## Monad 與副作用 單中杰 2022-08





https://drive.google.com/drive/folders/1oju5XL5sAlKe4n6T6dXfYpU1a1meVt6t?usp=sharing https://drive.google.com/drive/folders/1qRhU05xbDVoXqgYLUuBbGYcFavCPDdgy?usp=sharing

#### 暖身

#### 純遞迴 Tree1.hs

- 型別  $\rightarrow$  用途  $\rightarrow$  範例  $\rightarrow$  策略  $\rightarrow$  定義  $\rightarrow$  測試 (Felleisen et al., 2018)
- 先盡量把 sumTree 跟 productTree 寫得相似,
   然後才把它們抽象成更一般的、可重複利用的模組

#### 解譯器 Arith1.hs

- 隨機測試、property-based testing (Claessen and Hughes, 2000)
- 進階練習:定義變數 Arith2.hs
- 進階練習:用 Expr 的 fold 表達 eval

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個別的副作用

#### Accumulator passing

基本上副作用 (side effect) 就是一段程式除了把傳進來的引數變成傳回去的結果以外做的事情。

我們寫程式有時候會直觀想用副作用。印象最原始的是 state (狀態):

```
result := 0

sumTree (Leaf n) = result := result + n;

result

sumTree (Branch t_1 t_2) = sumTree t_1;

sumTree t_2
```

如此處理 Branch (Leaf 3) (Branch (Leaf 5) (Leaf 2)) 的方法是 ((0+3)+5)+2 還是 3+(5+(2+0)) 還是 3+(5+2)?

#### Accumulator passing

基本上副作用 (side effect) 就是一段程式除了把傳進來的引數變成傳回去的結果以外做的事情。

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TreeState1.hs 用 sumTree' 定義 sumTree

#### State threading

```
next := 0
     relabel (Leaf_{-}) = next := next + 1;
                             Leaf next
     relabel (Branch t_1 t_2) = Branch (relabel t_1) (relabel t_2)
TreeState2.hs 用 relabel' 定義 relabel
     seen := S.empty
     unique (Leaf n) = \mathbf{if} S.member n seen then False
                             else seen := S.insert n seen; True
     unique (Branch t_1 t_2) = unique t_1 && unique t_2
```

用 unique' 定義 unique (其實也可以用 unique' 定義 unique, 那是比較不副作用、比較能平行化的作法)



把心目中的願望講出來,以便實現。所以如果心目中 要的是副作用的話,就把副作用的意義講出來。

#### Local vs global state

#### UnionFind1.hs

```
testState :: State

testState = M.fromList

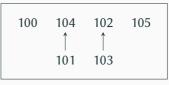
[(Key 100, Root 0 "A")

, (Key 101, Link (Key 104))

, (Key 102, Root 1 "C")

, (Key 103, Link (Key 102))
```

, (Key 104, Root 1 "E") , (Key 105, Root 0 "F")] Pointers, references, file system



 $fresh :: Info \rightarrow Key$ 

find ::  $Key \rightarrow (Key, Rank, Info)$ 

union::  $Key \rightarrow Key \rightarrow ()$ 

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#### Local vs global state

#### UnionFind1.hs

```
testState :: State

testState = M.fromList

[(Key 100, Root 0 "A")

, (Key 101, Link (Key 104))

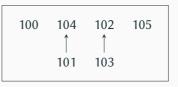
, (Key 102, Root 1 "C")

, (Key 103, Link (Key 102))

, (Key 104, Root 1 "E")

, (Key 105, Root 0 "F")]
```

Pointers, references, file system



fresh :: Info  $\rightarrow$  State  $\rightarrow$  (Key, State) find :: Key  $\rightarrow$  State  $\rightarrow$  (Key, Rank, Info, State) union :: Key  $\rightarrow$  Key  $\rightarrow$  State  $\rightarrow$  State

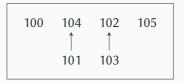
#### Local vs global state

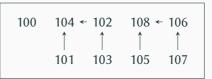
#### UnionFind1.hs

```
testState :: State
testState' :: State
testState' = M.fromList
  [ (Kev 100, Root 0 "A")
  , (Key 101, Link (Key 104))
  , (Key 102, Link (Key 104))
  , (Key 103, Link (Key 102))
  , (Key 104, Root 2 "E")
  , (Key 105, Link (Key 108))
  , (Key 106, Link (Key 108))
```

, (Key 107, Link (Key 106)) , (Key 108, Root 2 "I")]

#### Pointers, references, file system





#### State-threading interpreter

#### ArithState1.hs

進階練習:調撥記憶體 ArithState2.hs

data Expr = Lit Int | Add Expr Expr | Mul Expr Expr

| New Expr -- 把 Expr 的結果存到一個新 allocate 的

-- memory cell, 傳回該 cell 的 address

| Get Expr -- 把 Expr 的結果當作一個 address,

-- 傳回該 cell 目前的內容

| Put Expr Expr -- 把第一個 Expr 的結果當作一個 address,

-- 存入第二個 Expr 的結果並傳回

**type** *State* = [ *Int* ] -- 記憶體內容

這怎麼會有用?

