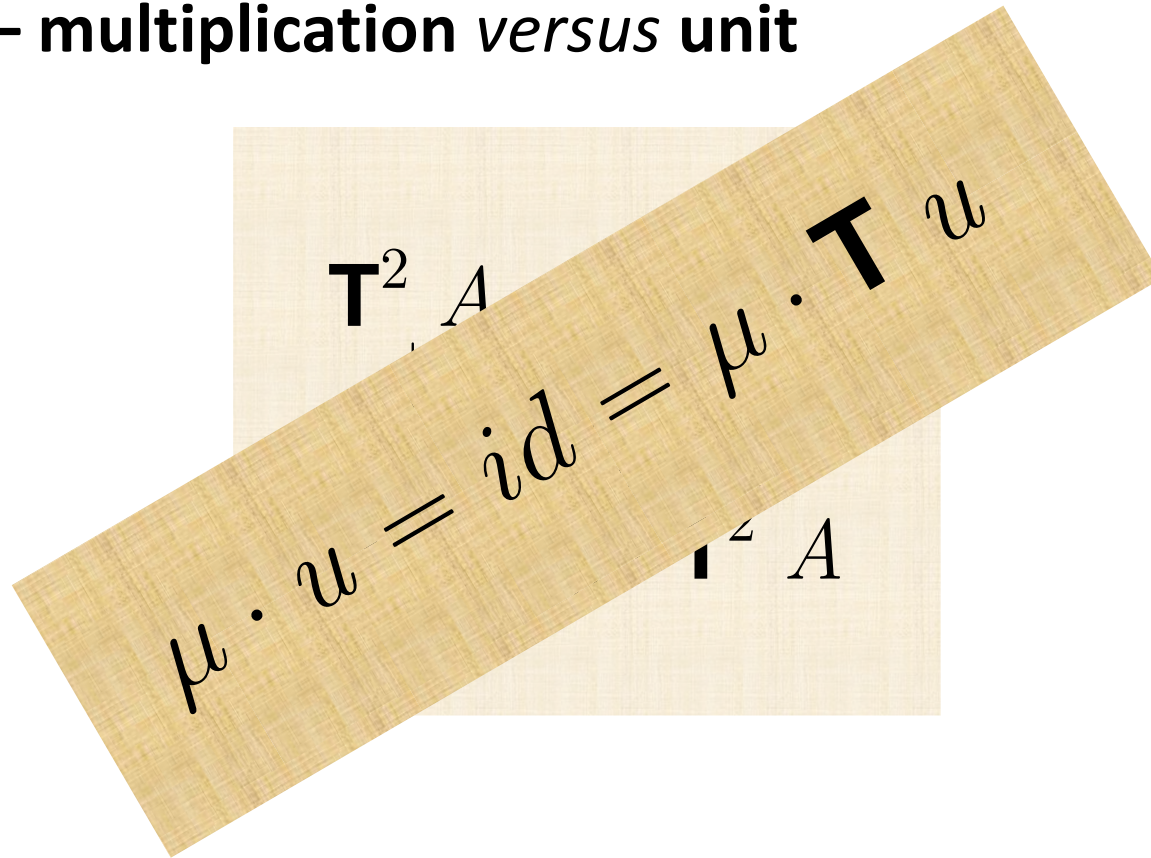
$\mathbf{T} X \xleftarrow{u} X$
where $X = \mathbf{T} A$



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


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

$T^2 A$

Monad – multiplication *versus* multiplication

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

Monad – multiplication *versus* multiplication

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

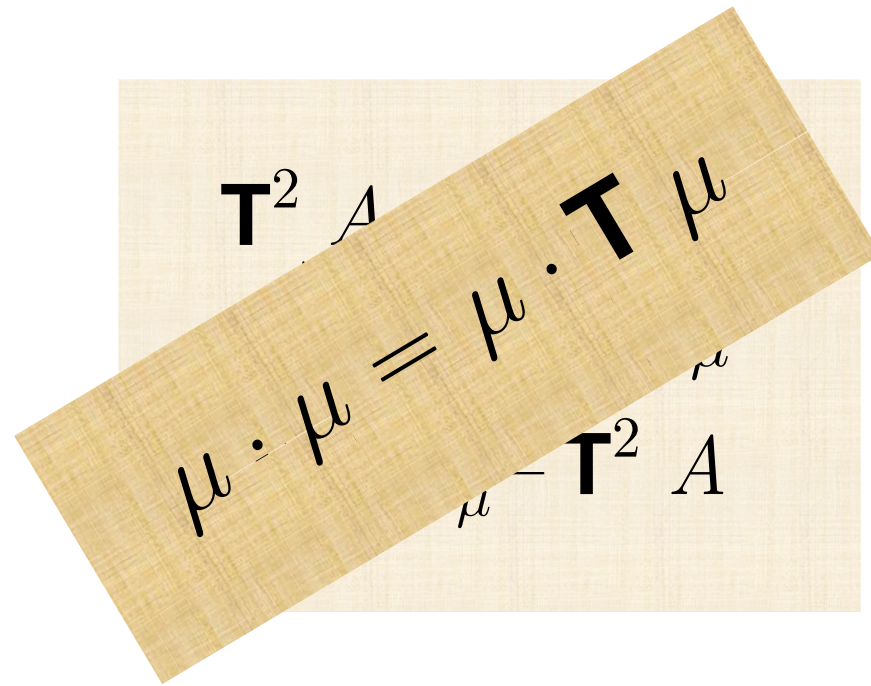
Monad – multiplication *versus* multiplication

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

Monad – multiplication *versus* multiplication

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

Monad – multiplication *versus* multiplication



$\mu \cdot \mu = \mu \cdot \tau \mu$

$\tau^2 A$

$\mu = \tau^2 A$

Monad – laws of unit and multiplication

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

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

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

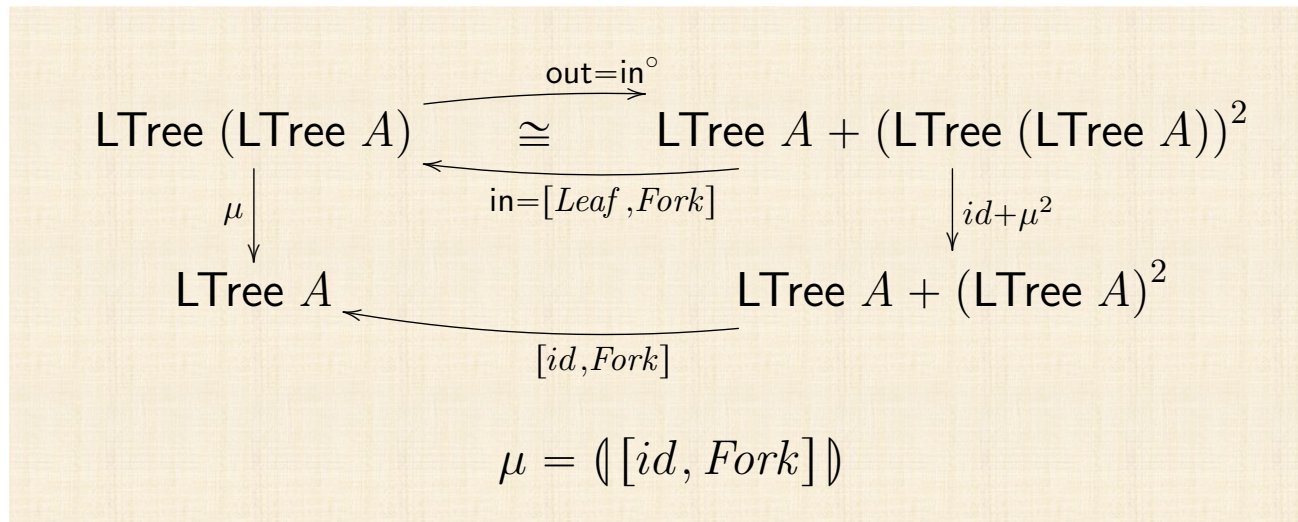
Monad – unit of composition

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

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

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

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

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

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

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

```
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”

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

$$f \bullet id = ?$$

$$f \bullet u = f$$

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

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 relationship between monad multiplication and the bind operator. The diagram consists of two rows of nodes. The top row has three nodes: $\mathbf{T}(\mathbf{T}C)$, $\mathbf{T}B$, and $\mathbf{T}B$. The bottom row has two nodes: $\mathbf{T}C$ and B . A vertical arrow labeled μ points from $\mathbf{T}(\mathbf{T}C)$ down to $\mathbf{T}C$. A horizontal arrow labeled $\mathbf{T}f$ points from $\mathbf{T}(\mathbf{T}C)$ to $\mathbf{T}B$. A horizontal arrow labeled id points from the right $\mathbf{T}B$ to the left $\mathbf{T}B$. A horizontal arrow labeled f points from B to $\mathbf{T}C$. A curved arrow labeled $f \bullet id$ points from the right $\mathbf{T}B$ to $\mathbf{T}C$. A vertical dotted line connects the right $\mathbf{T}B$ to B .

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

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

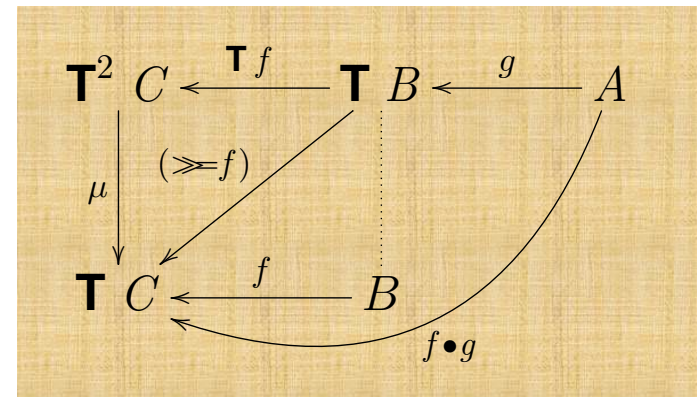
The arrows connecting these nodes are:

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

`return = u`

```
-- (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)
```

Monad (Haskell)

Minimal complete definition

```
(>>=)
```

Methods

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

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
```

```
# Source
```

```
| infixl 1 | # Source
```

```
# Source
```

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.

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

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

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

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

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

Formulae sheet

MÓNADAS

Multiplicação

$$\mu \cdot \mu = \mu \cdot \top \mu \quad (62)$$

Unidade

$$\mu \cdot u = \mu \cdot \top u = id \quad (63)$$

Natural- u

$$u \cdot f = \top f \cdot u \quad (64)$$

Natural- μ

$$\mu \cdot \top (\top f) = \top f \cdot \mu \quad (65)$$

Composição monádica

$$f \bullet g = \mu \cdot \top f \cdot g \quad (66)$$

Associatividade- \bullet

$$f \bullet (g \bullet h) = (f \bullet g) \bullet h \quad (67)$$

Identidade- \bullet

$$u \bullet f = f = f \bullet u \quad (68)$$

Associatividade- \bullet/\cdot

$$(f \bullet g) \cdot h = f \bullet (g \cdot h) \quad (69)$$

Associatividade- \cdot/\bullet

$$(f \cdot g) \bullet h = f \bullet (\top g \cdot h) \quad (70)$$

μ versus \bullet

$$id \bullet id = \mu \quad (71)$$

Formulae sheet

Composição monádica

$$(f \bullet g) a = \mathbf{do} \{ b \leftarrow g a; f b \} \quad (86)$$

'Binding as μ '

$$x \gg= f = (\mu \cdot \top f)x \quad (87)$$

Notação-do

$$\mathbf{do} \{ x \leftarrow a; b \} = a \gg= (\lambda x \rightarrow b) \quad (88)$$

' μ as binding'

$$\mu x = x \gg= id \quad (89)$$

Sequenciação

$$x \gg y = x \gg= \underline{y} \quad (90)$$

**Monad =
“racing”
functor**



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

MONADS: **do**-notation

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

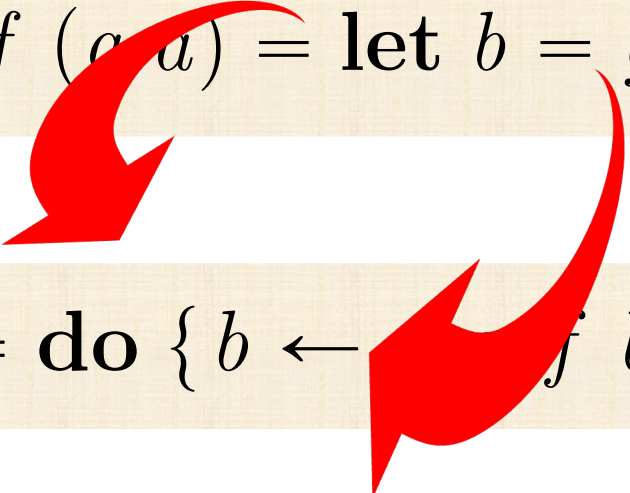
$$(f \cdot g) a = f (g a) = \mathbf{let} \ b = g \ a \ \mathbf{in} \ f \ b$$

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



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

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

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

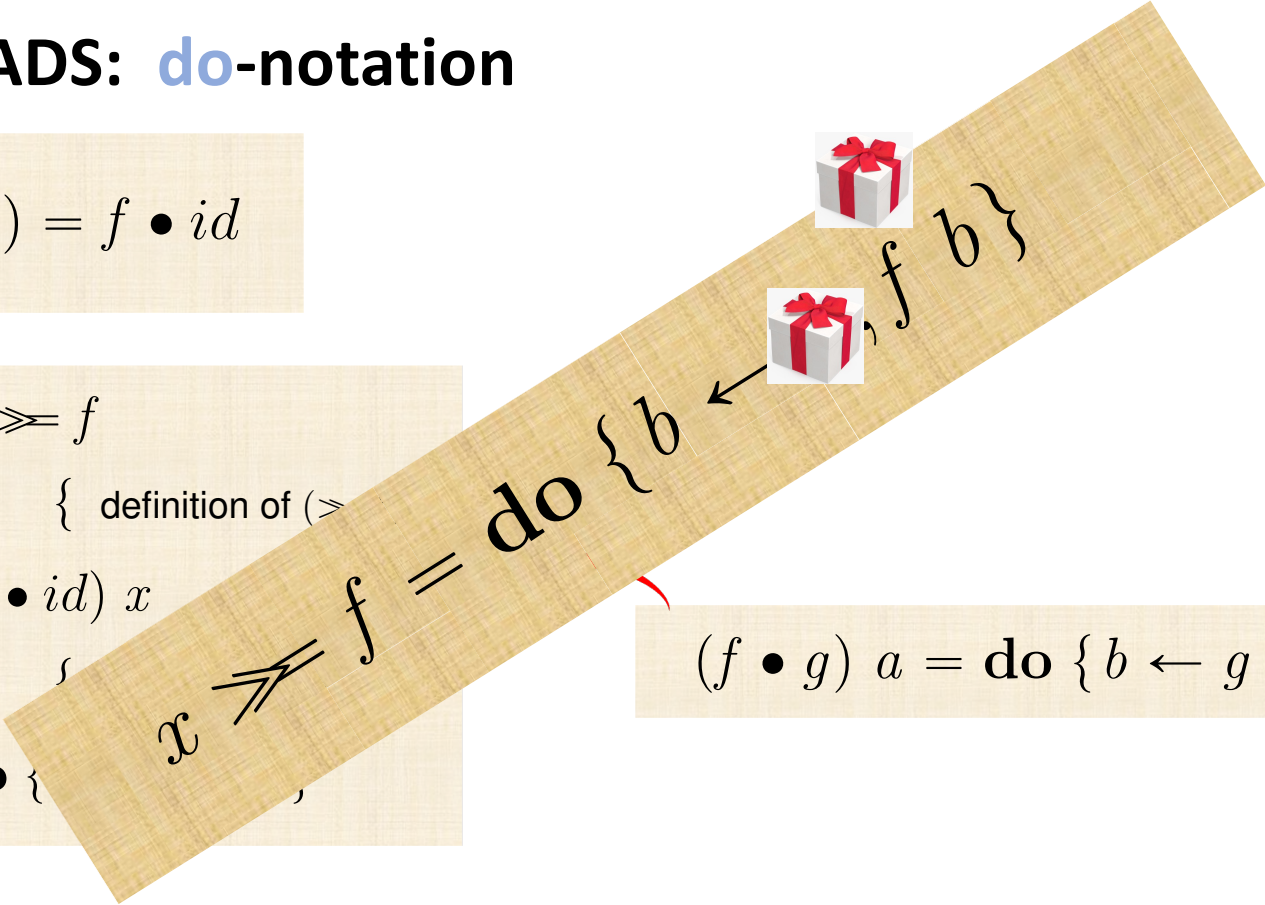
$$x \gg f = \text{do } \{ b \leftarrow x; f b \}$$

