### Instance of $\rightarrow^+$

```
newtype a \rightarrow^+ b = AddFun (a \rightarrow b)
instance Category (\rightarrow^+) where
  type Obj (\rightarrow^+) = Additive
  id = AddFun id
  AddFun g \circ AddFun f = AddFun (g \circ f)
instance Monoidal (\rightarrow^+) where
  AddFun f \times AddFun \ g = AddFun \ (f \times g)
instance Cartesian (\rightarrow^+) where
  exl = AddFun exl
  exr = AddFun exr
  dup = AddFun dup
```

#### Fork and Join

- $\nabla$  :: Cartesian  $k \Rightarrow (a' k' c) \rightarrow (a' k' d) \rightarrow (a' k' (c \times d))$
- $\triangle$  :: Cartesian  $k \Rightarrow (c' k' a) \rightarrow (d' k' a) \rightarrow ((c+d)' k' a)$

## ...Machine Learning...

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## titulo

### titulo

#### Fork e Join

- ( $\Lambda$ ) :: Cartesian k  $\Rightarrow$  (a 'k' c)  $\rightarrow$  (a 'k' d)  $\rightarrow$  (a 'k' (c  $\times$  d))
- $(\nabla)$  :: Cartesian  $k \Rightarrow (c \ 'k' \ a) \rightarrow (d \ 'k' \ a) \rightarrow ((c \times d) \ 'k' \ a)$

#### instancia de $\rightarrow^+$

```
newtype a \rightarrow<sup>+</sup> b = AddFun (a \rightarrow b)
instance Category (\rightarrow^+) where
       type Obj (\rightarrow^+) = Additive
       id = AddFun id
       AddFun g \circ AddFun f = AddFun (g \circ f)
instance Monoidal (\rightarrow^+) where
       AddFun f \times AddFun g = AddFun (f \times g)
instance Cartesian (\rightarrow<sup>+</sup>) where
       exl = AddFun exl
       exr = AddFun exr
       dup = AddFun dup
```

### instancia de $\rightarrow^+$

```
instance Cocartesian (\rightarrow^+) where
          inl = AddFun inlF
          inr = AddFun inrF
          jam = AddFun jamF
in F:: Additive b \Rightarrow a \rightarrow a \times b
inrF :: Additive a \Rightarrow b \rightarrow a \times b
jamF :: Additive a \Rightarrow a \times a \rightarrow a
inlF = \lambda a \rightarrow (a, 0)
inrF = \lambdab \rightarrow (0, b)
jamF = \lambda(a, b) \rightarrow a + b
```

# definição de NumCat

```
class NumCat k a where
      negateC :: a 'k' a
      addC :: (a \times a) 'k' a
      mulC :: (a \times a) 'k' a
       . . .
instance Num a \Rightarrow NumCat (\rightarrow) a where
      negateC = negate
      addC = uncurry (+)
      mulC = uncurry(\cdot)
```

$$D (negate u) = negate (D u)$$

$$D (u + v) = D u + D v$$

$$D(u \cdot v) = u \cdot Dv + v \cdot Du$$

- Impreciso na natureza de u e v.
- Algo mais preciso seria defenir a diferenciação das operações em si.

#### **class** Scalable k a **where**

scale ::  $a \rightarrow (a 'k' a)$ 

instance Num a  $\Rightarrow$  Scalable ( $\rightarrow$ +) a where scale a = AddFun ( $\lambda$ da  $\rightarrow$  a  $\cdot$  da)

#### instance NumCat D where

negateC = linearD negateC

addC = linearD addC

 $\mathsf{mulC} = \mathsf{D} \; (\lambda(\mathsf{a}, \mathsf{b}) \to (\mathsf{a} \cdot \mathsf{b}, \, \mathsf{scale} \, \mathsf{b} \, \nabla \, \mathsf{scale} \, \mathsf{a}))$ 

# Generalizing Automatic Differentiation

```
newtype D_k a b = D (a \rightarrow b \times (a 'k' b))
```

linearD :: 
$$(a \rightarrow b) \rightarrow (a 'k' b) \rightarrow D_k a b$$

linearD f f'= D (
$$\lambda a \rightarrow (f a, f')$$
)

**instance** Category 
$$k \Rightarrow$$
 Category  $D_k$  where type Obj  $D_k =$  Additive  $\land$  Obj  $k \dots$ 

**instance** Monoidal 
$$k \Rightarrow$$
 Monoidal  $D_k$  where ...

**instance** Cartesian 
$$k \Rightarrow$$
 Cartesian  $D_k$  where ...

**instance** Cocartesian 
$$k \Rightarrow$$
 Cocartesian  $D_k$  where

instance Scalable k s  $\Rightarrow$  NumCat  $D_k$  s where negateC = linearD negateC negateC addC = linearD addC addC mulC = D ( $\lambda$ (a, b)  $\rightarrow$  (a · b, scale b  $\nabla$  scale a))

# Exemplos

## Generalizar