#### **Exception** (Maybe)

#### 把中途跳脫的意義講出來

**data** Maybe  $a = Nothing \mid Just \ a$ **data** Either  $b \ a = Left \ b \mid Right \ a$ 

#### TreeMaybe1.hs

- decTree 碰到非正數是錯誤
- productTree 碰到零有捷徑

#### ArithMaybe1.hs

• 除以零是錯誤

正常產生的 Just 需要 "threading"

#### 二十一黑

每個數字遇到時都可以選擇要或是不要,但是一旦超過 21 就爆掉。 最後得分有哪些可能?

$$11, -1, 11 \rightarrow \{-1, 0, 10, 11, 21\}$$

#### TreeNondet1.hs

```
blackjack' :: Tree \rightarrow Int \rightarrow [Int]
blackjack' (Leaf n) total = if total + n > 21 then total
else amb [total, total + n]
blackjack' (Branch t_1 t_2) total = blackjack' t_2 (blackjack' t_1 total)
```

#### 用 blackjack' 定義 blackjack

```
concatMap :: (a \rightarrow [b]) \rightarrow [a] \rightarrow [b]

concatMap \ f \ as = concat \ (map \ f \ as)
```



Nondeterminism

#### Nondeterministic interpreter

ArithNondet1.hs

**data** 
$$Expr = \cdots \mid Amb \; Expr \; Expr$$

(McCarthy, 1963)

$$\frac{X^{2}}{+ Y^{2}} \xrightarrow{\text{SEND}} \frac{\text{TO}}{+ \text{MORE}} \\ \frac{+ Y^{2}}{Z^{2}} \xrightarrow{\text{MONEY}} \frac{\text{TO}}{- \text{OUT}}$$

$$concatMap :: (a \rightarrow [b]) \rightarrow [a] \rightarrow [b]$$

$$concatMap (\lambda x \rightarrow concatMap (\lambda y \rightarrow concatMap (\lambda z \rightarrow \text{if } x^{2} + y^{2} == z^{2} \\ \text{then } [(x, y, z)] \text{ else } [])$$

$$[0..9]$$

$$[0..9]$$

$$\frac{X^2}{+ Y^2} \xrightarrow{+ \text{MORE}} \xrightarrow{+ \text{MORE}} \xrightarrow{+ \text{GO}} \text{OUT}$$

$$concatMap :: (a \rightarrow [b]) \rightarrow [a] \rightarrow [b]$$

$$concatMap (\lambda x \rightarrow concatMap (\lambda y \rightarrow concatMap (\lambda z \rightarrow \text{if } x^2 + y^2 == z^2 \text{then } [(x, y, z)] \text{ else } [])$$

$$[0..9] \xrightarrow{\text{Fractions}} \text{好像—個命令}$$

**SEND** 

T<sub>0</sub>

#### 趁早檢查,免得做白工

$$\frac{\mathsf{X}^2}{\mathsf{Y}^2} \qquad \underbrace{\frac{\mathsf{SEND}}{\mathsf{HORE}}}_{\mathsf{HONEY}} \qquad \underbrace{\frac{\mathsf{+} \mathsf{GO}}{\mathsf{OUT}}}_{\mathsf{OUT}}$$

$$concatMap :: (a \to [b]) \to [a] \to [b]$$

$$concatMap \ (\lambda d \to concatMap \ (\lambda e \to concatMap \ (\lambda y \to \mathbf{if} \ mod \ (d + e) \ 10 == y \\ \mathbf{then} \dots \mathbf{else} \ [])$$

$$([0 \dots 9] \setminus [d]) \qquad \mathbf{f} \oplus \mathbf$$

9

```
SEND
                                                                        TO
                 + Y^2
                                          + MORE
                                                                     + G0
                                           MONFY
                                                                      OUT
type Digit = Int type Chosen = [Digit]
                                                            -- Crypta1.hs
digit :: Chosen \rightarrow [(Digit, Chosen)]
concatMap (\lambda(d, chosen) \rightarrow
                concatMap (\lambda(e, chosen) \rightarrow
                                 concatMap (\lambda(y, chosen) \rightarrow \mathbf{if} \ mod (d+e) \ 10 == y
                                                                   then ... else [])
                                               (digit chosen))
                              (digit chosen))
              (digit chosen)
```

$$\frac{\mathsf{X}^{2}}{\mathsf{Y}^{2}} \qquad \frac{\mathsf{SEND}}{\mathsf{HORE}} \qquad \frac{\mathsf{TO}}{\mathsf{+GO}}$$

$$\frac{\mathsf{+MORE}}{\mathsf{MONEY}} \qquad \frac{\mathsf{+GO}}{\mathsf{OUT}}$$

$$\mathbf{type} \ \textit{Digit} = \textit{Int} \qquad \mathbf{type} \ \textit{Chosen} = \left[ \left( \textit{Char}, \textit{Digit} \right) \right] \qquad -\text{-Crypta2.hs}$$

$$\textit{digit} :: \textit{Char} \rightarrow \textit{Chosen} \rightarrow \left[ \left( \textit{Digit}, \textit{Chosen} \right) \right]$$

$$\textit{concatMap} \ (\lambda(\textit{carry}, \textit{chosen}) \rightarrow \dots)$$

$$(\textit{add} \ \mathsf{'D'} \ \mathsf{'E'} \ \mathsf{'Y'} \dots)$$

適合自資料檔讀取新題

# Monad

 $eval(Lit\ v) = |eval(Add\ e_1\ e_2) =$ 

 $\lambda s \rightarrow (v, s)$   $\lambda s \rightarrow \mathbf{let}(v_1, s_1) = eval e_1 s$ 

10

[v]

Just v

*Just*  $v_1 \rightarrow \mathbf{case} \ eval \ e_2 \ \mathbf{of}$ *Nothing*  $\rightarrow$  *Nothing*  $Just v_2 \rightarrow Just (v_1 + v_2)$ 

 $concatMap (\lambda v_1 \rightarrow map (\lambda v_2 \rightarrow v_1 + v_2))$ 

case eval e<sub>1</sub> of

 $\lambda s \rightarrow \mathbf{let} (v_1, s_1) = eval \ e_1 \ s$ 

in  $(-v_1, s_1)$ 

*Nothing*  $\rightarrow$  *Nothing* 

 $lust v_1 \rightarrow lust (-v_1)$ 

case eval e<sub>1</sub> of

(eval  $e_1$ )

 $(v_2, s_2) = eval \ e_2 \ s_1$ 

in  $(v_1 + v_2, s_2)$ 

*Nothing*  $\rightarrow$  *Nothing* 

 $map (\lambda v_1 \rightarrow -v_1)$  $(eval e_1)$ 

 $(eval e_2)$ 

eval (Lit v) =	$ eval(Mul e_1 e_2)  =$		eva

### $val(If e_1 et ef) =$ $\lambda s \rightarrow \mathbf{let} \ (v_1, s_1) = eval \ e_1 \ s$

else ef)  $s_1$ 

else *ef* )

else ef))