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

MONADS: **do**-notation

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

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

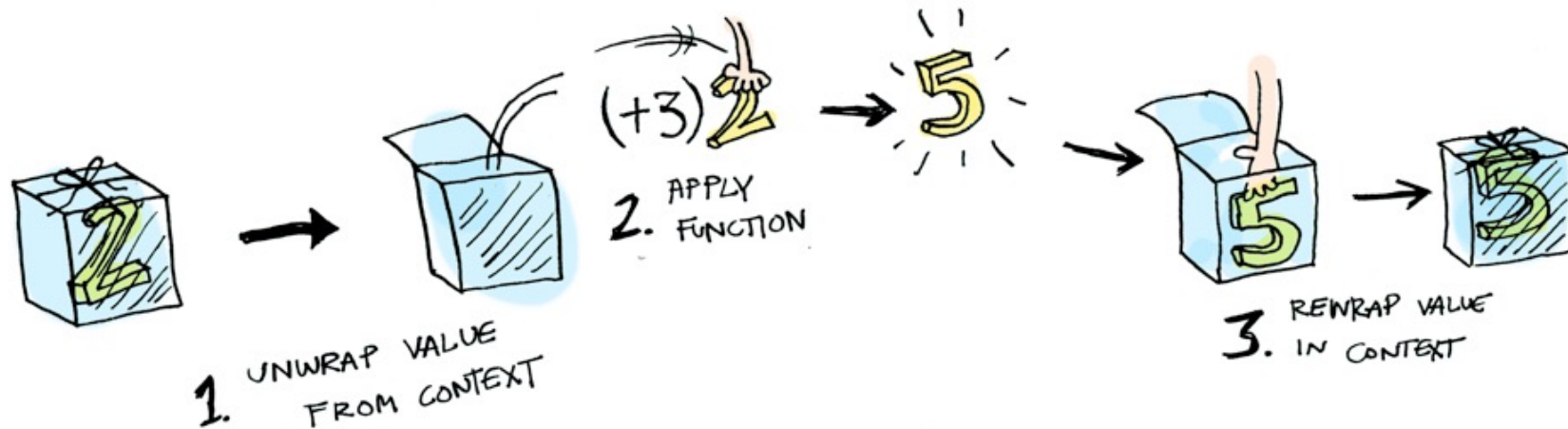


$x \gg f = \text{do } \{ b \leftarrow f b \}$

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

MONADS: do-notation

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



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

MONADS: **do**-notation

Recall law

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

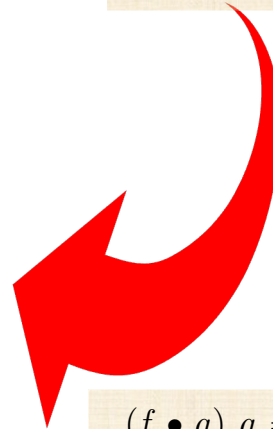
Particular case : $g, h := u, id$:

MONADS: **do**-notation

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

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

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



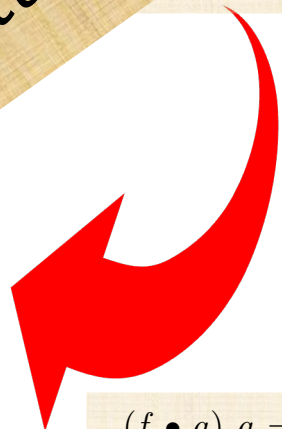
$$(f \bullet g) a = \mathbf{do} \{ b \leftarrow g a; f b \}$$

MONADS: **do**-notation

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

$$(g \cdot f) \bullet h = \mathbf{do} \{ b \leftarrow g; \text{return } (f \ b) \} (\mathbf{T} f \cdot h)$$

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



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

I/O monad : interfacing with the file system



I/O monad : interfacing with the file system

$$\text{IO } \text{String} \xleftarrow{\text{readFile}} \text{FilePath}$$

⋮

$$\text{IO } 1 \xleftarrow{\text{writeFile } o} \text{String}$$

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



O monad (trivial) da identidade.



MONADS: laws written using **do**-notation

$$u \bullet f = f = f \bullet u$$

$$u \bullet f = f = f \bullet u$$

$$\equiv \{ \text{go pointwise} \}$$

$$(u \bullet f) a = f a = (f \bullet u) a$$

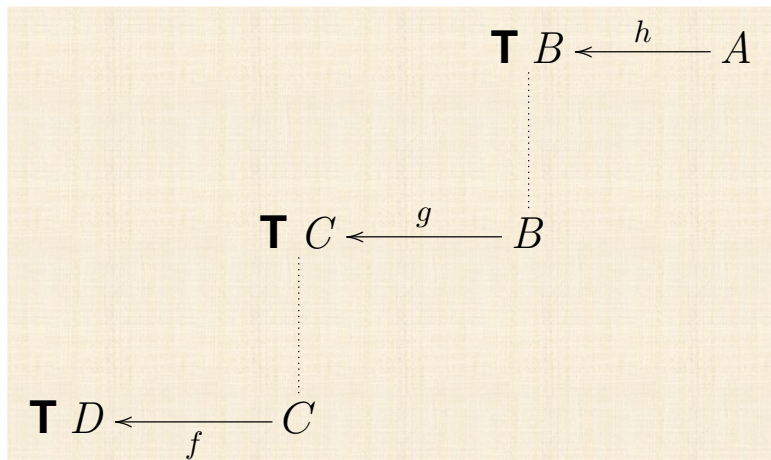
$$\equiv \{ \text{do-notation} \}$$

$$\mathbf{do} \{ b \leftarrow f a; \text{return } b \} = f a = \mathbf{do} \{ b \leftarrow \text{return } a; f b \}$$

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

MONADS: laws written using **do**-notation

$$f \bullet (g \bullet h) = (f \bullet g) \bullet h$$



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

MONADS: laws written using **do**-notation

$$f \bullet (g \bullet h) = (f \bullet g) \bullet h$$

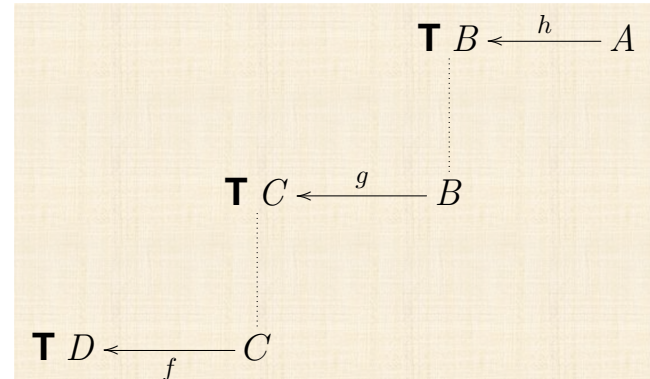
$$(f \bullet (g \bullet h)) a$$

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

$$\text{do} \{ c \leftarrow (g \bullet h) a; f c \}$$

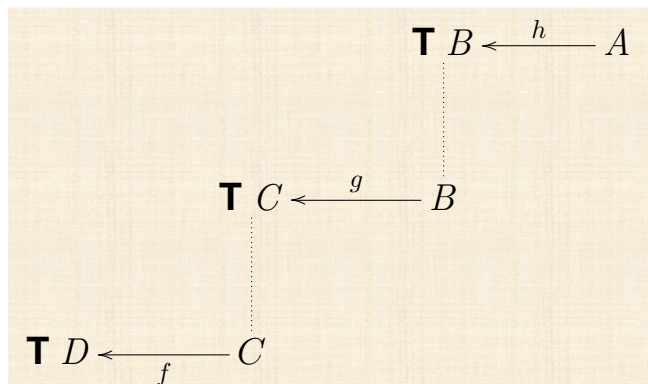
$$\equiv \{ \text{do-notation} \} \quad (f \bullet g) a = \text{do} \{ b \leftarrow g a; f b \}$$

$$\text{do} \{ c \leftarrow \text{do} \{ b \leftarrow h a; g b \}; f c \}$$



MONADS: laws written using **do**-notation

$$f \bullet (g \bullet h) = (f \bullet g) \bullet h$$



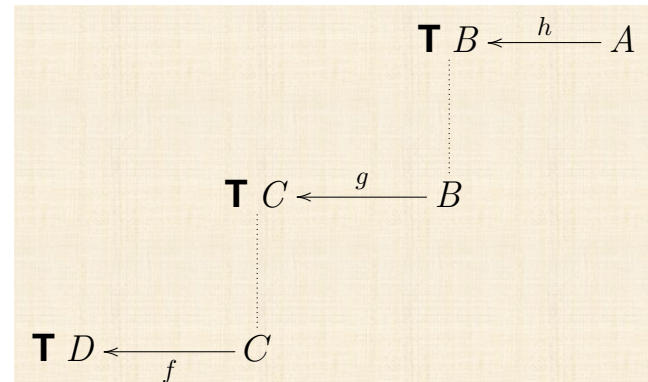
$$\begin{aligned} & ((f \bullet g) \bullet h) a \\ \equiv & \{ \text{do-notation} \} \quad (f \bullet g) a = \mathbf{do} \{ b \leftarrow g a; f b \} \\ & \mathbf{do} \{ b \leftarrow h a; (f \bullet g) b \} \\ \equiv & \{ \text{do-notation} \} \quad (f \bullet g) a = \mathbf{do} \{ b \leftarrow g a; f b \} \\ & \mathbf{do} \{ b \leftarrow h a; \mathbf{do} \{ c \leftarrow g b; f c \} \} \\ \equiv & \{ \text{simplify} \} \\ & \mathbf{do} \{ b \leftarrow h a; c \leftarrow g b; f c \} \end{aligned}$$

MONADS: laws written using **do**-notation

$$f \bullet (g \bullet h) = (f \bullet g) \bullet h$$

$$\mathbf{do} \{ c \leftarrow \mathbf{do} \{ b \leftarrow h \ a; g \ b \}; f \ c \} = \mathbf{do} \{ b \leftarrow h \ a; c \leftarrow g \ b; f \ c \}$$

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



MONADIC RECURSION: the pointwise way

Code “monadification” made easy

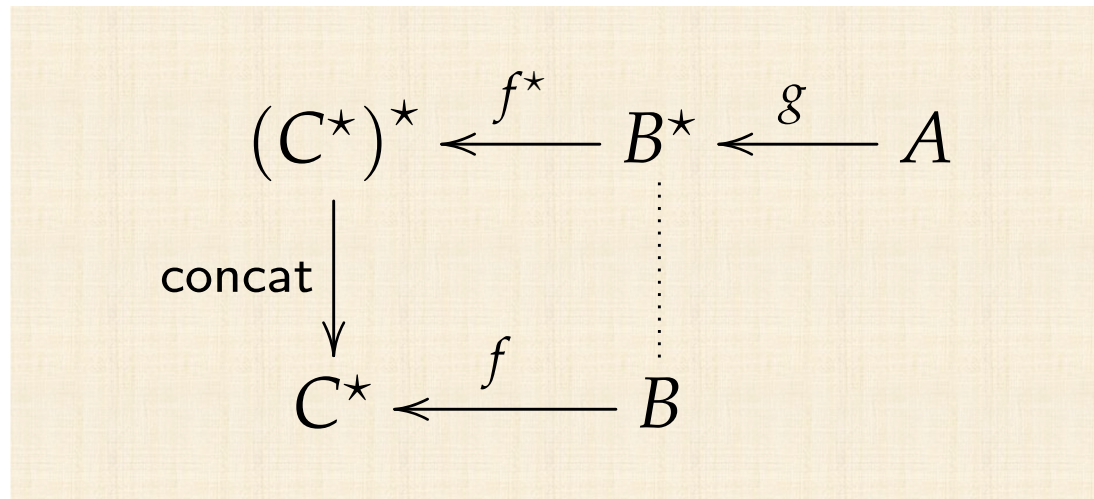
J.N. Oliveira

Notes for the MiEI/LCC degrees

University of Minho/DI, June 2010

(last update: May 2020)

MONADS: list comprehensions

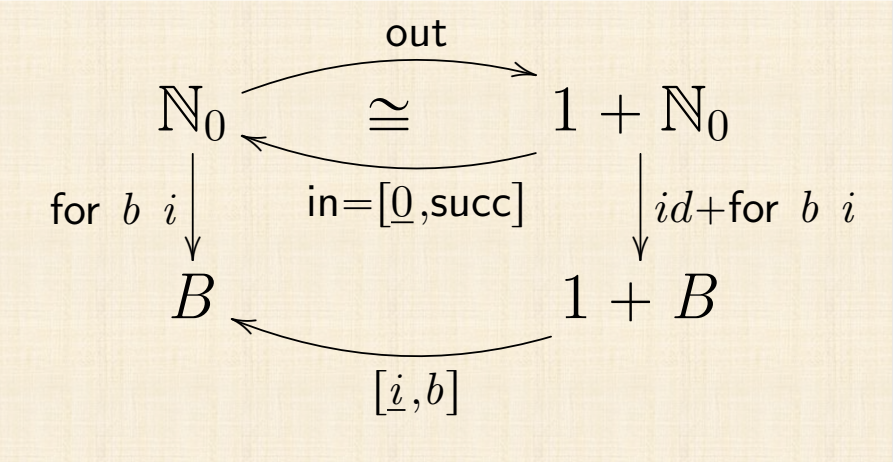
$$[e \mid a_1 \leftarrow x_1, \dots, a_n \leftarrow x_n] = \mathbf{do} \{ a_1 \leftarrow x_1; \dots; a_n \leftarrow x_n; \mathbf{return} \ e \}$$


Cálculo de Programas

Aula T12

Monadic recursion

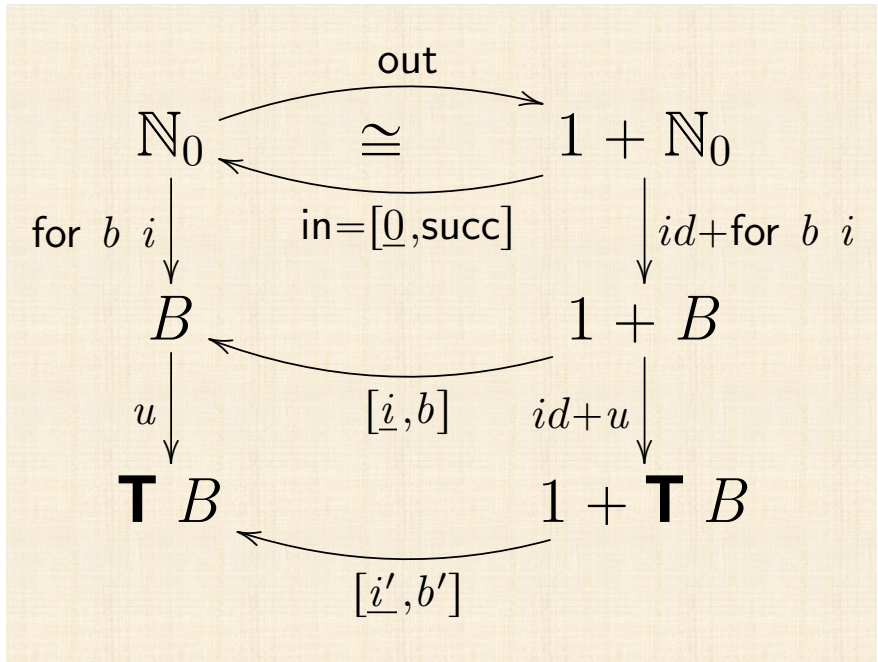
$$X \xrightarrow{u} \mathbf{T} X \xleftarrow{\mu} \mathbf{T} (\mathbf{T} X)$$



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

Monadic recursion

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



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

Monadic recursion

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

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

Monadic recursion

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

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

$$\equiv \quad \{ f \cdot \underline{x} = \underline{f x}; \mathbf{T} f \cdot u = u \cdot f \}$$

$$\begin{cases} u \ i = i' \\ \mathbf{T} b \cdot u = b' \cdot u \end{cases}$$

$$\Leftarrow \quad \{ \text{trivial} \}$$

$$\begin{cases} i' = u \ i \\ b' = \mathbf{T} b \end{cases}$$

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

Monadic recursion

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

$$\text{mfor } b \ i = \langle [u \ i, \mathbf{T} \ b] \rangle$$

$$\text{mfor } b \ i = \langle [u \ i, \mathbf{T} \ b] \rangle$$

$$\equiv \{ \text{universal cata} \}$$

$$\text{mfor } b \ i \cdot [0, \text{succ}] = [u \ i, \mathbf{T} \ b] \cdot (\text{id} + \text{mfor } b \ i)$$

$$\equiv \{ \text{coprodutos (fusão, absorção, eq) ; variáveis} \}$$

$$\begin{cases} \text{mfor } b \ i \ 0 = u \ i \\ \text{mfor } b \ i \ (n + 1) = \mathbf{T} \ b \ (\text{mfor } b \ i \ n) \end{cases}$$

$$\equiv \{ u = \text{return} ; \mathbf{T} \ f \ x = \text{do } \{ a \leftarrow x ; \text{return } (f \ a) \} \}$$

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

Monadic recursion

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


```
mfor b i 0 = i  
mfor b i (n+1) = do { x <- mfor b i n ; b x }
```

Monadic recursion

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

```
mfor b i 0 = i  
mfor b i (n+1) = do { x <- mfor b i n ; b x }
```

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


$$\begin{aligned} & (b \bullet (\text{mfor } b \ i)) \ n \\ = & \quad \{ \text{composição e ccomposição monádica} \} \\ & (b \bullet \text{id}) (\text{mfor } b \ i \ n) \end{aligned}$$

Monadic recursion

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

```
mfor b i 0 = i  
mfor b i (n+1) = do { x <- mfor b i n ; b x }
```

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

Associatividade- \bullet/\cdot $(f \bullet g) \cdot h = f \bullet (g \cdot h)$ (66)