10

in eval (if  $v_1$  then et

(Moggi, 1990; Wadler, 1995)

 $(v_2, s_2) = eval \ e_2 \ s_1$ in  $(v_1 \times v_2, s_2)$ 

 $concatMap (\lambda v_1 \rightarrow map (\lambda v_2 \rightarrow v_1 \times v_2))$ 

 $(eval e_1)$ 

 $(eval e_2)$ 

 $\lambda s \rightarrow \mathbf{let} (v_1, s_1) = eval \ e_1 \ s$ 

case eval e<sub>1</sub> of *Nothing*  $\rightarrow$  *Nothing Just*  $v_1 \rightarrow eval$  (**if**  $v_1$  **then** et

(eval  $e_1$ )

*Nothing* → *Nothing Just*  $v_1 \rightarrow \mathbf{case} \ eval \ e_2 \ \mathbf{of}$ 

case eval e<sub>1</sub> of

**坦到作田地象成 manad** 

 $\lambda s \rightarrow (v, s)$ 

Just v

[v]

*Nothing*  $\rightarrow$  *Nothing*  $Just v_2 \rightarrow Just (v_1 \times v_2)$ 

 $concatMap (\lambda v_1 \rightarrow eval (if v_1 then et$ 

# 把副作用抽象成 monad $eval(Lit\ v) = |eval(Mul\ e_1\ e_2) =$

 $(eval e_1)$ 

 $eval(If e_1 et ef) =$ 

 $\lambda s \rightarrow \mathbf{let} \ (v_1, s_1) = eval \ e_1 \ s$ 

in eval (if  $v_1$  then et

(eval  $e_1$ )

else ef)  $s_1$ 

else ef)

else ef))

10

(Moggi, 1990; Wadler, 1995)

 $\lambda s \rightarrow (v, s)$  $(v_2, s_2) = eval \ e_2 \ s_1$ in  $(v_1 \times v_2, s_2)$ case eval e<sub>1</sub> of return v =

*Nothing*  $\rightarrow$  *Nothing* Just v *Just*  $v_1 \rightarrow \mathbf{case} \ eval \ e_2 \ \mathbf{of}$ 

return  $v = \lambda s \rightarrow let(v_1, s_1) = eval e_1 s$ 

*Nothing*  $\rightarrow$  *Nothing Just*  $v_1 \rightarrow eval$  (**if**  $v_1$  **then** et

case eval e<sub>1</sub> of

[v]

*Nothing*  $\rightarrow$  *Nothing* 

 $concatMap (\lambda v_1 \rightarrow map (\lambda v_2 \rightarrow v_1 \times v_2))$ return v =

 $Just v_2 \rightarrow Just (v_1 \times v_2)$ 

 $(eval e_2)$ 

 $concatMap (\lambda v_1 \rightarrow eval (if v_1 then et$ 

# 把副作用抽象成 monad

 $eval(Lit\ v) = |eval(Mul\ e_1\ e_2) =$ 

# $eval(If e_1 et ef) =$

return ::  $a \rightarrow s \rightarrow (a, s)$   $(v_2, s_2) = eval \ e_2 \ s_1$   $(v_1 \times v_2, s_2)$  $return v = | case eval e_1 of$ return ::  $a \rightarrow Maybe \ a \ g \rightarrow Nothing$ 

 $\rightarrow$  case eval  $e_2$  of

 $concatMap (\lambda v_1 \rightarrow map (\lambda v_2 \rightarrow v_1 \times v_2))$ 

*Nothing*  $\rightarrow$  *Nothing* 

 $(eval e_2)$ 

return  $v = \lambda s \rightarrow \mathbf{let} (v_1, s_1) = eval \ e_1 \ s$ 

 $Just v_2 \rightarrow Just (v_1 \times v_2)$ 

*Just*  $v_1 \rightarrow eval$  (**if**  $v_1$  **then** et

*Nothing*  $\rightarrow$  *Nothing* 

case eval e<sub>1</sub> of

 $\lambda s \rightarrow \mathbf{let} (v_1, s_1) = eval \ e_1 \ s$ 

in eval (if  $v_1$  then et

 $concatMap (\lambda v_1 \rightarrow eval (if v_1 then et$ 

(eval  $e_1$ )

(Moggi, 1990; Wadler, 1995)

else ef)  $s_1$ 

else ef)

else ef))

10

return v =

# 把副作用抽象成 monad

 $eval(Lit\ v) = |eval(Mul\ e_1\ e_2) =$ 

# $eval(If e_1 et ef) =$

 $\lambda s \rightarrow \mathbf{let} \ (v_1, s_1) = eval \ e_1 \ s$ 

in eval (if  $v_1$  then et

 $\lambda s \rightarrow (v, s)$  $(v_2, s_2) = eval \ e_2 \ s_1$ in  $(v_1 \times v_2, s_2)$ case eval e<sub>1</sub> of return v =

 $concatMap :: (a \rightarrow \lceil b \rceil) \rightarrow \lceil a \rceil \rightarrow \lceil b \rceil$ 

return  $v = \lambda s \rightarrow \mathbf{let}(v_1, s_1) = eval e_1 s$ 

case eval e<sub>1</sub> of

*Nothing*  $\rightarrow$  *Nothing* Just v *Just*  $v_1 \rightarrow \mathbf{case} \ eval \ e_2 \ \mathbf{of}$ 

*Nothing*  $\rightarrow$  *Nothing Just*  $v_1 \rightarrow eval$  (**if**  $v_1$  **then** et

 $concatMap(\lambda v_1 \rightarrow map(\lambda v_2 \rightarrow v_1 \times v_2))$ 

return v =

 $map :: (a \rightarrow b) \rightarrow [a] \rightarrow [b]$  $map \ f = concatMap \ (return \circ f)$ 

(eval  $e_1$ )

else ef)

(Moggi, 1990; Wadler, 1995)

 $concatMap (\lambda v_1 \rightarrow eval (if v_1 then et$ 

else ef)  $s_1$ 

else ef))

10

 $\lambda s \rightarrow (v, s) \mid concatMap \ f \ m = \lambda s \rightarrow let \ (a, s_1) = m \ s \ in \ f \ a \ s_1$  $concatMap\ f\ m = uncurry\ f\circ m$  $concatMap :: (a \rightarrow Maybe \ b) \rightarrow Maybe \ a \rightarrow Maybe \ b$ return v =concatMap f Nothing = Nothing Just v

return v =[v]

concatMap f (Just a) = f a

(eval  $e_1$ )

 $concatMap (\lambda v_1 \rightarrow map (\lambda v_2 \rightarrow v_1 \times v_2))$ 

 $(eval e_2)$ 

(eval  $e_1$ )

 $concatMap (\lambda v_1 \rightarrow eval (if v_1 then et$ else ef))

10

#### 抽象完單

```
eval:: Expr \rightarrow M Int
eval(Lit v) = return v
eval (Add \ e_1 \ e_2) = concatMap \ (\lambda v_1 \rightarrow concatMap \ (\lambda v_2 \rightarrow return \ (v_1 + v_2))
                                                                     (eval e_2)
                                          (eval e_1)
先做 eval e_1 這個動作,再拿結果 u_1 去做另一個動作……
type M a = \begin{cases} State \rightarrow (a, State) \\ Maybe \ a \\ \lceil a \rceil \end{cases}
return :: a \rightarrow M a
                                                         -- unit, pure, eta η
concatMap :: (a \rightarrow M b) \rightarrow M a \rightarrow M b -- bind, \ll, \star^*
```

#### Monad laws

```
return :: a \rightarrow M a

(>>=) :: M a \rightarrow (a \rightarrow M b) \rightarrow M b

return a >>= k = k a

m >>= return = m

m >>= \lambda a \rightarrow (k \ a >>= l) = (m >>= k) >>= l
```

檢查具體特例。 Laws1.hs 用 Int 以外的型別呢?[] 以外的 monad 呢?

```
type M a = [a]

a = 9 :: Int

k = (\lambda n \rightarrow [1..n]) :: Int \rightarrow M Int

m = [5,3] :: M Int

l = (\lambda n \rightarrow [n, n \times 10]) :: Int \rightarrow M Int
```

#### Monad laws

```
return :: a \to M a

(>>=) :: M a \to (a \to M b) \to M b

return a >=> k = k a

m \gg return = m

m \gg \lambda a \to (k \ a \gg l) = (m \gg k) \gg l
```

#### 原本的定義:

return ::  $a \to M$  a fmap ::  $(a \to b) \to M$  a  $\to M$  b join ::  $M(M a) \to M$  a

# Type classes

#### 動機:很重要所以只說一遍

```
elem :: a \rightarrow [a] \rightarrow Bool

elem x = [] = False

elem x = (y : ys) = x == y || elem x ys
```

#### 動機:很重要所以只說一遍

```
elem :: a \rightarrow [a] \rightarrow Bool
elem x = False
elem x (y:ys) = x == y \parallel elem x ys
elemInt:: Int \rightarrow [Int] \rightarrow Bool
elemInt x  [ ] = False 
elemInt x (y:ys) = \frac{\text{eqInt } x \ y \| \text{elemInt } x \ ys}{\| y \|}
elemChar :: Char \rightarrow [Char] \rightarrow Bool
elemChar x (y:ys) = eqChar x y || elemChar x ys
```

### 動機:很重要所以只說一遍

```
elem :: a \rightarrow [a] \rightarrow Bool
elem x (y:ys) = x == y \parallel elem x ys
elemInt :: Int \rightarrow [Int] \rightarrow Bool
elemInt x \begin{bmatrix} \end{bmatrix} = False
elemInt x (y: ys) = \frac{\text{eqInt } x \ y}{\text{elemInt } x \ ys}
elemChar :: Char \rightarrow [Char] \rightarrow Bool
elemChar x (y:ys) = eqChar x y || elemChar x ys
elemBy :: (a \rightarrow a \rightarrow Bool) \rightarrow a \rightarrow [a] \rightarrow Bool
                              x = False
elemBy eq
                     x \quad (y:ys) = eq x y || elemBy eq x ys
elemBy eq
```

#### 模組的使用者

```
type Eq \ a = a \rightarrow a \rightarrow Bool
```

```
lookupBy :: Eq \ a \rightarrow a \rightarrow [(a, b)] \rightarrow Maybe \ b
lookupBy eq x  [] = Nothing
lookupBy eq x ((y, b) : ybs) = if eq x y then Just b
                                         else lookupBy eq x ybs
nubBy :: Eq a \rightarrow [a] \rightarrow [a]
nubBy eq xs = nubBy eq xs
nubBy' :: Eq a \rightarrow [a] \rightarrow [a] \rightarrow [a]
nubBy' eq [] seen = []
nubBy' eq (x:xs) seen = if elemBy eq x seen then nubBy' eq xs seen
                                 else x: nubBy' eq xs (x: seen)
```