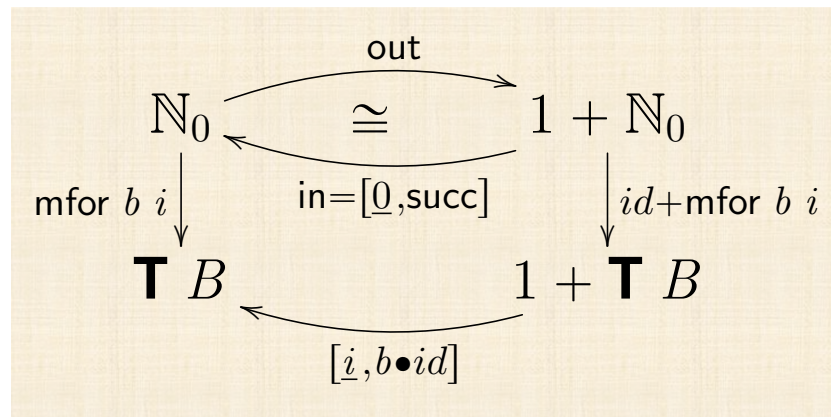


$$\begin{aligned} & (b \bullet (\mathbf{mfor} \ b \ i)) \ n \\ = & \quad \{ \text{id}; \text{composition} ; \text{monadic composition} \} \\ & (b \bullet \text{id}) (\mathbf{mfor} \ b \ i \ n) \end{aligned}$$

Monadic recursion

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

```
mfor b i 0 = i
mfor b i (n+1) = do { x <- mfor b i n ; b x }
```



$$1 \xrightarrow{i} \mathbf{T} B \xleftarrow{b} B$$

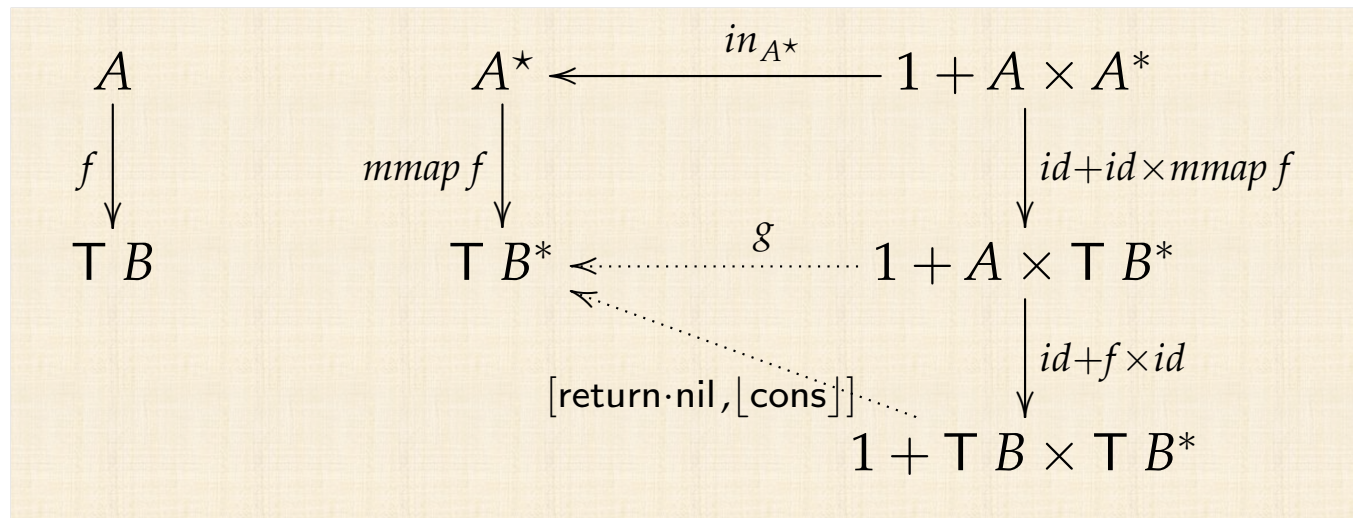
$$\text{mfor } b \text{ } i = ([i, b \bullet id])$$

Monadic **map** (mmap)

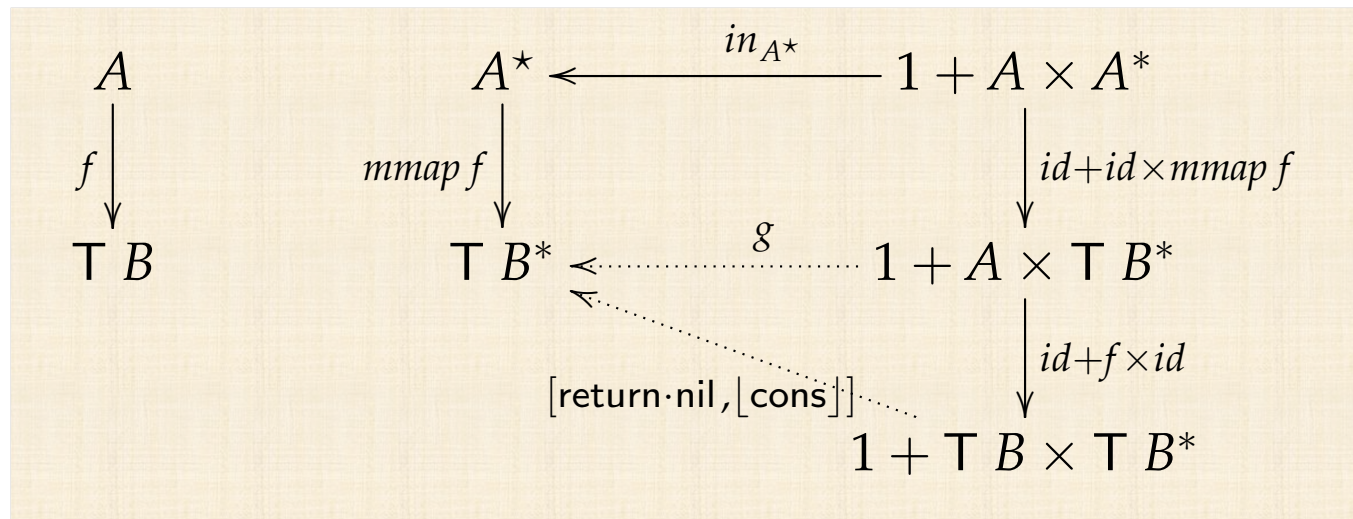
$$\begin{array}{ccccc} A & & A^* & \xleftarrow{\text{in}_{A^*}} & 1 + A \times A^* \\ \downarrow f & & \downarrow \text{mmap } f & & \downarrow \text{id} + \text{id} \times \text{mmap } f \\ \mathbb{T} B & & \mathbb{T} B^* & \xleftarrow{\text{g}} & 1 + A \times \mathbb{T} B^* \end{array}$$

$g?$

Monadic **map** (mmap)



Monadic **map** (mmap)



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

Monadic **map** (mmap)

$mmap :: (Monad\ m) \Rightarrow (a \rightarrow m\ b) \rightarrow [a] \rightarrow m\ [b]$

$mmap\ f\ [] = \text{return}\ []$

$mmap\ f\ (h : t) = \mathbf{do}\ \{ b \leftarrow f\ h; x \leftarrow mmap\ f\ t; \text{return}\ (b : x) \}$

Monadic **map** (mmap)

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

```
mgetmin :: Ord a => [a] → 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...)

$$mgetmin :: Ord\ a \Rightarrow [a] \rightarrow Maybe\ a$$
$$mgetmin\ [] = Nothing$$
$$mgetmin\ [a] = return\ a$$
$$mgetmin\ (h : t) = \mathbf{do}\ \{x \leftarrow mgetmin\ t; return\ (min\ h\ x)\}$$

MONADS



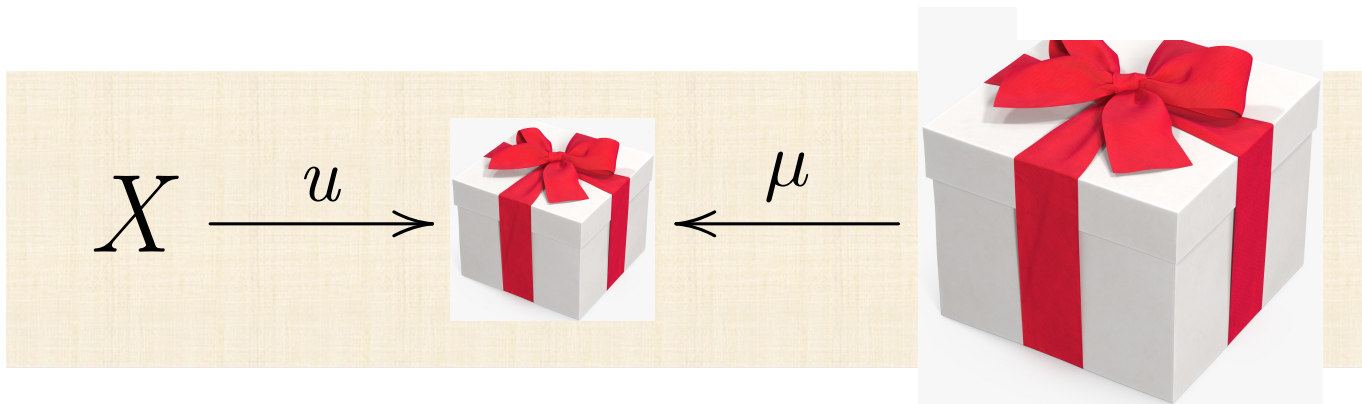
work input
standardized
prototyping
hardware
methodologies
troubleshooters
manpower
established
potpourri
estimation
project
programmer
staffs
shortened
india
expensive
large
architectural
tools
interval
techniques
ranged
iterative
management
promulgated

giants
interlining
productivity
troubleshooters
established
potpourri
estimation
project
programmer
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architectural
tools
interval
techniques
ranged
iterative
management
promulgated

programming

productivity

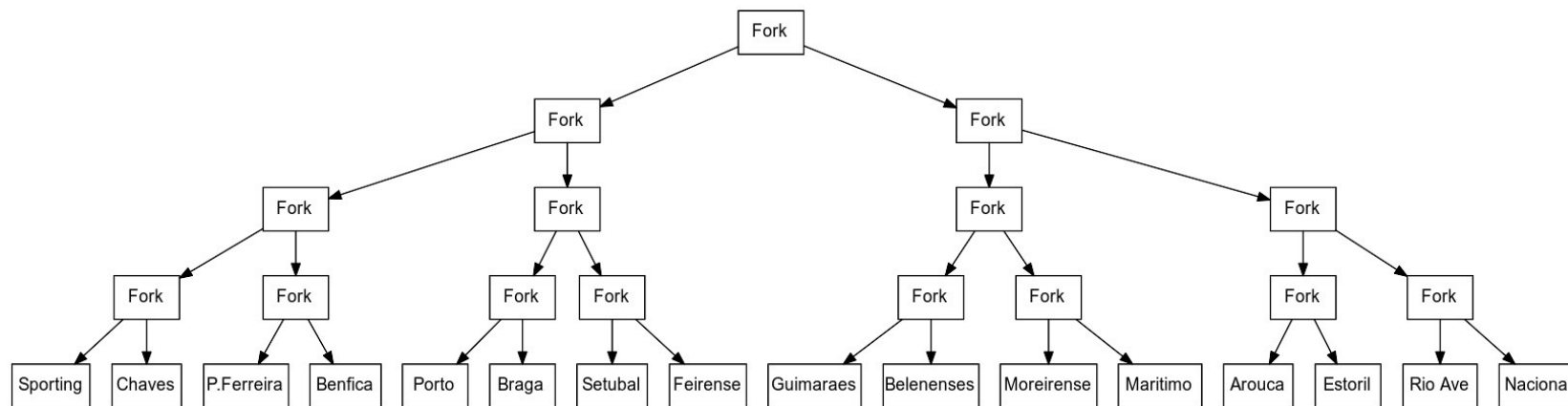
MONADS (recall)



**Probabilistic
monadic
programming**



Example – football league

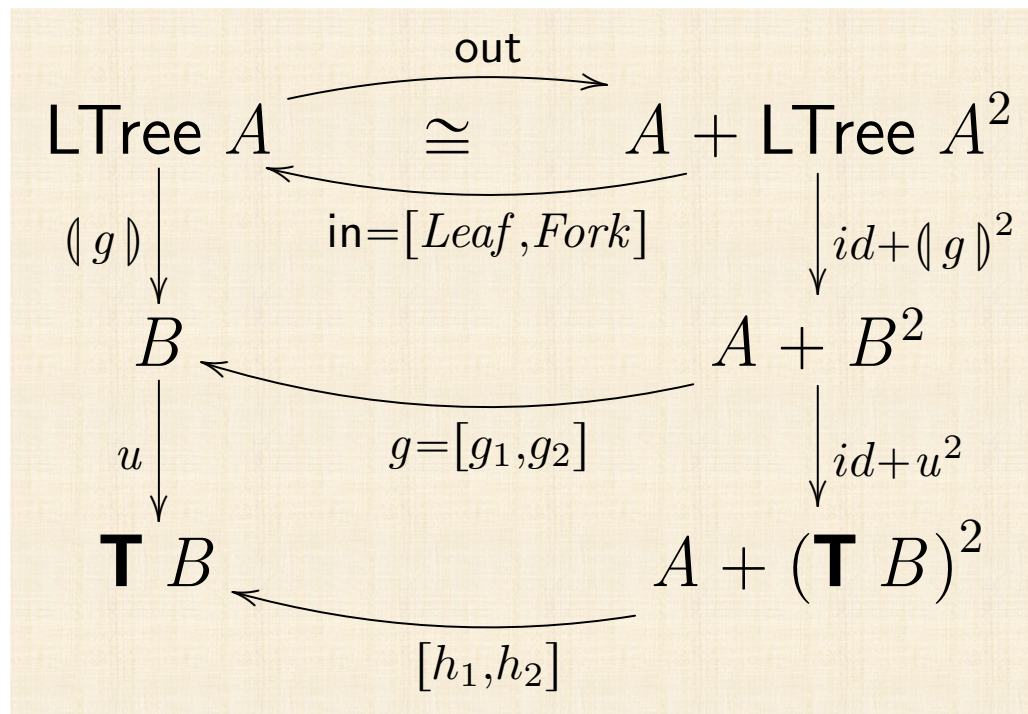


Arouca — 28.6%

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

mcataLTree $g = k$ where

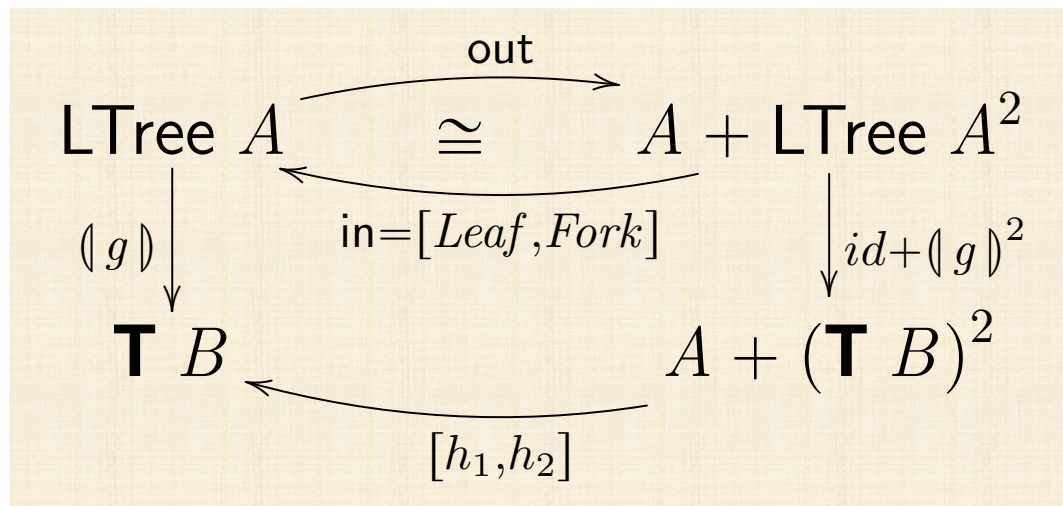
k (*Leaf* a) = `return` (g_1 a)

k (*Fork* (x, y)) = `do` { $a \leftarrow k$ x ; $b \leftarrow k$ y ; `return` (g_2 (a, b)) }

$g_1 = g \cdot i_1$

$g_2 = g \cdot i_2$

LTree ... monadic cats in general



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

Arouca	28.6%
Braga	71.4%

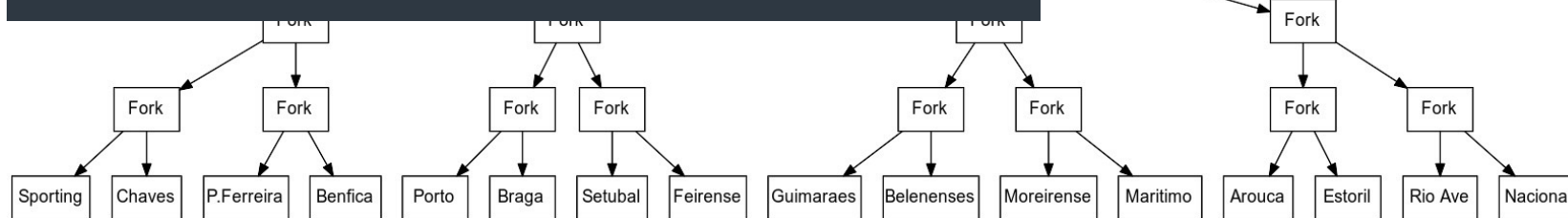
$$h_2(x, y) = \mathbf{do} \{ a \leftarrow x; b \leftarrow y; f(a, b) \}$$

Example – football league



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

*Main> jogo ("Braga", "Arouca")
"Braga" 71.4%
"Arouca" 28.6%
```