## 模組的提供者

**type**  $Eq \ a = a \rightarrow a \rightarrow Bool$ 

```
egPair:: Eq a \rightarrow Eq b \rightarrow Eq (a, b)
eqPair eq_a eq_b (a_1, b_1) (a_2, b_2) = eq_a a_1 a_2 \&\& eq_b b_1 b_2
eqList:: Eq a \rightarrow Eq [a]
eqList eq a [] = True
eqList eq a(x:xs)(y:ys) = eq axy & eqList eq axsys
               _ = False
egList eg a _
egList (egPair egInt egChar) :: Eg [ (Int, Char) ]
```

class 
$$Eq\ a$$
 where  
(==) ::  $a \to a \to Bool$   
instance  $Eq\ Int$  where  
(==) =  $eqInt$   
(==) ::  $Int \to Int \to Bool$ 

instance Eq Char where
$$(==) = eqChar$$

$$(==) :: Char \rightarrow Char \rightarrow Bool$$

## 使用 method 時生成 constraint 累積成 context (Wadler and Blott, 1989)

```
class Eq a where
  (==):: a \rightarrow a \rightarrow Bool
instance Eq Int where
                                         instance Eq Char where
  (==) = egInt
                                            (==) = eqChar
elem :: (Eq a) \Rightarrow a \rightarrow [a] \rightarrow Bool
           x \quad [] = False
elem
elem
               x \quad (y: ys) = x == y \parallel elem x ys
lookup :: (Eq a) \Rightarrow a \rightarrow [(a, b)] \rightarrow Maybe b
lookup
             x \quad [] \quad = Nothing
lookup
                    x \quad ((y,b):ybs) = if x == y then Just b
                                            else lookup x ybs
```

## class Eq a where $(==):: a \rightarrow a \rightarrow Bool$ instance Eq Int where instance Eq Char where (==) = egInt(==) = eqCharinstance $(Eq a, Eq b) \Rightarrow Eq (a, b)$ where $(a_1, b_1) == (a_2, b_2) = a_1 == a_2 \&\& b_1 == b_2$ instance $(Eq a) \Rightarrow Eq [a]$ where [] ==[] = True(x:xs) == (y:ys) = x == y && xs == ys\_ == \_ = False

```
class Eq a where
   (==):: a \rightarrow a \rightarrow Bool
instance Eq Int where
                                                  instance Eq Char where
   (==) = egInt
                                                     (==) = eqChar
newtype Set a = MkSet [a]
instance (Eq \ a) \Rightarrow Eq \ (Set \ a) where
   MkSet \ xs == MkSet \ ys = all \ (\lambda x \rightarrow elem \ x \ ys) \ xs \&\&
                                  all (\lambda y \rightarrow elem \ y \ xs) \ ys
    (==):: Set a \rightarrow Set a \rightarrow Bool
```

## Default method implementation

#### class Eq a where

$$(==) :: a \rightarrow a \rightarrow Bool$$
  
 $(/=) :: a \rightarrow a \rightarrow Bool$   
 $x /= y = not (x == y)$   
 $x == y = not (x /= y)$ 

## Class contexts (superclasses)

#### class Eq a where

$$(==) :: a \rightarrow a \rightarrow Bool$$

$$(/=) :: a \rightarrow a \rightarrow Bool$$

$$x /= y = not (x == y)$$

$$x == y = not (x /= y)$$

$$class (Eq a) \Rightarrow Ord a \text{ where}$$

$$(<), (\leqslant), (>), (\geqslant) :: a \rightarrow a \rightarrow Bool$$

$$x < y = not (x == y) && (x \leqslant y)$$

$$x > y = not (x == y) && not (x \leqslant y)$$

$$x \geqslant y = (x == y) && not (x \leqslant y)$$
...

## There's no type class like Show type class

## class Eq a where $(==):: a \rightarrow a \rightarrow Bool$ $(/=) :: a \rightarrow a \rightarrow Bool$ $x \neq v = not (x == v)$ x == v = not (x /= v)class $(Eq a) \Rightarrow Ord a$ where $(<), (\leq), (>), (\geq) :: a \rightarrow a \rightarrow Bool$ $x < y = not (x == y) \&\& (x \le y)$ $x > y = not (x == y) \&\& not (x \le y)$ $x \geqslant y = (x == y) \parallel not (x \leqslant y)$ . . .

**class** *Show* a **where** *show* ::  $a \rightarrow String...$ 

```
class Monad m where
```

```
return :: a \rightarrow m a

(>=) :: m a \rightarrow (a \rightarrow m b) \rightarrow m b

newtype State s a = MkState { runState :: s \rightarrow (a, s) }

instance Monad (State s) where

return a = MkState (\lambda s \rightarrow (a, s))

m \gg k = MkState (\lambda s \rightarrow let (a, s') = runState m s

in runState (k a) s')
```

至於 Maybe 與 [] 的 Monad instances 則已有內建

```
class Monad m where
```

```
return :: a \to m a 

(>=) :: m \ a \to (a \to m \ b) \to m \ b   MkState :: (s \to (a, s)) \to State \ s \ a 

newtype State s \ a = MkState \ \{ runState :: s \to (a, s) \} 

instance Monad (State s) where  runState :: State s \ a \to (s \to (a, s)) 

return a = MkState \ (\lambda s \to (a, s)) 

m \gg k = MkState \ (\lambda s \to let \ (a, s') = runState \ m \ s 

in runState (k \ a) s')
```

至於 Maybe 與 [] 的 Monad instances 則已有內建

(Jones, 1995a,b)

```
class Monad m where
         return :: a \rightarrow m a
         (\gg) :: m \ a \rightarrow (a \rightarrow m \ b) \rightarrow m \ b MkState :: (s \rightarrow (a, s)) \rightarrow State s \ a
     newtype State s = MkState \{ runState :: s \rightarrow (a, s) \}
                                                                  \neg runState :: State s a \rightarrow (s \rightarrow (a, s))
     instance Monad (State s) where
         return a = MkState (\lambda s \rightarrow (a, s))
         m \gg k = MkState (\lambda s \rightarrow \mathbf{let} (a, s') = runState m s
                                                in runState (k \ a) \ s')
return :: a \rightarrow State \ s \ a
     (\gg) :: State s \ a \rightarrow (a \rightarrow State \ s \ b) \rightarrow State \ s \ b
```

至於 Maybe 與 [] 的 Monad instances 則已有內建

## 輕鬆實作 superclasses

```
class Functor m where
  fmap :: (a \rightarrow b) \rightarrow m \ a \rightarrow m \ b
class (Functor m) \Rightarrow Applicative m where
   pure :: a \rightarrow m a
   (\langle * \rangle) :: m (a \rightarrow b) \rightarrow m a \rightarrow m b
class (Applicative m) \Rightarrow Monad m where
   return: a \rightarrow m a
   (\gg) :: m \ a \rightarrow (a \rightarrow m \ b) \rightarrow m \ b
instance Functor (State s) where fmap = liftM
instance Applicative (State s) where pure = return; (\langle * \rangle) = ap
```

## 來寫範例吧!

ArithMonad1.hs

ArithMonad2.hs

ArithMonad3.hs

Imperative programming

#### I/O

ArithIO1.hs 「輸入」、「輸出」是什麼意思呢?