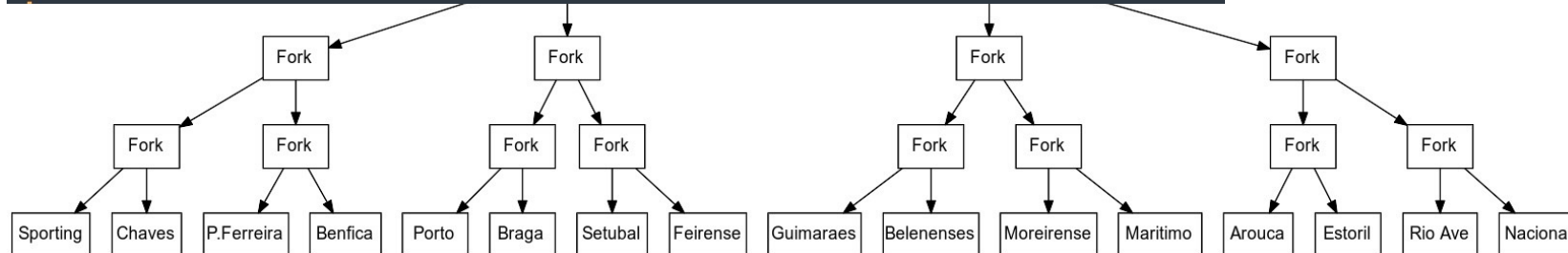


etc

Example – football league



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

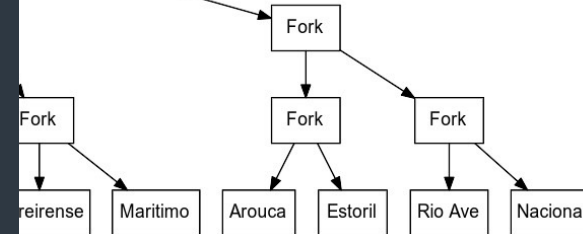
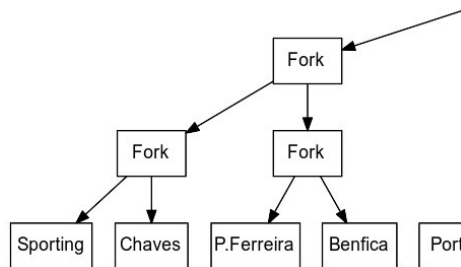


```
calendario = anaLTree lsplit equipas
```

Example – football league



```
*Main> simular calendario
  "Porto" 24.0%
  "Benfica" 22.0%
  "Sporting" 19.8%
  "Braga" 6.0%
  "Guimaraes" 4.5%
  "Belenenses" 3.7%
  "Nacional" 3.7%
  "Maritimo" 3.5%
  "Moreirense" 2.3%
  "Rio Ave" 2.3%
  "Setubal" 2.1%
  "P.Ferreira" 1.8%
  "Arouca" 1.2%
  "Chaves" 1.2%
  "Feirense" 1.1%
  "Estoril" 0.8%
```

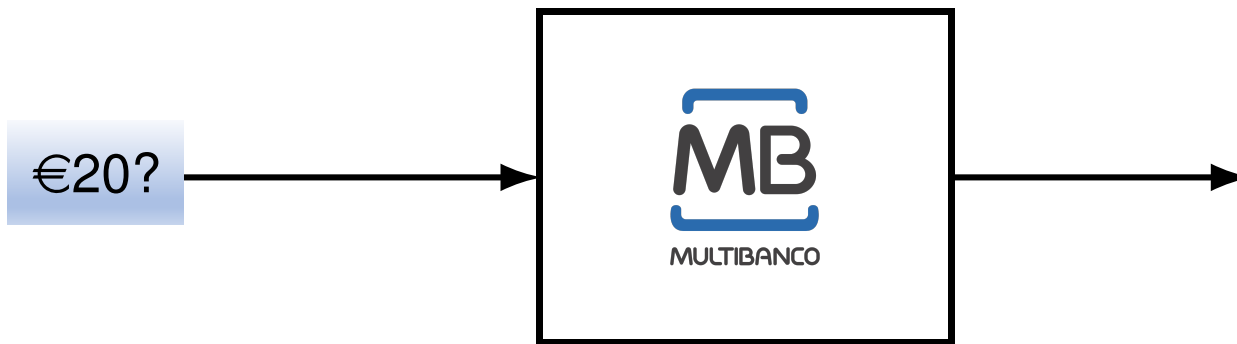


etc

STATE MONAD (REACTIVE SYSTEMS)



REACTIVE SYSTEMS



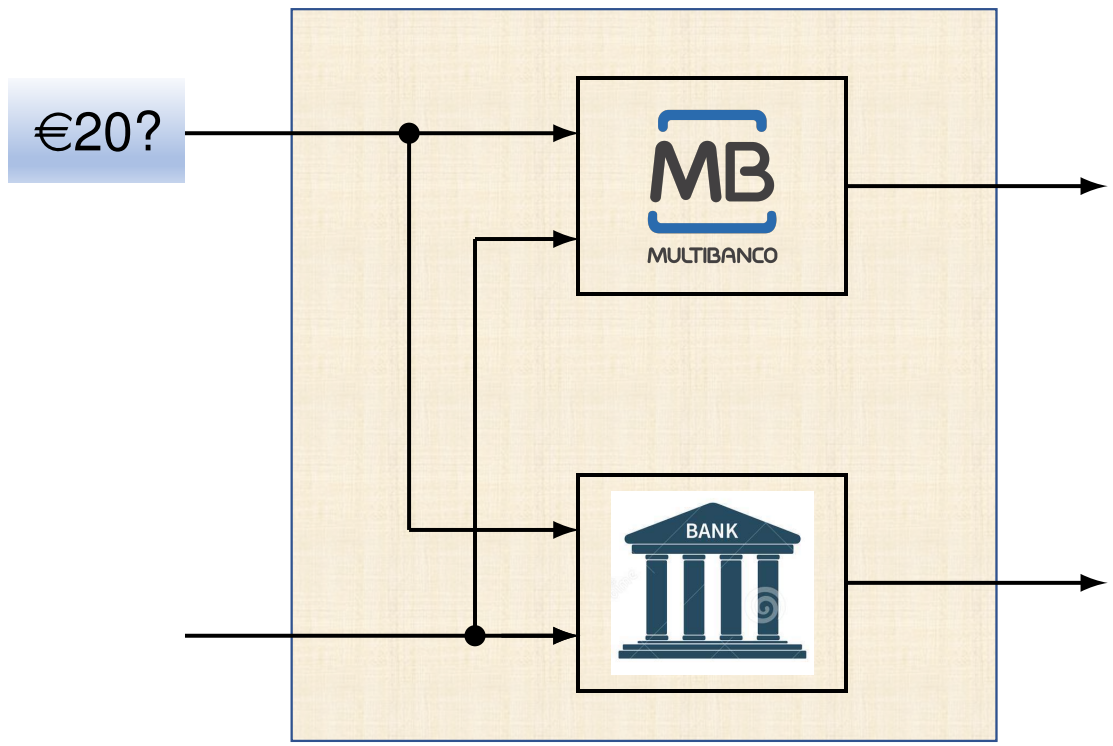
REACTIVE SYSTEMS



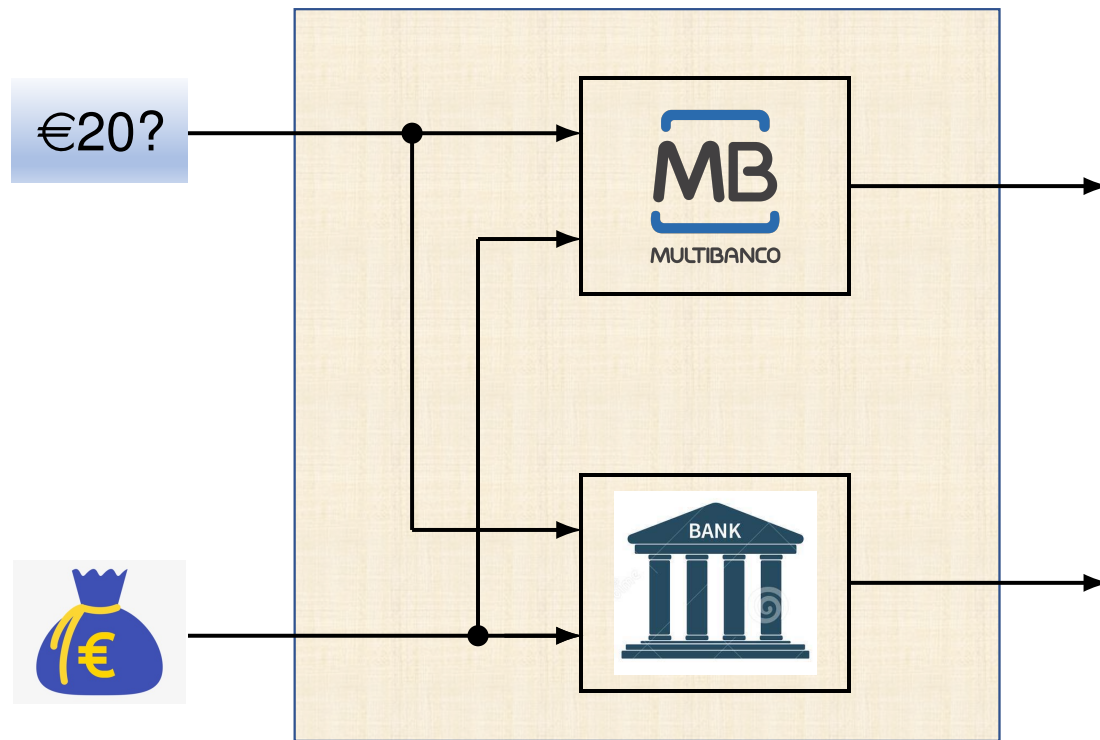
REACTIVE SYSTEMS



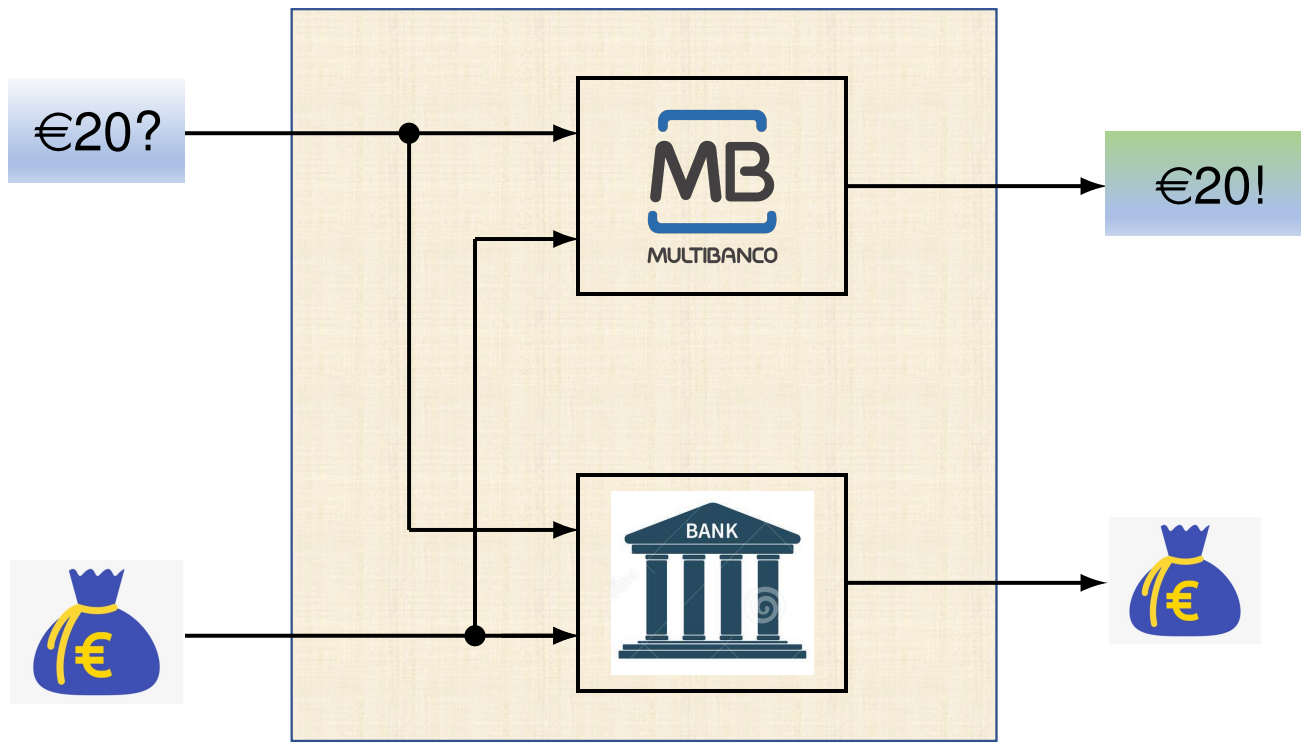
REACTIVE SYSTEMS



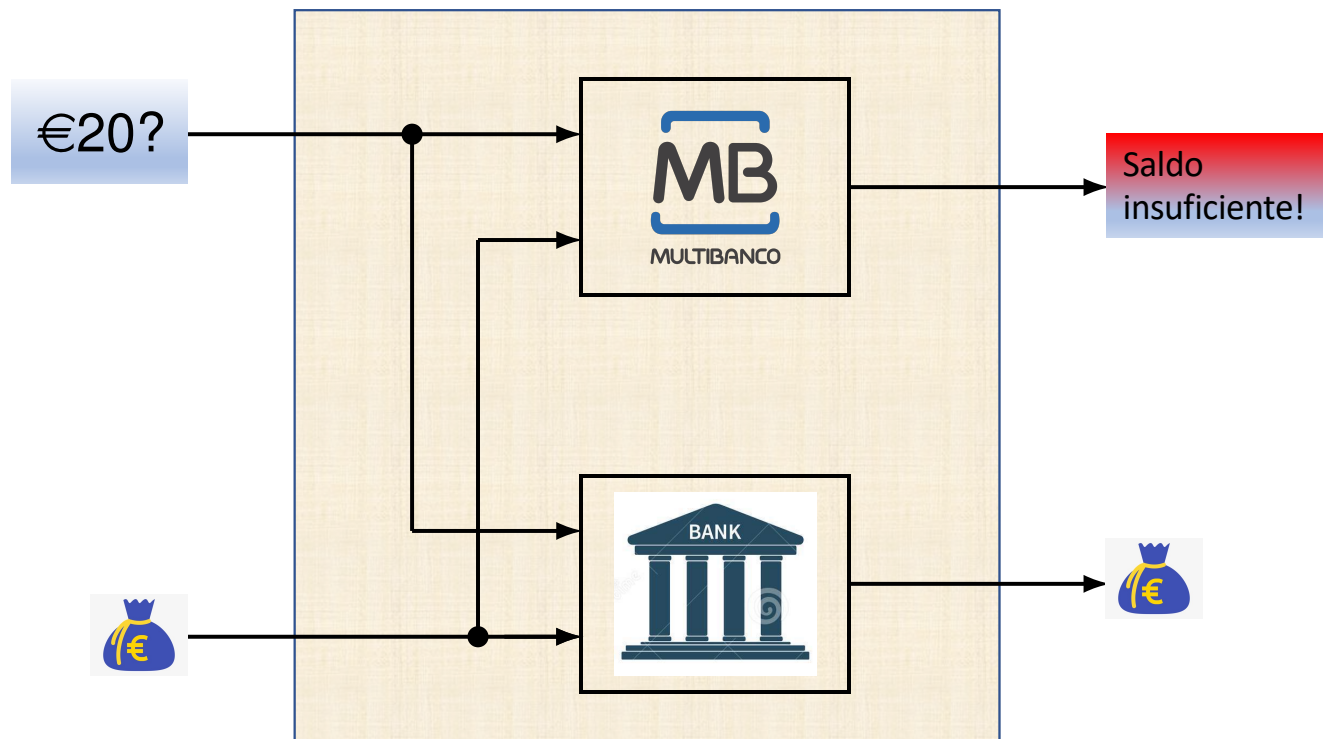
REACTIVE SYSTEMS



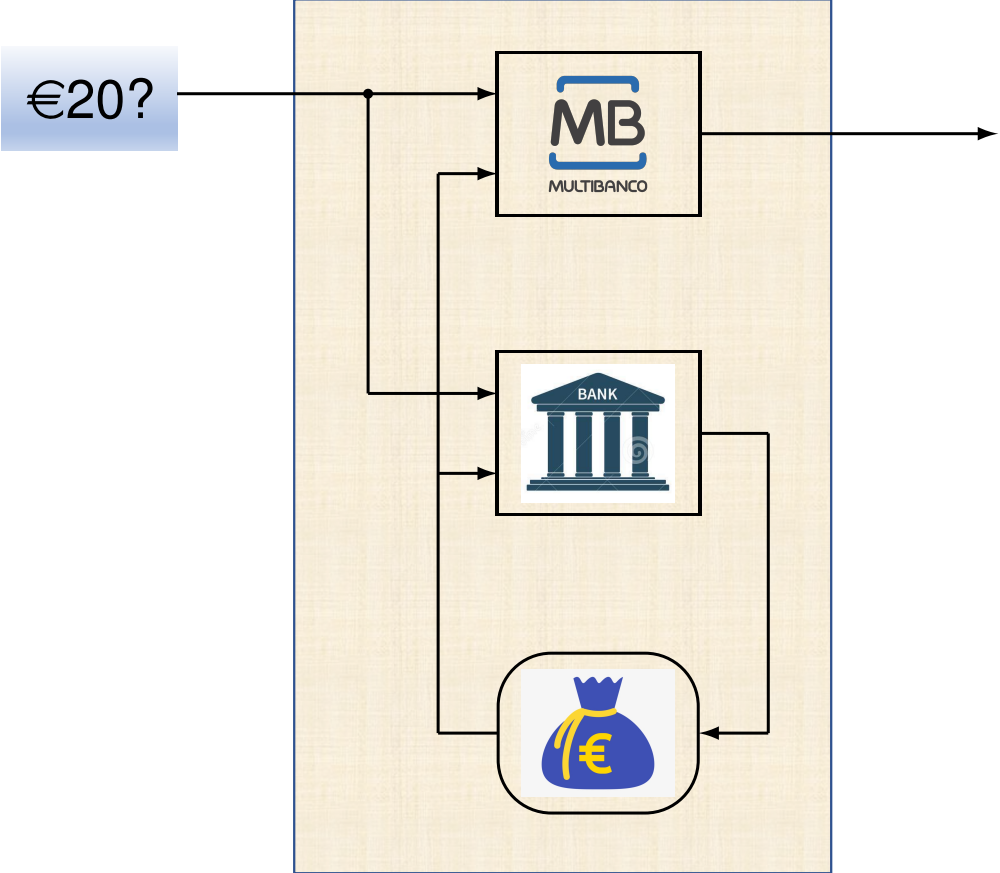
REACTIVE SYSTEMS



REACTIVE SYSTEMS



REACTIVE SYSTEMS

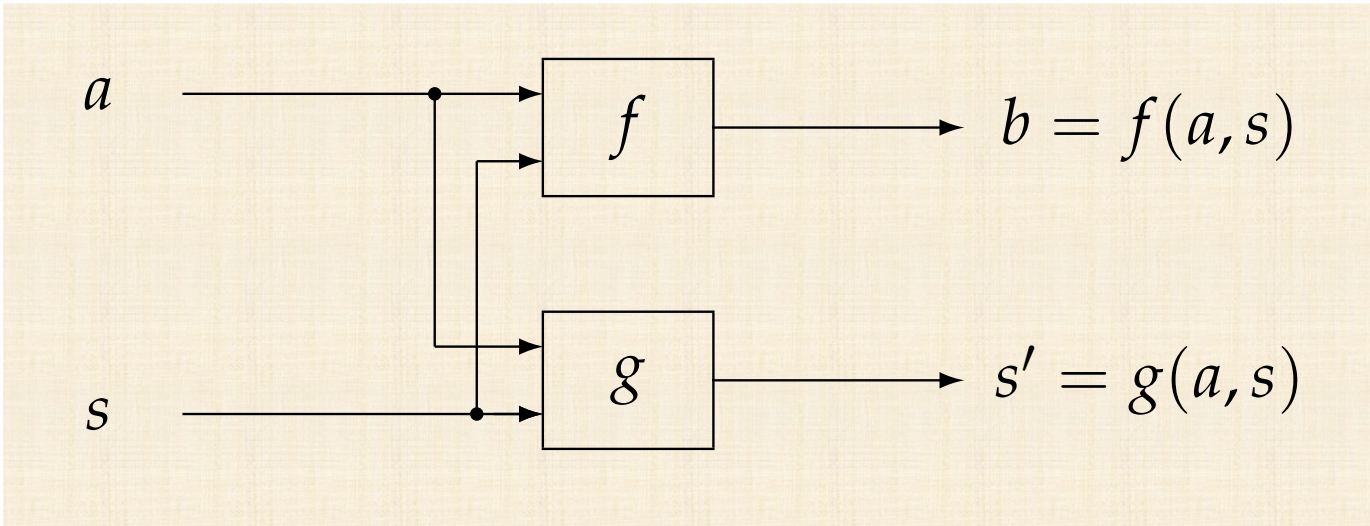


REACTIVE SYSTEMS

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

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

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

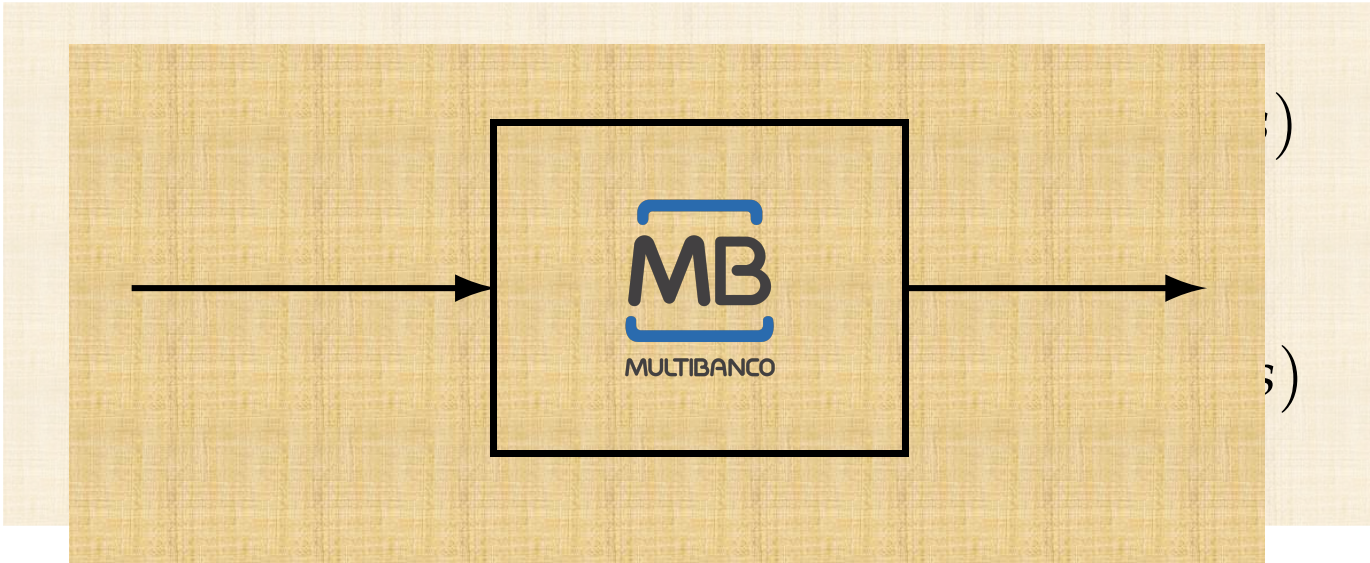


REACTIVE SYSTEMS

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

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

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



REACTIVE SYSTEMS

$$\text{curry} :: ((a,b) \rightarrow c) \rightarrow (a \rightarrow b \rightarrow c)$$

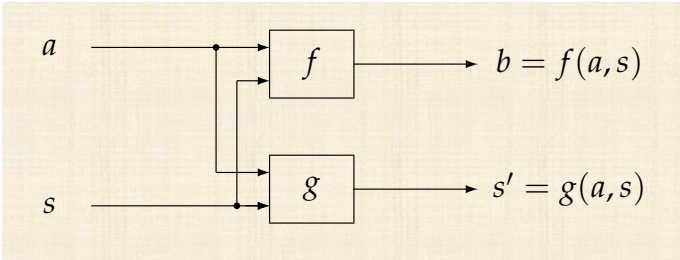
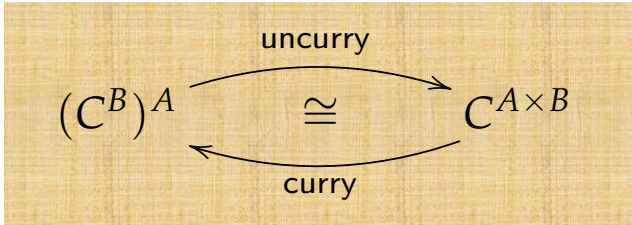
$$\text{curry } f \ a \ b = f \ (a,b)$$

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

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

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

$$A \rightarrow C^B \cong A \times B \rightarrow C$$



REACTIVE SYSTEMS

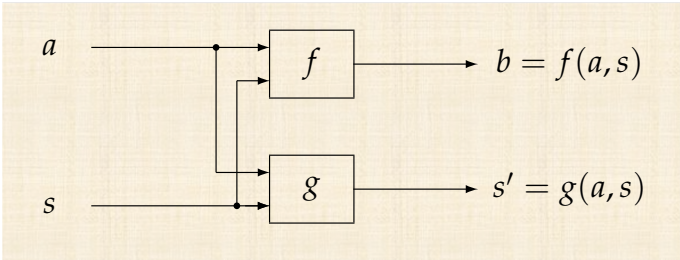
$$A \rightarrow C^B \cong A \times B \rightarrow C$$

$$\begin{aligned} A \times S &\xrightarrow{f} B \\ A \times S &\xrightarrow{g} S \\ A \times S &\xrightarrow{\langle f, g \rangle} B \times S \end{aligned}$$

$$A \times S \xrightarrow{\langle f, g \rangle} B \times S \cong A \xrightarrow{\overline{\langle f, g \rangle}} (B \times S)^S$$

$$A \xrightarrow{\overline{\langle f, g \rangle}} \underbrace{(B \times S)^S}_{\mathbf{T} B}$$

$$A \xrightarrow{\overline{\langle f, g \rangle}} \mathbf{T} B$$



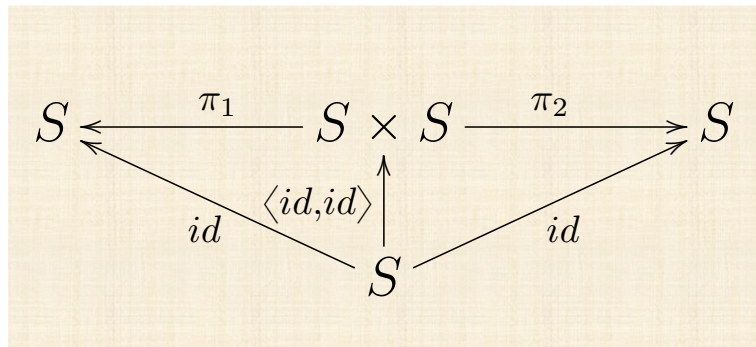
STATE MONAD

$$\mathbf{T} X = (X \times S)^S$$

$$\mathbf{T} f = (f \times id)^S$$

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

STATE MONAD *get*



$$\mathbf{T} X = (X \times S)^S$$

$$a \in (X \times S)^S$$

$$a = \langle f, g \rangle$$

$$get = \langle id, id \rangle$$

STATE MONAD *put*

$$\mathbf{T} X = (X \times S)^S$$

$$put = \overline{\langle !, \pi_1 \rangle}$$

$$\langle !, \pi_1 \rangle : S \times S \rightarrow 1 \times S$$

$$put = \overline{\langle !, \pi_1 \rangle} : S \rightarrow (1 \times S)^S$$

STATE MONAD example

$$\mathbf{T} X = (X \times S)^S$$

```
f Empty = return Empty
f (Node (a, (x, y))) = do {
  n ← get; put (n + 1);
  x' ← f x;
  y' ← f y;
  return (Node ((a, n), (x', y'))) }
```

$$put = \overline{\langle !, \pi_1 \rangle} : S \rightarrow (1 \times S)^S$$

$$get = \langle id, id \rangle$$

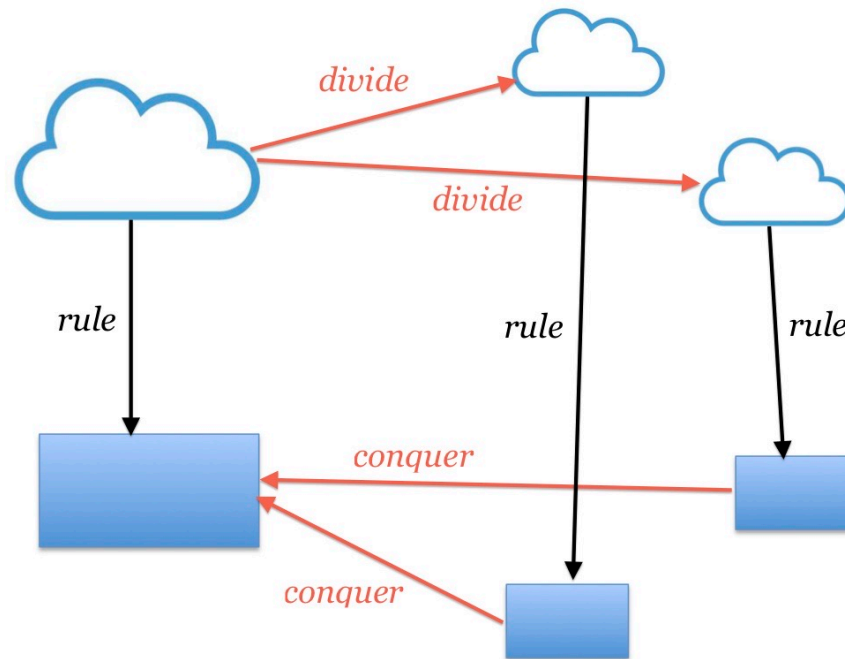
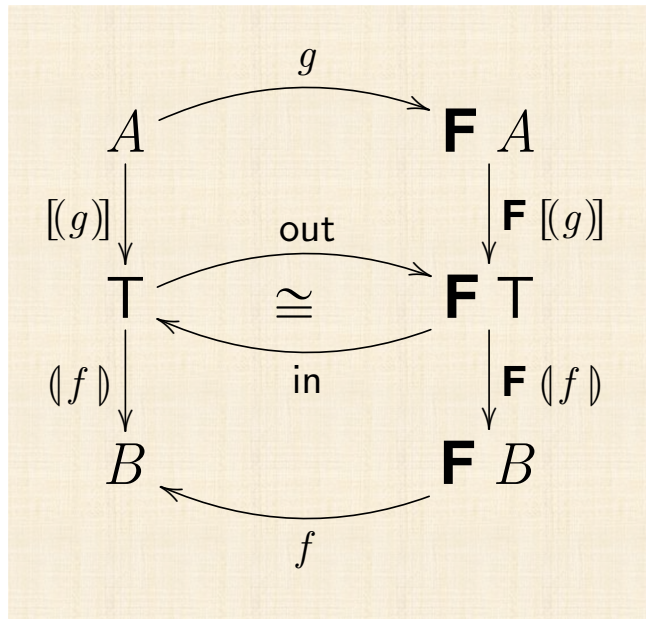
**Monad =
“racing”
functor**



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

Epilogue

Back to 'DIVIDE & CONQUER'



Back to 'DIVIDE & CONQUER'

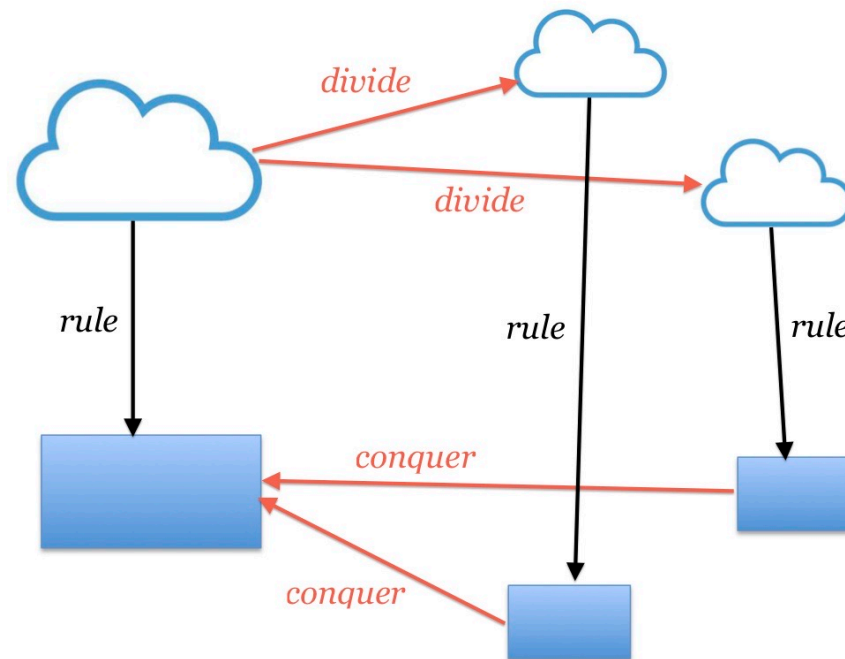


$C \xleftarrow{(-)} T \xleftarrow{[-]} A$

Back to 'DIVIDE & CONQUER'

QUESTION:

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



Example (FIBONACCI)