適合用什麼 monad 來表達呢?

#### I/O

#### ArithI01.hs 「輸入」、「輸出」是什麼意思呢?

## 適合用什麼 monad 來表達呢?

**data** 
$$IO$$
  $a = Return a$   
 $\mid Input (Int \rightarrow IO a)$   
 $\mid Output Int (IO a)$ 

### 對程式而言,外界是一個抽象的 monad

A value of type IO a is an "action" that, when performed, may do some input/output, before delivering a value of type a.

**type** 
$$IO$$
  $a = World \rightarrow (a, World)$ 

(Peyton Jones, 2001)

```
int main() {
	return putchar(toupper(getchar()));
}

可譯為
	main = getChar \gg \lambda c \rightarrow putChar(toUpper c)
```

```
int main() {
    return putchar(toupper(getchar()));
                            putChar :: Char \rightarrow IO ()
可譯為
             = getChar \gg \lambda c \rightarrow put\check{C}har (toUpper c) :: ???
    main
            getChar :: IO Char
                                      toUpper :: Char \rightarrow Char
```

$$\frac{\mathbb{P}\mathsf{UTC}}{\{\mathbb{E}[\mathit{putChar}\,c]\} \xrightarrow{!c} \{\mathbb{E}[\mathit{return}\,()]\}} \qquad \frac{\mathbb{E}[\mathit{putChar}\,c]}{\{\mathbb{E}[\mathit{getChar}]\} \xrightarrow{?c} \{\mathbb{E}[\mathit{return}\,c]\}} \qquad \mathcal{E}[\mathit{putChar}\,c]} \qquad \mathcal{E}[\mathit{putChar}\,c] \qquad \mathcal{E}[\mathit{putChar}\,c$$

$$\frac{}{\{\mathbb{E}[putChar\ c]\} \xrightarrow{!c} \{\mathbb{E}[return\ ()]\}} \frac{}{\{\mathbb{E}[getChar]\} \xrightarrow{?c} \{\mathbb{E}[return\ c]\}} \frac{}{\{\mathbb{E}[return\ N)\}} \frac{}{\{\mathbb{E}[return\ N)\}} \frac{}{\{\mathbb{E}[M]\} \to \{\mathbb{E}[V]\}} \frac{}{\{\mathbb{E}[M]\} \to \{\mathbb{E}[V]\}} FUN}$$

Semantics 以 labeled transition 在外、denotation 在內

$$main = getChar \gg \lambda c \rightarrow putChar (toUpper c)$$

$$main = \mathbf{do} \ c \leftarrow getChar$$
 $putChar \ (toUpper \ c)$ 

```
getChar \gg \lambda c_2 \rightarrow
           putChar (toUpper c_1) \gg \lambda() \rightarrow
           putChar (toLower c_2)
main = \mathbf{do} \ c_1 \leftarrow getChar
               c_2 \leftarrow getChar
                () \leftarrow putChar (toUpper c_1)
                putChar (toLower c_2)
```

 $main = getChar \gg \lambda c_1 \rightarrow$ 

```
main = \mathbf{do} \ c_1 \leftarrow getChar
c_2 \leftarrow getChar
putChar \ (toUpper \ c_1)
putChar \ (toLower \ c_2)
```

```
 \begin{aligned} \textit{main} &= \textit{getChar} \gg \lambda c_1 \rightarrow \\ &\textit{getChar} \gg \\ &\textit{putChar} \left( \textit{toUpper } c_1 \right) \gg \\ &\textit{putChar} \left( \textit{toLower } c_1 \right) \end{aligned} \\  > (\gg) :: \left( \textit{Monad } m \right) \Rightarrow \textit{m } a \rightarrow \textit{m } b \rightarrow \textit{m } b \\ &\textit{m} \gg \textit{n} = \textit{m} \gg \setminus_{-} \rightarrow \textit{n} \end{aligned}
```

```
main = \mathbf{do} \ c_1 \leftarrow getChar
getChar
putChar \ (toUpper \ c_1)
putChar \ (toLower \ c_1)
```

## Do notation 用用看

把這個 interpreter	用這個 monad	在這裡寫成 do notation:
ArithMonad1.hs	State Int	→ ArithDo1.hs
ArithMonad2.hs	Maybe	$\rightarrow$ ArithDo2.hs
ArithMonad3.hs	[]	$\rightarrow$ ArithDo3.hs
ArithIO1.hs	Ю	→ ArithDo4.hs

## Do notation 用用看

把這個 interpreter	用這個 monad	在這裡寫成 do notation:
ArithMonad1.hs	State Int	→ ArithDo1.hs
ArithMonad2.hs	Maybe	$\rightarrow$ ArithDo2.hs
ArithMonad3.hs	[]	$\rightarrow$ ArithDo3.hs
ArithIO1.hs	10	$\rightarrow$ ArithDo4.hs

**import** Control.Monad.Trans.State **instance** Monad (State s) **where** ... runState :: State s  $a \rightarrow (s \rightarrow (a, s))$ state ::  $(s \rightarrow (a, s)) \rightarrow$  State s a

## Do notation 表達了 monad laws 的 imperative 直覺

#### Left identity

return 
$$a \gg \lambda x \to k x = k a$$

$$\begin{array}{ccc} \mathbf{do} & x \leftarrow return \ a \\ & k \ x \end{array} = k \ a$$

## **Right identity**

$$m \gg \lambda x \rightarrow return x = m$$

$$\begin{array}{ccc} \mathbf{do} & x \leftarrow m \\ return & x \end{array} = m$$

### Associativity

$$m \gg \lambda a \rightarrow (k \ a \gg \lambda b \rightarrow l \ b) = (m \gg \lambda a \rightarrow k \ a) \gg \lambda b \rightarrow l \ b$$

$$\begin{array}{c} \mathbf{do} \ a \leftarrow m \\ b \leftarrow k \ a \\ l \ b \end{array} = \begin{array}{c} \mathbf{do} \ b \leftarrow \mathbf{do} \ a \leftarrow m \\ k \ a \\ l \ b \end{array}$$

## 單一程式可以應用於各種 monad

```
traverse :: (Monad m) ⇒ (a \rightarrow m \ b) \rightarrow [a] \rightarrow m \ [b] -- 又名 mapM
traverse f[] = return []
traverse f(a:as) = \mathbf{do} \ b \leftarrow f \ a
bs \leftarrow traverse \ f \ as
return (b:bs)
```

## 有什麼用呢?

```
renumber "hello" = [0, 1, 2, 3, 4]

choices [2, 3] = [[0, 0], [0, 1], [0, 2], [1, 0], [1, 1], [1, 2]]

dec [2, 5, 3] = Just [1, 4, 2]

dec [2, 0, 3] = Nothing
```

再多找一些用途! Traverse1.hs

## 單一程式可以應用於各種 monad

```
data Tree = Leaf Int | Branch Tree Tree

deriving (Eq, Show)

traverseTree :: (Monad m) \Rightarrow (Int \rightarrow m Int) \rightarrow Tree \rightarrow m Tree

traverseTree f (Leaf n) = do n' \leftarrow f n

return (Leaf n')

traverseTree f (Branch t<sub>1</sub> t<sub>2</sub>) = do t'<sub>1</sub> \leftarrow traverseTree f t<sub>1</sub>

t'_2 \leftarrow traverseTree f t<sub>2</sub>

return (Branch t'<sub>1</sub> t'<sub>2</sub>)
```

有什麼用呢?Traverse1.hs

很多資料結構只要提供 traverse 就是用途很廣的 API 了。

## 自己的迴圈自己寫

#### Loops1.hs

- 1. forever action = action ≫ forever action 型別為何?
- 2. 用 forever 寫一個一直讀一行(用 getLine)然後馬上寫出(用 putStrLn)的程式。
- 3.  $iterateM_f x = f x \gg iterateM_f$ 型別為何?
- 4. 用 iterateM\_ 寫一個一直讀數字然後顯示累計總和的程式。
- 5. forever (getChar > putChar) 有哪些 labeled transition sequences?
- 6.  $iterateM_{-}(\lambda c \rightarrow putChar\ c \gg getChar)$  'X' 有哪些 labeled transition sequences?

## 自己的迴圈自己寫

#### Loops2.hs

- 1. 定義 replicateM\_:: (Monad m) ⇒ Int → m a → m () 使得 replicateM\_n action 的意思是把 action 重複 n 遍。有什麼用?
- 3. 定義 while :: (Monad m) ⇒ m Bool → m a → m () 使得 while cond action 的意思是重複做 action 直到 cond 的結果成為 False 為止。有什麼用?

## 兩種 monad 的定義可以互相轉換

Join1.hs

return:: 
$$a \to m \ a$$
  
fmap::  $(a \to b) \to m \ a \to m \ b$   
join::  $m \ (m \ a) \to m \ a$   
用 fmap 和 join
  
定義 >=

定義 fmap 和 join
  
return::  $a \to m \ a$ 

(>=) ::  $m \ a \to (a \to m \ b) \to m \ b$ 

# 組合副作用

## 邊 state 邊 IO

**newtype** StateIO s a = MkStateIO {  $runStateIO :: s \rightarrow IO (a, s)$  }

StateI01.hs

- 完成 instance Monad (StateIO s)
- 新語法:do 的中間是可以穿插 let 的

StateI02.hs

- 提供 change 這個 operation 以便 state 動作
- 提供 lift 這個 operation 以便 IO 動作
- 新語法:(+n) 就是  $\lambda s \rightarrow s + n$  的意思

## 邊 state 邊 exception

StateMaybe1.hs = StateMaybe2.hs

- puzzle1和 puzzle2應該怎樣?
- ・定義 newtype M a 並完成 instance Monad M
- 提供 get 和 put 這兩個 operation 以便 state 動作
- 提供 divide 這個 operation 以便 exception 動作
- 找兩組不同的解法!

## 邊 state 邊 nondeterminism

StateNondet1.hs = StateNondet2.hs

- puzzle1和 puzzle2應該怎樣?
- ・定義 newtype M a 並完成 instance Monad M
- 提供 get 和 put 這兩個 operation 以便 state 動作
- 提供 amb 這個 operation 以便 nondeterminism 動作
- 找兩組不同的解法!

Crypta3.hs 邁向 logic programming (Fischer et al., 2011)

**type** Parser  $a = String \rightarrow [(a, String)]$ parse (many1 number) "12345" "A parser for things is a function from strings to lists of pairs of things and strings."

Parsing1.hs 把 tree 這個 Tree 的 parser 寫完

Parsing2.hs 寫一個 parser combinator 把「某種項目的 parser」以及「某種隔間的 parser」組合成為「一串項目的 parser」,叫做 sepby1

Parsing3.hs 把 expr 這個 parser 加上減法的 syntactic sugar

**type**  $Prob\ a = [(a, Float)]$ 

Prob1.hs 定義 die 擲骰子

Prob2.hs 用 M(也就是 Data.Map 模組)裡的 M.toList 以及 M.fromListWith 定義 coalesce

Prob3.hs 在 countL 或 countR 內部呼叫 coalesce, 使得 coalesce (countL 100 0.5) 或 coalesce (countR 100 0.5) 變得很快

Prob4.hs 不僅用 coalesce,也得用 let 或 where,使得 coalesce (countL 100 0.5) 和 coalesce (countR 100 0.5) 都很快