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

$$\mathit{fib} \ 1 = 1$$

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

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

FIBONACCI

(practical rule)

$$fib\ 0 = 1$$

$$fib\ 1 = 1$$

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

$$divide\ 0 = 1$$

$$divide\ 1 = 1$$

$$divide\ (n + 2) = \dots (n + 1) \dots n$$

$$divide\ 0 = i_1\ 1$$

$$divide\ 1 = i_1\ 1$$

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

FIBONACCI

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

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

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

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

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

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

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

FIBONACCI

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

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

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

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

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

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

FIBONACCI

$T = LTree\ No$

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

divide : $T = N_0 + N_0^2$

divide **B** $(X, Y) = X + Y^2$

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

FIBONACCI

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

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

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

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

$$\textit{conquer} = [\textit{id}, \textit{add}]$$

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

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

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

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

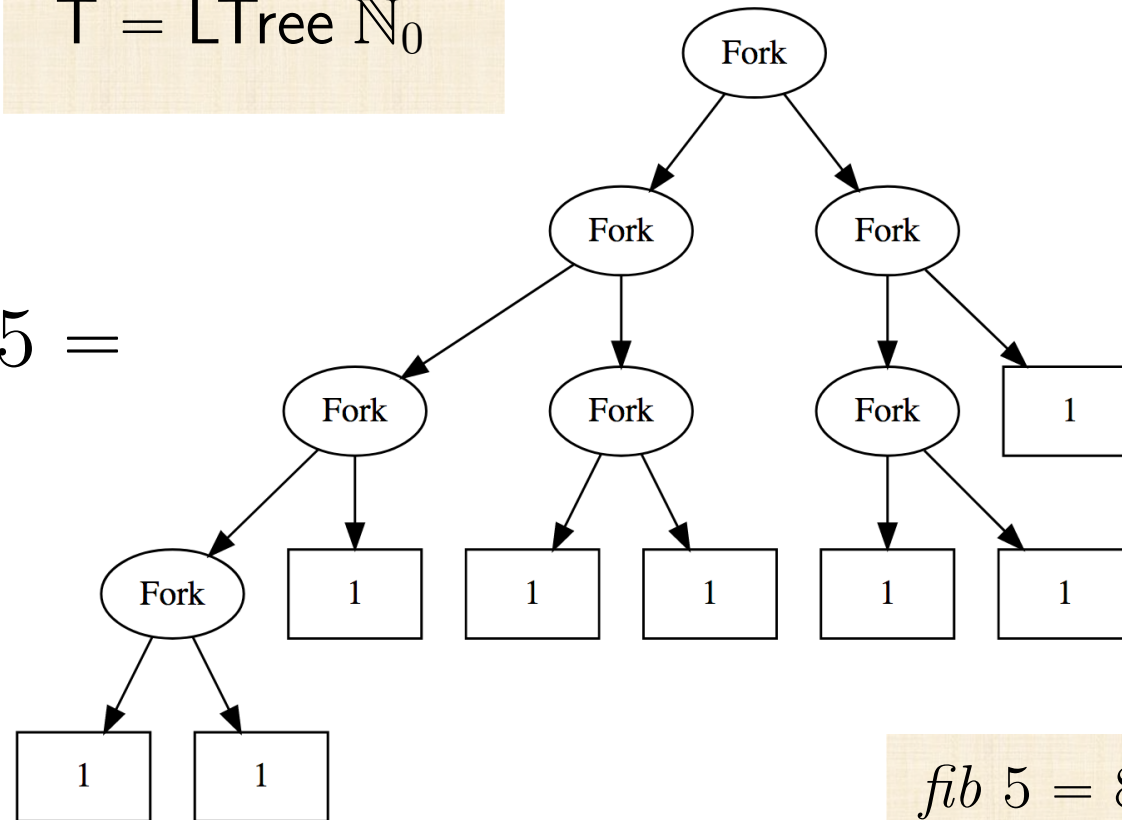
FIBONACCI

```
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

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

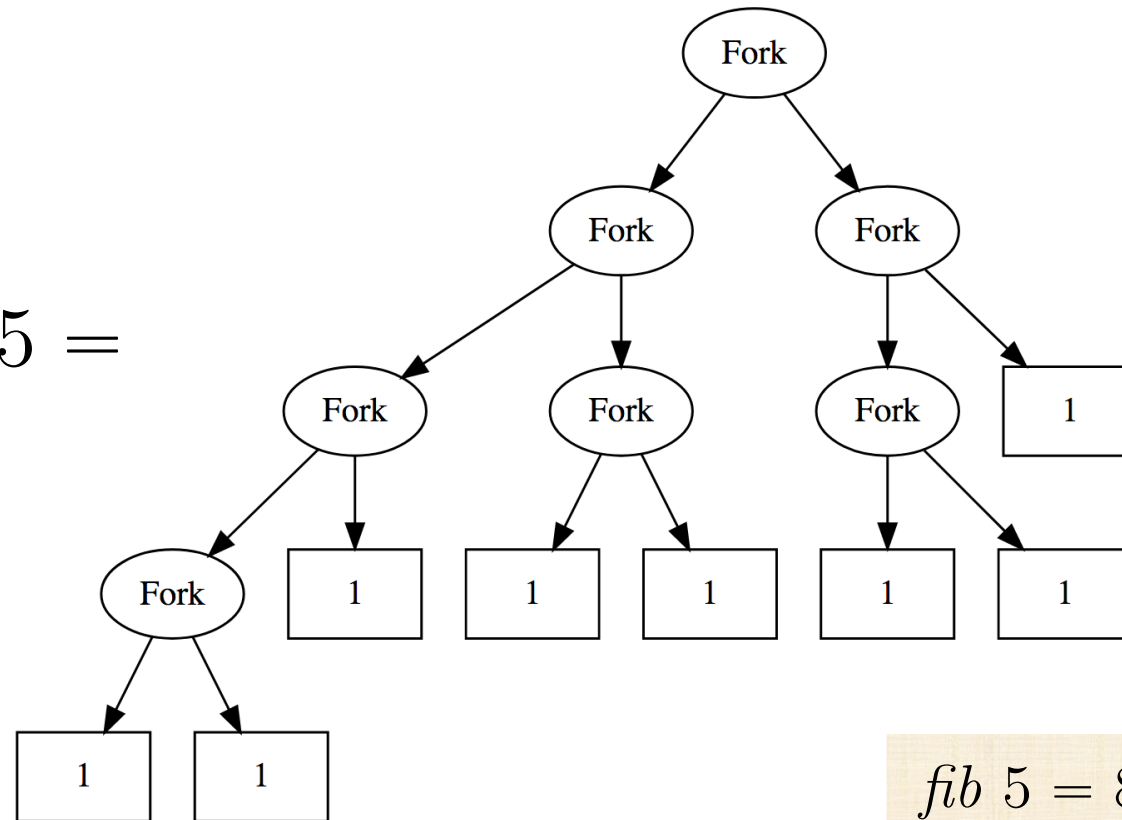
$[(\textit{divide})] 5 =$



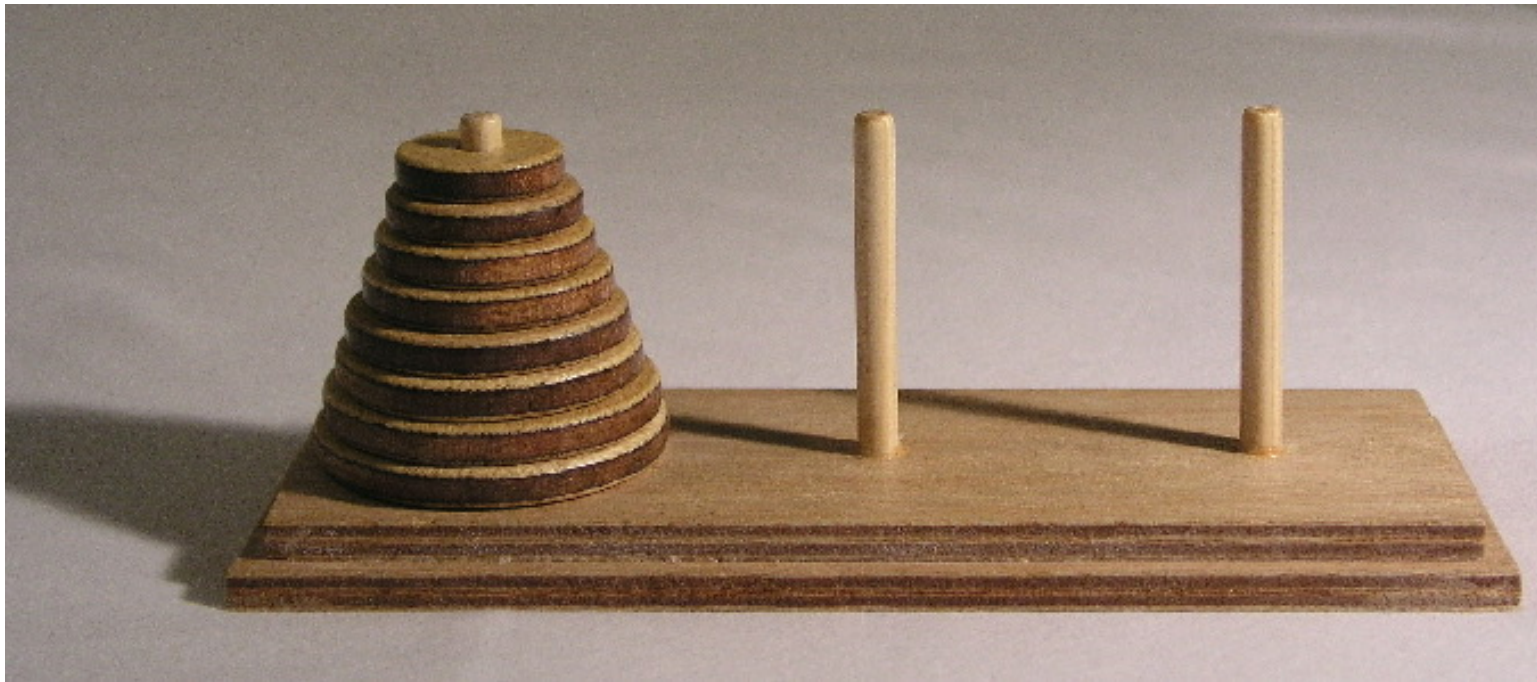
$\textit{fib } 5 = 8$

FIBONACCI

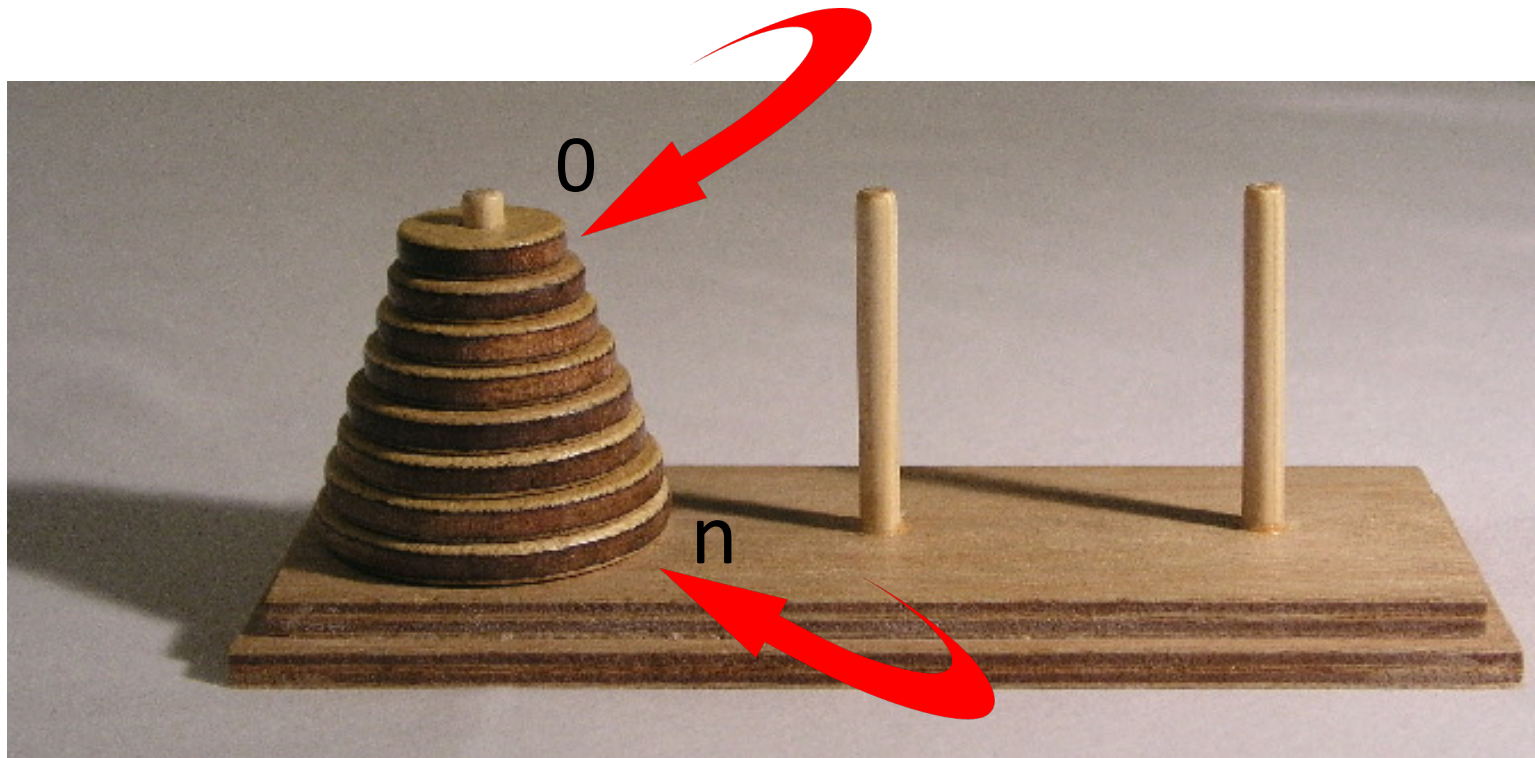
[[*divide*]] 5 =



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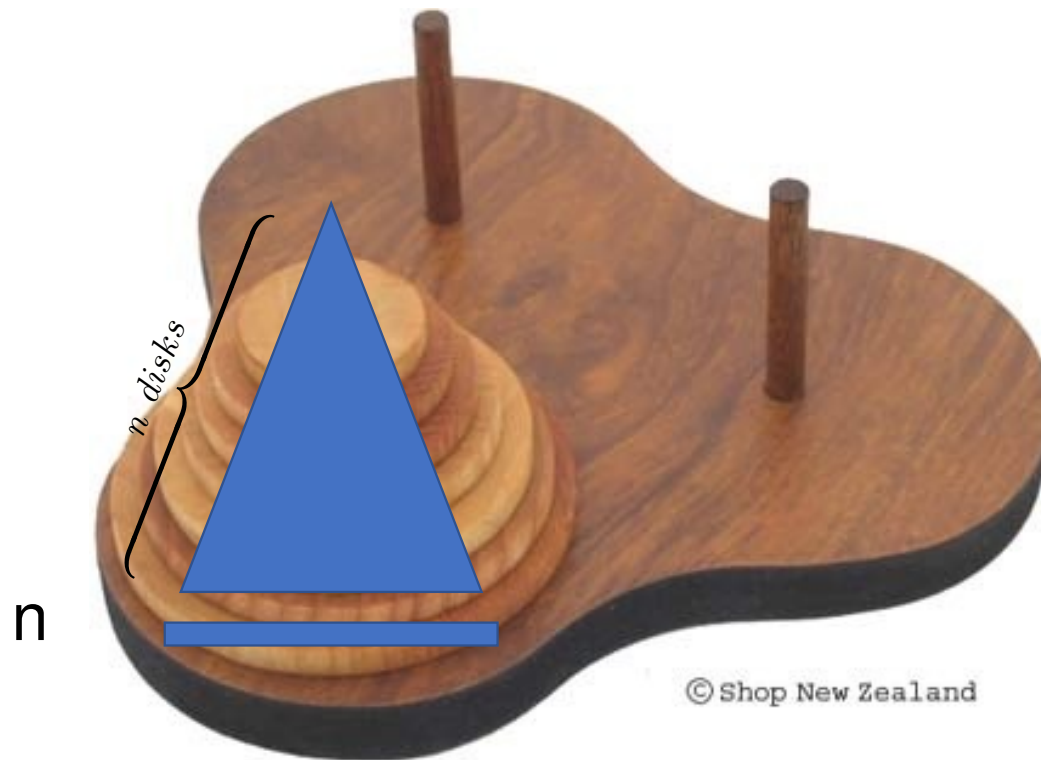