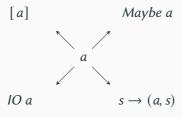
## Conditional probability

$$\mathbb{P}(A, B) = \mathbf{do} \ a \leftarrow \mathbb{P}(A) = \mathbf{do} \ b \leftarrow \mathbb{P}(B)$$
$$b \leftarrow \mathbb{P}(B \mid A = a) \qquad a \leftarrow \mathbb{P}(A \mid B = b)$$
$$return \ (a, b) \qquad return \ (a, b)$$

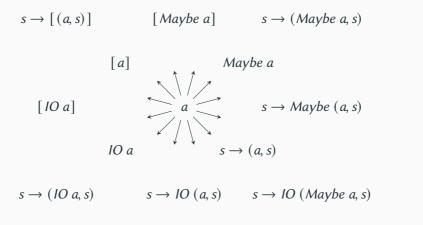
### Prob5.hs 丟一枚一元銅板、一枚五元銅板。

- 看到頭像的機率為何?
   若看到頭像,則一元銅板是頭像的機率為何?
- 沒有頭像的機率為何?
   若沒有頭像,則一元銅板是頭像的機率為何?

## 有無窮多種 monad



# 有無窮多種 monad



### Monad transformers (Liang et al., 1995)

- 把任一個 monad  $\lceil m \rfloor$  加一層功能,變成另一個 monad  $\lceil t m \rfloor$
- 例如 t = StateT Int, MaybeT,...

## Monad transformers (Liang et al., 1995)

- 把任一個 monad  $\lceil m \rfloor$  加一層功能,變成另一個 monad  $\lceil t m \rfloor$
- 例如  $t = StateT Int, MaybeT, ...:(Type \rightarrow Type) \rightarrow (Type \rightarrow Type)$
- 不一定 commutative

#### Monads

- 把任一個 type「a」加上副作用,變成
   「產生 a 結果的 computation/action」的 type「m a」
- 例如  $m = State Int, Maybe, [], IO, ...: Type \rightarrow Type$
- 其他 type constructors 例如  $(,), (\rightarrow) :: Type \rightarrow Type \rightarrow Type$

## Types

- 有 value 進駐 (inhabit) 的
- 例如 Int, Bool, Char, Int → Int → Bool, . . . :: Type

## Composing monad transformers

```
StateT:: Type \rightarrow (Type \rightarrow Type) \rightarrow (Type \rightarrow Type)

StateT s m a = s \rightarrow m (a, s)

StateT s IO s = s \rightarrow IO (a, s)

StateT s [] a = s \rightarrow [(a, s)]

StateT s Identity a = s \rightarrow (a, s)

Identity a = a
```

## Composing monad transformers

```
StateT:: Type \rightarrow (Type \rightarrow Type) \rightarrow (Type \rightarrow Type)
StateT s m a = s \rightarrow m (a, s)
StateT S IO s = s \rightarrow IO(a, s)
StateTs [] a = s \rightarrow [(a, s)]
StateT s Identity a = s \rightarrow (a, s)
Identity a
            = a
MaybeT :: (Type \rightarrow Type) \rightarrow (Type \rightarrow Type)
MaybeT m a = m (Maybe a)
StateT s (MaybeT Identity) a = ???
MaybeT (StateTs Identity) a = ???
```

## Composing monad transformers

```
StateT:: Type \rightarrow (Type \rightarrow Type) \rightarrow (Type \rightarrow Type)
StateT s m a = s \rightarrow m (a, s)
StateT S IO s = s \rightarrow IO(a, s)
StateT s [] a = s \rightarrow [(a, s)]
StateT s Identity a = s \rightarrow (a, s)
Identity a
             = a
newtype StateT s m a = MkStateT { runStateT :: s \rightarrow m(a, s) }
newtype MaybeT m a = MkMaybeT \{ runMaybeT :: m (Maybe a) \}
class MonadTrans t where
   lift :: (Monad m) \Rightarrow m a \rightarrow t m a
```

## Monad transformers 用用看

#### StateI03.hs

- 使用共用的 lift
- 使用共用的 modify 和 get 來定義 change

### StateMaybe3.hs

• 使用共用的 *empty* 或 *lift* 來定義 *divide* 

### StateMaybe4.hs

- 使用共用的 lift
- 使用共用的 empty
   來定義 divide

### StateNondet3.hs

使用共用的 empty (或 lift) 以及 〈|〉
 來定義 amb

### StateNondet4.hs

- 使用共用的 lift
- 使用共用的 empty 以及 (|)
   來定義 amb

# 自動微分

## 機器學習

學習 Linear.hs →

學習一個神經元 Perceptron.hs →

學習神經網路 Network.hs

為了自動調整參數們,所以需要把 loss 相對於參數們微分

- 1. 把 loss 表達為 Expr, 其中每個參數是一個 Var Diff1.hs 把 eval 寫完,增加 Pow 與 Exp 的 cases
- 用 dual number 進行 forward automatic differentiation
  (為每個參數都得重跑一遍)
   用 instance Arbitrary Expr 產生隨機 Expr 用來測試 (Claessen and

用 traverse 產生隨機 Params 用來起始學習過程
randomParams perceptronLoss >= iterateM\_ (optimize 999 perceptronLoss)
randomParams networkLoss >= iterateM\_ (optimize 999 networkLoss)
Diff2.hs 把 eval2 寫完,增加 Pow 與 Exp 的 cases

- 3. 增加慣性 (*Inertia*) 加速學習 Diff3.hs 把 *randomParams*, *stepParams*, *optimize* 裡處裡慣性的部份寫 完
- 4. 一次對所有參數微分:(Float, Delta) = (Float, M.Map Name Float) Diff4.hs 用 dScale 把 eval3 寫完,增加 Pow 與 Exp 的 cases
- 5. 把 Delta 用一個有 DLet 的語法樹表示 用 state monad 以 preserve sharing! Diff5.hs 用 deltaLet 和 DScale 把 eval4 寫完,增加 Pow 與 Exp 的 cases

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