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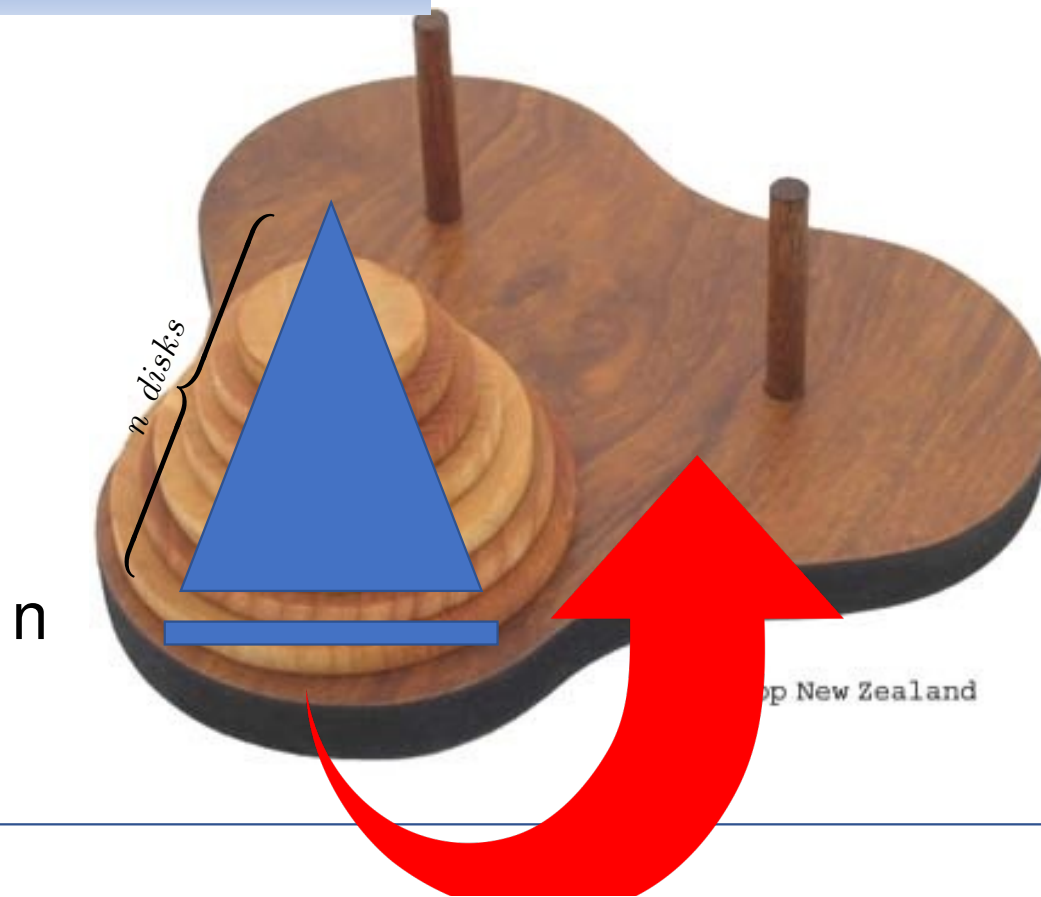
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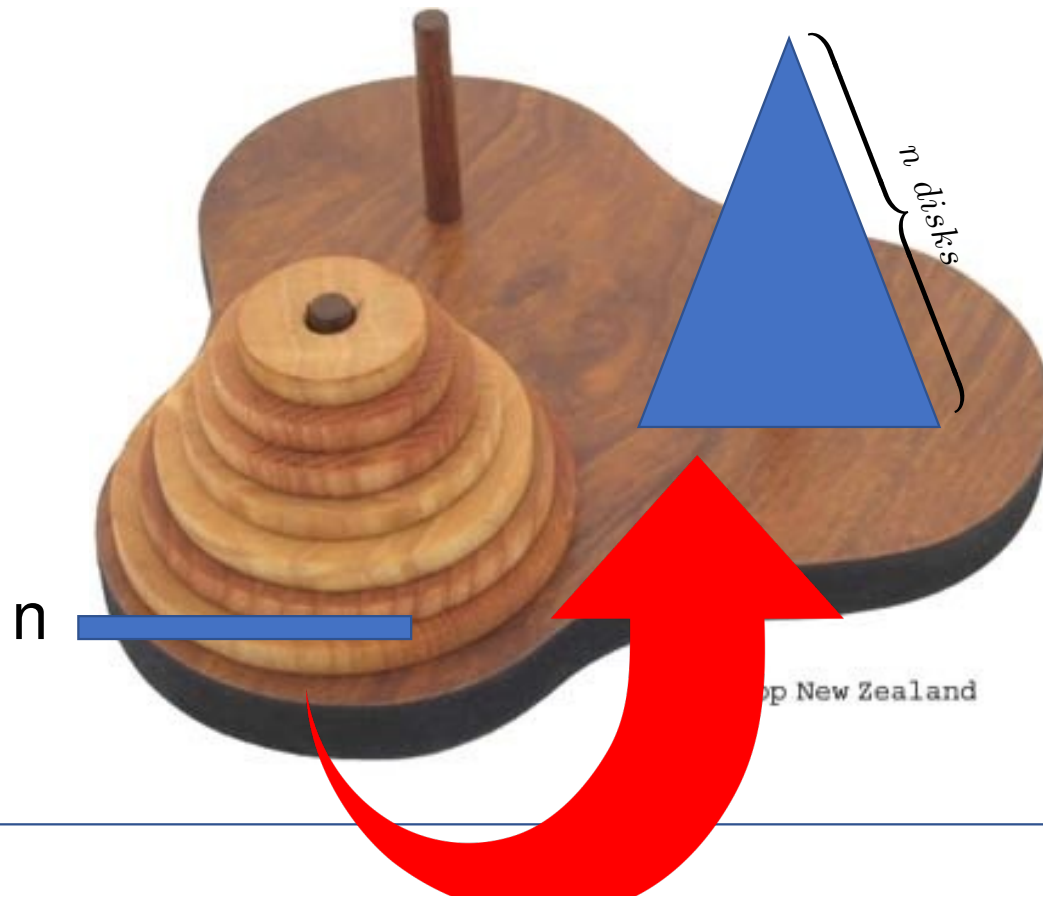
hanoi ($d, n + 1$)



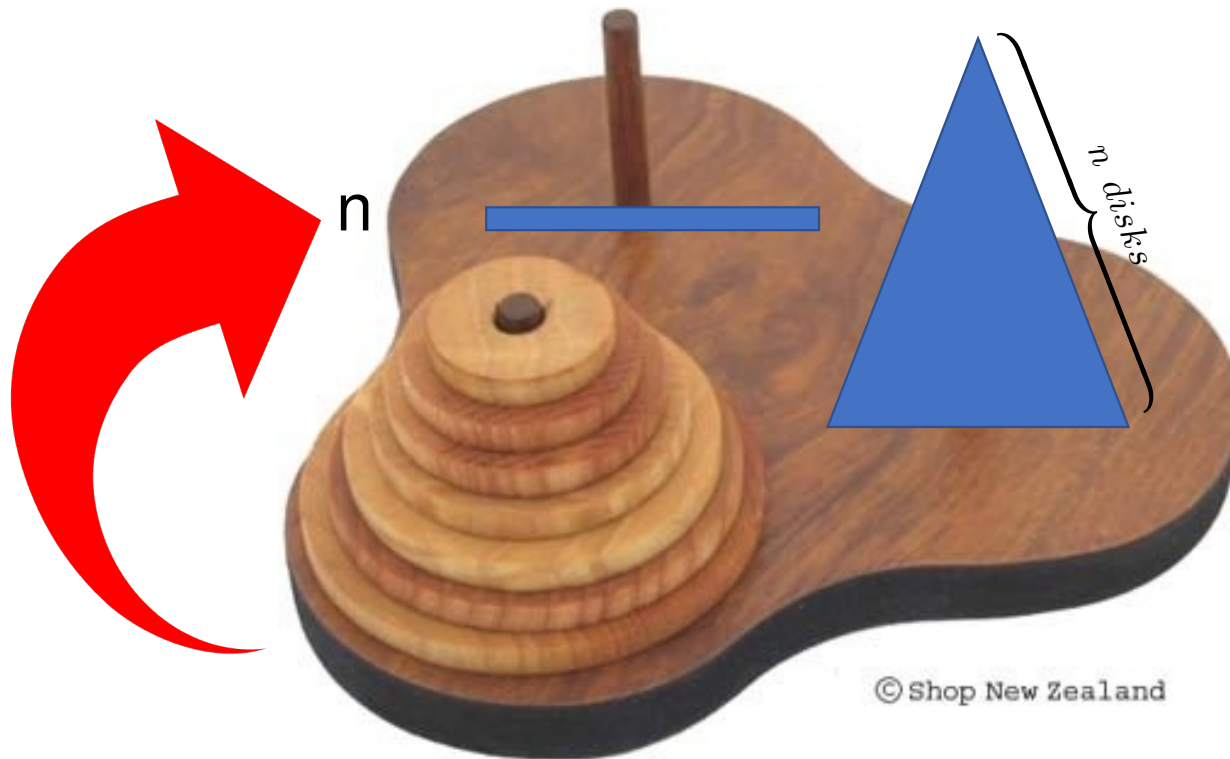
$$\text{hanoi}(d, n + 1) = \dots$$

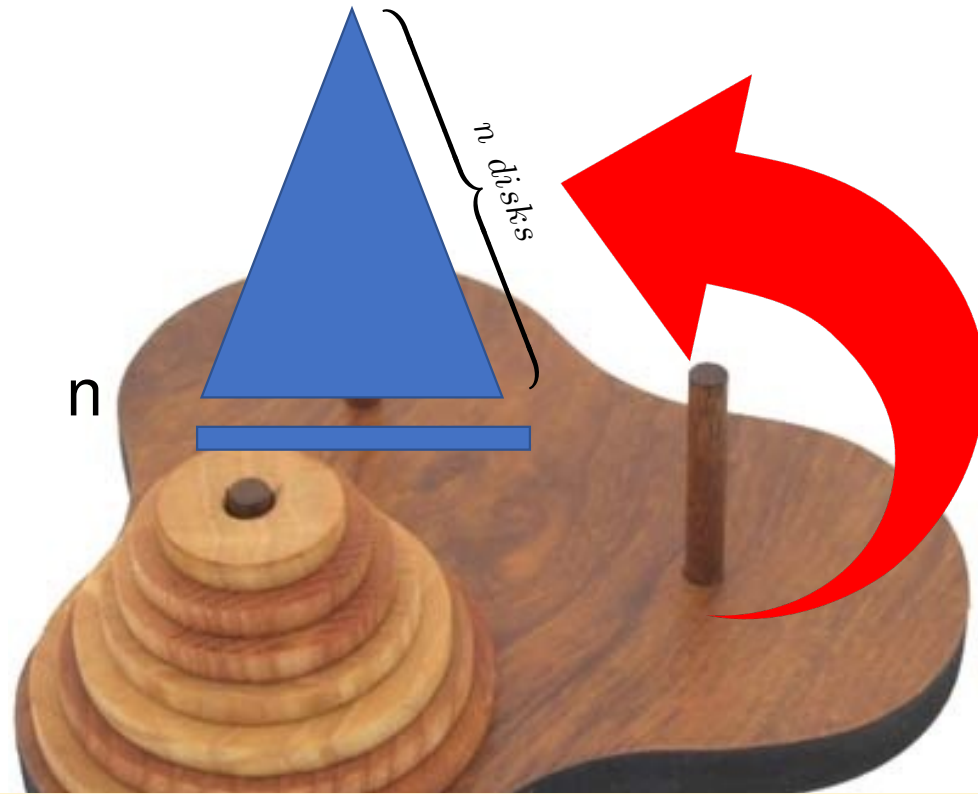


$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n)$$



$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)]$$





$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$

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$$\text{hanoi}(d, 0) = []$$

$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$



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HANOI TOWERS

$$\text{hanoi}(d, 0) = []$$

$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$

$$\text{divide}(d, 0) = \dots$$

$$\text{divide}(d, n + 1) = \dots (\neg d, n) \dots (n, d) \dots (\neg d, n)$$

HANOI TOWERS

$$\text{hanoi}(d, 0) = []$$

$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$

$$\text{divide}(d, 0) = \dots$$

$$\text{divide}(d, n + 1) = \dots (\neg d, n) \dots (n, d) \dots (\neg d, n)$$

$$\text{divide}(d, 0) = i_1 ()$$

$$\text{divide}(d, n + 1) = i_2 (\dots (\neg d, n) \dots (n, d) \dots (\neg d, n))$$

HANOI TOWERS

$$\text{hanoi}(d, 0) = []$$

$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$

$$\text{divide}(d, 0) = i_1 ()$$

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

HANOI TOWERS

$$\mathit{hanoi} (d, 0) = []$$

$$\mathit{hanoi} (d, n + 1) = \mathit{hanoi} (\neg d, n) ++ [(n, d)] ++ \mathit{hanoi} (\neg d, n)$$

$$\mathit{divide} :: \mathbb{B} \times \mathbb{N}_0 \rightarrow 1 + (\mathbb{N}_0 \times \mathbb{B}) \times (\mathbb{B} \times \mathbb{N}_0)^2$$

$$\mathit{divide} (d, 0) = i_1 ()$$

$$\mathit{divide} (d, n + 1) = i_2 ((n, d), ((\neg d, n), (\neg d, n)))$$

HANOI TOWERS

$$\text{hanoi}(d, 0) = []$$

$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) \times \text{hanoi}(\neg d, n)$$

divide :: \mathbb{B}

divide

divide (

$$\mathbf{B}(X, Y) = 1 + X + Y^2$$

$$\mathbf{T} = \text{BTree}(\mathbb{N}_0 \times \mathbb{B})$$

$$\times (\mathbb{B} \times \mathbb{N}_0)^2$$

$$((n, d), ((\neg d, n), (\neg d, n)))$$

HANOI TOWERS

$$\text{hanoi}(d, 0) = []$$
$$\text{hanoi}(d, n + 1) = \text{hanoi}(\neg d, n) ++ [(n, d)] ++ \text{hanoi}(\neg d, n)$$

```
hanoi = hyloB conquer divide
```

```
  where
```

```
    divide(d,0) = i1()
```

```
    divide(d,n+1) = i2((n,d),((not d,n),(not d, n)))
```

```
    conquer = either nil inord
```

```
    inord(a,(x,y)) = x ++ [a] ++ y
```



```
qSort = hyloB conquer divide
  where
    divide [] = i1 ()
    divide (h:t) = i2 (h,(s,l)) where (s,l) = part (<h) t
    conquer = either nil inord
```

```
hanoi = hyloB conquer divide
  where
    divide(d,0) = i1()
    divide(d,n+1) = i2((n,d),((not d,n),(not d, n)))
    conquer = either nil inord
    inord(a,(x,y)) = x ++ [a] ++ y
```

“What for all this”?... DEMO





Research
at Google

Lecture: The Google MapReduce

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

10/03/2014

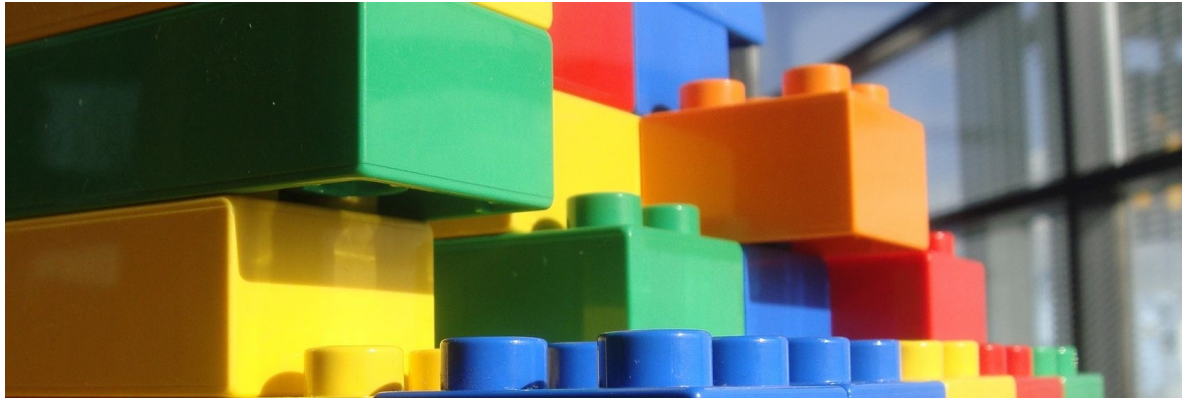
Romain Jacotin

romain.jacotin@orange.fr

$(g).Tf = (g).B(f, id)$

Wrapping up

PROGRAMMING BY CALCULATION



PROGRAMMING BY CALCULATION



***Software
Reuse***



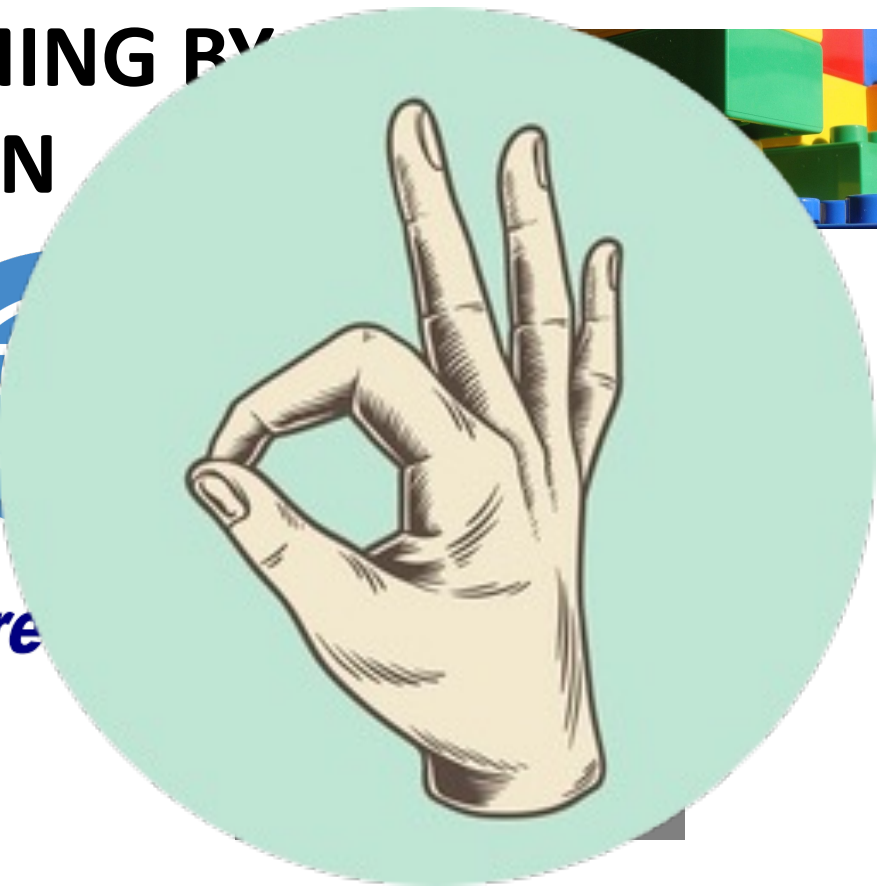
PROGRAMMING BY CALCULATION



***Software
Reuse***



PROGRAMMING BY CALCULATION



PROGRAMMING BY CALCULATION

*Basic
'Pointfree'
Calculus*

PROGRAMMING BY CALCULATION

*Basic
'Pointfree'
Calculus*

*Recursion
pointfree
calculus*

**PROGRAMMING
BY
CALCULATION**

*Basic
'Pointfree'
Calculus*

*Recursion
pointfree
calculus*

*Monadic
programming*

**PROGRAMMING
BY
CALCULATION**

T11-T12

T6-T10

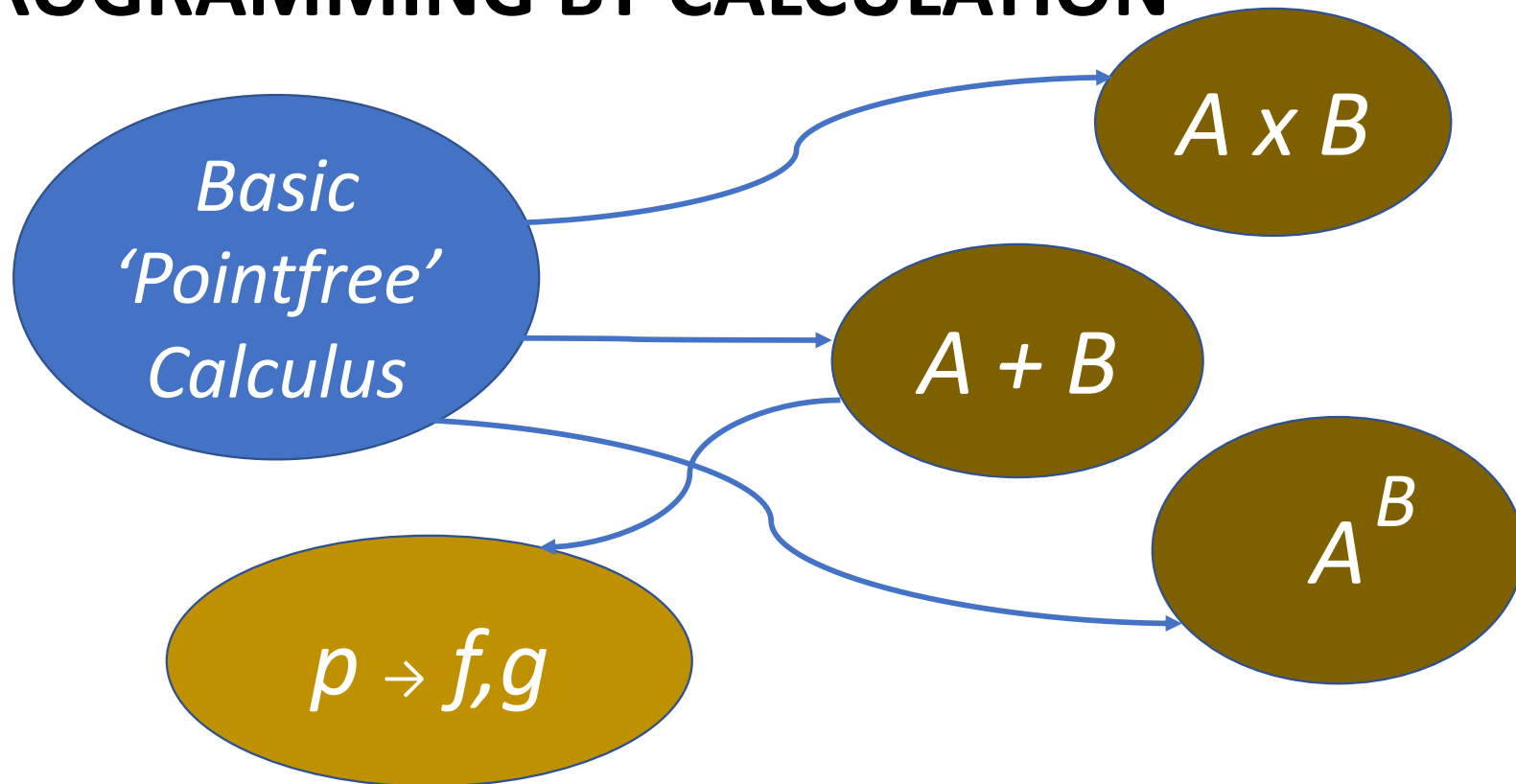
T1-T5

*Basic
'Pointfree'
Calculus*

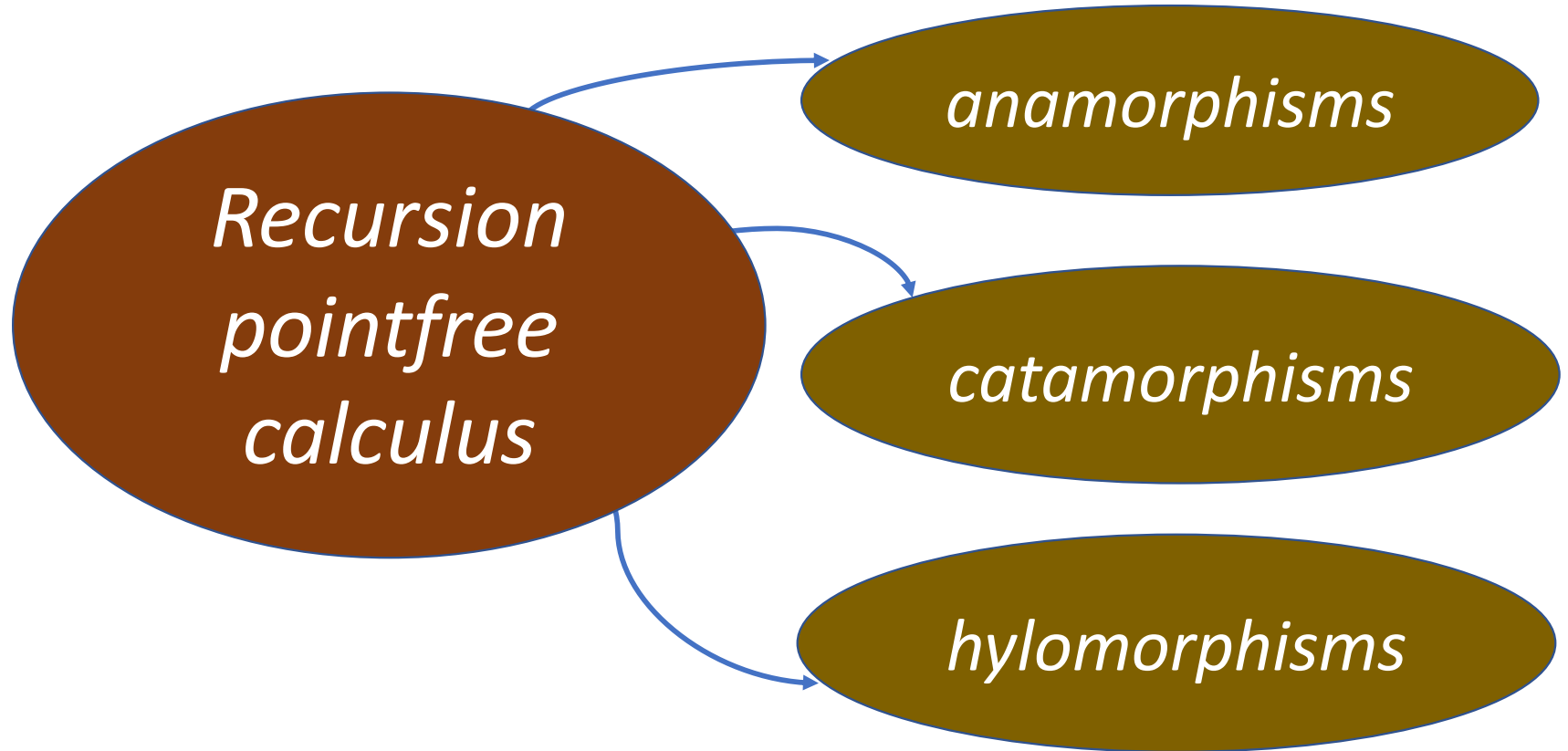
*Recursion
pointfree
calculus*

*Monadic
programming*

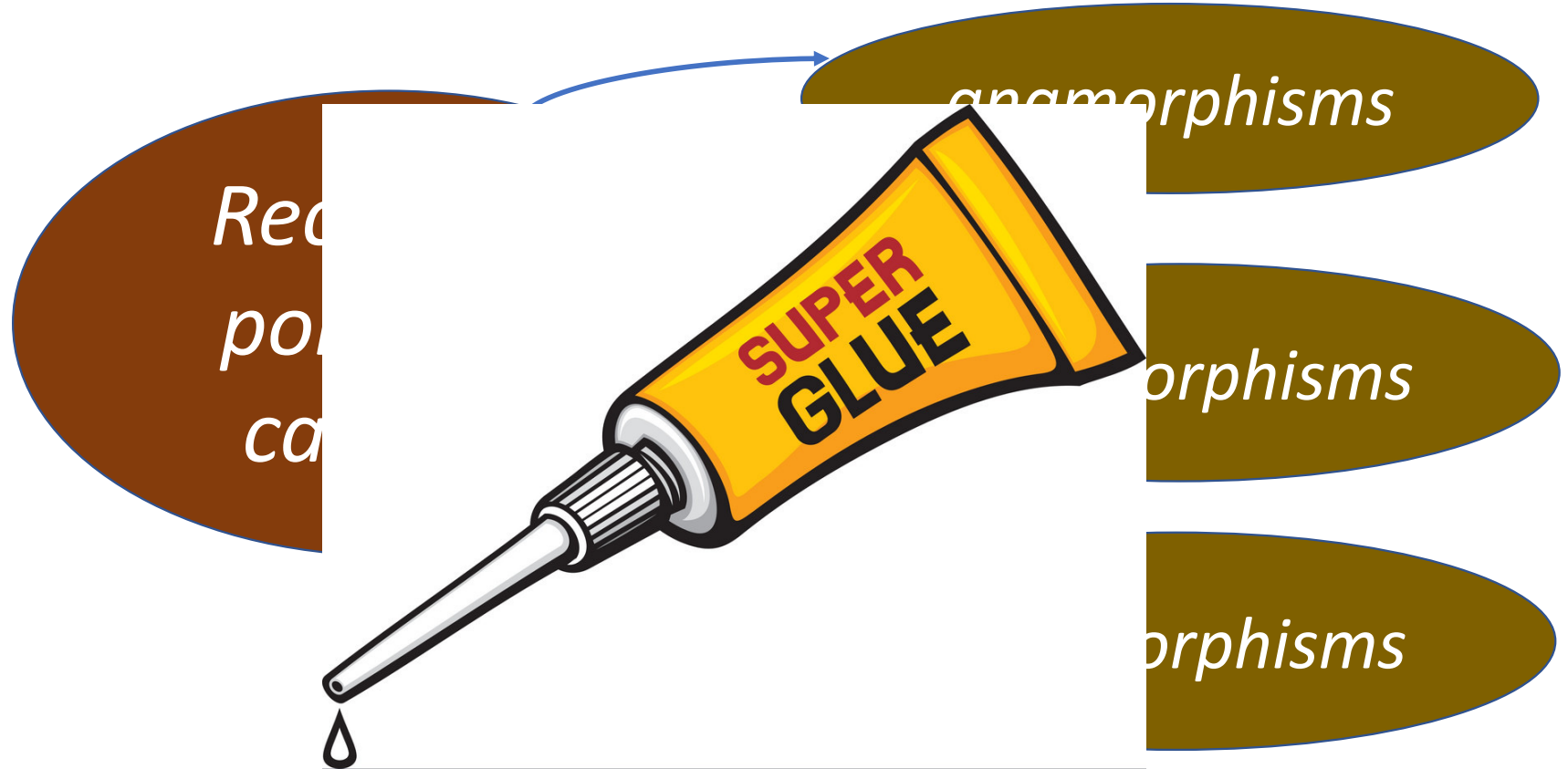
PROGRAMMING BY CALCULATION



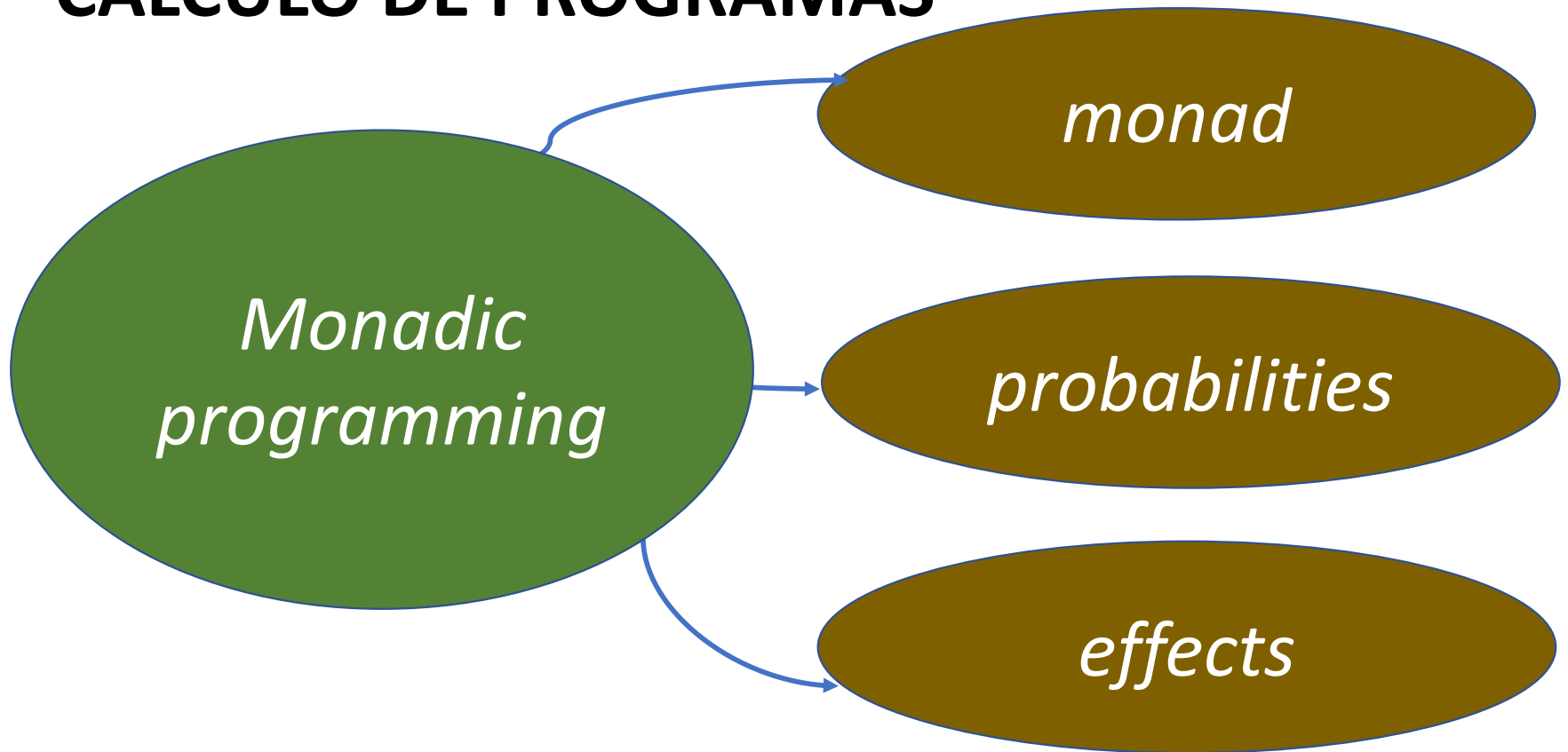
PROGRAMMING BY CALCULATION



PROGRAMMING BY CALCULATION

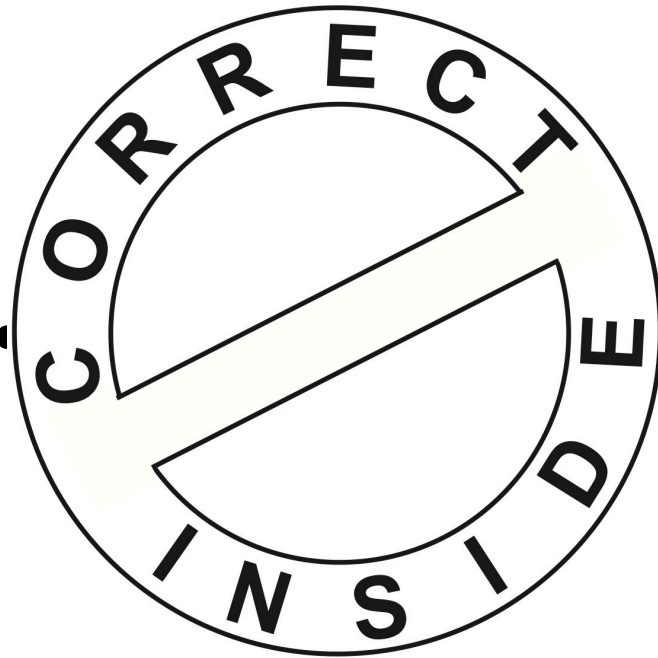


CÁLCULO DE PROGRAMAS



**Programming is
science, not
magic...**

**Programming is
science,
magic.**



The END (22/23)